Mortality among Type 2 patients at Steno Diabetes Center

SDC

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Chapter 1

Data preparation

1.1 Introduction

This report concerns the mortality among type 2 patients only at Steno Diabetes Center in the period where the computerized patients records (EPJ) are available, that is the period 1.9.2001–15.9.2010.

The records from EPJ were linked to the Central Person Register CPR and the cause of death register, so we know the date of death for those who died.

For the years 2009 ff. the cause of death is not known, owing to a backlog of death certificates, but the date of death is known up till 15th September 2010. This report is concerned only with the overall mortality rates, and thus comprises follow-up from 1.1.2002–15.9.2010.

1.2 Data preparation

We initially read the data from a SAS-file, and exported it to the file ./data/mcompl.xpt:

```
1
                                                    "Program: getit.sas"
                                                                                          10:49 Tuesday, January 29, 2013
NOTE: Copyright (c) 2002-2008 by SAS Institute Inc., Cary, NC, USA.
NOTE: SAS (r) Proprietary Software 9.2 (TS2M3)
Licensed to NOVO NORDISK - BASIC PACKAGE, Site 50800704.
NOTE: This session is executing on the W32\_VSPRO platform
NOTE: SAS initialization used:
real time 2.58 seconds
cpu time 0.37 seconds
NOTE: AUTOEXEC processing beginning; file is c:\stat\sas\autoexec.sas.
C:\Bendix\Steno\MaEJ\EPJ-dod\sas\getit.sas
{\tt NOTE:} Libref HER was successfully assigned as follows:
        Engine: V9
Physical Name: C:\Bendix\Steno\MaEJ\EPJ-dod\sas
NOTE: Libref DATA was successfully assigned as follows:
Engine: V9
        Engine:
        Physical Name: C:\Bendix\Steno\MaEJ\EPJ-dod\data
NOTE: AUTOEXEC processing completed.
1 options nofmterr;
2 libname maej "p:\MAEJ\SAS data\SDC mortality";
NOTE: Libref MAEJ was successfully assigned as follows:
Engine: V9
        Physical Name: p:\MAEJ\SAS data\SDC mortality
```

```
title1 "Base dataset - merge of EPJ, NPR and CoDR" ;
                                   proc contents data=maej.compl ;
 6
 NOTE: PROCEDURE CONTENTS used (Total process time):
                                                                                 0.07 seconds
                    real time
                                                                                 0.06 seconds
                    cpu time
 NOTE: The PROCEDURE CONTENTS printed page 1.
                                   * Identify fishy records;
                                  data oops nodm notp late compl;
set maej.compl;
if doBth gt doDM gt .z then do;
put "This was changed from: "
 9
 10
 11
12
13
                                                                                                                                             doBth= ddmmyy10.
                                                                                                                                                 doDM= ddmmyy10.;
                                                  doDM = doBth + 90;
 15
16
                                                 put "
                                                                                                                           to: " doBth= ddmmyy10.
doDM= ddmmyy10.;
                                        end;
if doBth lt "01JAN1900"d then do;
put "This was changed from: " doBth= ddmmyy10.
doDM= ddmmyy10.
  17
                                                   end :
 18
19
20
21
22
23
                                                  put
 24
25
26
                                                   end ;
                                        end;
if (nmiss(doCVD,CVD) eq 1 or
nmiss(doDR,DR) eq 1 or
nmiss(doNef,Nef) eq 1 or
nmiss(doNeu,Neu) eq 1 or
( doDth gt .z and CoDth eq "" ) or
( doDth le .z and CoDth ne "" ) or
 27
28
29
30
31
32
33
                                                         nmiss(sex,doBth,entry,exit) gt 0 or
                                        doBth gt entry or
entry gt exit ) then output oops
else if doDM le .z then output nodm
then output notp
else if entry gt "31DEC2010"d then output late
                                                                                                                                     then output oops
  35
  36
                                         else
                                                                                                                                                    output compl;
 38
This was changed from: doBTH=06/07/1970 doDM=01/01/1970 to: doBTH=06/07/1970 doDM=04/10/1970 This was changed from: doBTH=22/05/1964 doDM=01/01/1964 to: doBTH=22/05/1964 doDM=00/08/1964 This was changed from: doBTH=25/12/1977 doDM=01/01/1977 to: doBTH=25/12/1977 doDM=01/01/1977 This was changed from: doBTH=29/01/1887 doDM=01/01/1993 to: doBTH=29/01/1987 doDM=01/01/1993 NOTE: There were 11424 observations read from the data of the control of the data of the control of
 NOTE: There were 11424 observations read from the data set MAEJ.COMPL. NOTE: The data set WORK.OOPS has 2 observations and 16 variables. NOTE: The data set WORK.NODM has 542 observations and 16 variables.
 NOTE: The data set WORK.NOTP has 12 observations and 16 variables.
NOTE: The data set WORK.LATE has 137 observations and 16 variables.
NOTE: The data set WORK.COMPL has 10731 observations and 16 variables.
 NOTE: DATA statement used (Total process time):
real time 0.20 seconds
cpu time 0.04 seconds
  40
                                   title1 "oops"
                                  proc print data=oops;
var sex dmtype dobth dodm exit entry doCVD CVD doDR DR doNef Nef doNeu Neu doDth CoDth;
format dobth dodm exit entry doCVD doDR doNet doNeu doDth ddmmyy8.;
  41
 42
  43
  44
 NOTE: There were 2 observations read from the data set WORK.OOPS.
NOTE: The PROCEDURE PRINT printed page 2.

NOTE: PROCEDURE PRINT used (Total process time):
real time 0.00 seconds
cpu time 0.01 seconds
 45
                                   title1 "nodm"
 47
                                   proc print data=nodm;
var sex dmtype dobth dodm exit entry doCVD CVD doDR DR doNef Nef doNeu Neu doDth CoDth;
  48
  50
                                         format dobth dodm exit entry doCVD doDR doNef doNeu doDth ddmmyy8.;
 51
52
 53
54
                                   title1 "notp"
                                  proc print data=notp;
var sex dmtype dobth dodm exit entry doCVD CVD doDR DR doNef Nef doNeu Neu doDth CoDth;
format dobth dodm exit entry doCVD doDR doNed doDth ddmmyy8.;
 55
```

```
58
59
options validvarname=V6;
libname xptout xport '../data/compl.xpt';
NOTE: Libref XPTOUT was successfully assigned as follows:
       Engine: XPORT
Physical Name: C:\Bendix\Steno\MaEJ\EPJ-dod\data\compl.xpt
62
             proc copy in=work out=xptout memtype=data;
    select compl ;
63
64
             run:
NOTE: Copying WORK.COMPL to XPTOUT.COMPL (memtype=DATA).
NOTE: There were 10731 observations read from the data set WORK.COMPL.
NOTE: The data set XPTOUT.COMPL has 10731 observations and 16 variables.
NOTE: PROCEDURE COPY used (Total process time):
                                0.22 seconds
       real time
                                0.04 seconds
       cpu time
NOTE: SAS Institute Inc., SAS Campus Drive, Cary, NC USA 27513-2414
NOTE: The SAS System used:
                                3.45 seconds
       cpu time
                                0.60 seconds
Base dataset - merge of EPJ, NPR and CoDR
                                                                                                         10:49 Tuesday, January 29, 2013
The CONTENTS Procedure
Data Set Name
                          MAEJ.COMPL
                                                                     Observations
                                                                                                 11424
                                                                     Variables
Member Type
                          DATA
                                                                                                 16
Engine
                                                                     Indexes
                               januar 2013 mandag 20:54:14
                                                                     Observation Length
                                                                                                 128
Created
Last Modified
                          28. januar 2013 mandag 20:54:14
                                                                     Deleted Observations
                                                                                                 ŇO
Protection
                                                                     Compressed
Data Set Type
Label
Data Representation WINDOWS_32
Encoding wlatin1 Western (Windows)
                         Engine/Host Dependent Information
Data Set Page Size
Number of Data Set Pages
                                  12288
                                  121
First Data Page
Max Obs per Page
Obs in First Data Page
                                  95
                                   76
Number of Data Set Repairs
                                  0
                                  ":\MAEJ\SAS data\SDC mortality\compl.sas7bdat 9.0202M3
Filename
Release Created
Host Created
                                  W32_VSPRO
Alphabetic List of Variables and Attributes
 #
       Variable
                      Туре
                                Len
       CVD
 8
2
       CoDth
                      Char
                                  9
       {\tt DMtype}
                      Char
12
7
14
16
                      Num
       Entry
                      Num
                                  8
                                  8
8
       Nef
                      Num
                      Num
       Neu
       doBTH
                      Num
                                  8
8
8
 4
9
5
       doCVD
                      Num
       doDM
                      Num
       doDR
                      Num
1
13
       doDTH
                      Num
                                  8
                                  8
       doNef
                      Num
       doNeu
                      Num
 6
       exit
                      Num
                                  8
 3
       sex
                      Num
                                  8
                                                                                                         10:49 Tuesday, January 29, 2013
oops
Obs sex DMtype
                      doBTH
                                                                   doCVD CVD
                                                                                    doDR DR
                                                                                                  doNef Nef
                                                                                                                  doNeu Neu
                                                                                                                                  doDTH Dth
                  01/06/47 01/01/08 07/06/12 29/06/10 29/06/10 1
11/12/71 01/01/10 07/06/12 28/07/10 . 1
```

1.2.1 Reading with R

We first load the package needed to read the data:

```
> options( width=100 )
> library( foreign )
> library( Epi )
> library( splines )
> print( sessionInfo(), l=F )
R version 3.0.1 (2013-05-16)
Platform: i386-w64-mingw32/i386 (32-bit)
attached base packages:
[1] splines utils
                        datasets graphics grDevices stats
                                                               methods
                                                                          base
other attached packages:
[1] Epi_1.1.57
                  foreign_0.8-53
loaded via a namespace (and not attached):
[1] tools_3.0.1
Then we read the data from the SAS export file, and restrict to T2 patients:
> epj <- read.xport( "./data/compl.xpt" )</pre>
> ( names(epj) <- tolower( names(epj) ) )</pre>
             "dmtype" "sex"
                                "dobth" "dodm"
                                                           "entry" "codth" "docvd" "cvd"
 [1] "dodth"
                                                  "exit"
[11] "dodr"
                      "donef" "nef"
                                         "doneu" "neu"
              "dr"
> table( epj[,2], exclude=NULL )
      T2 <NA>
  Т1
4855 5876
> epj <- subset( epj, dmtype=="T2", select=-2 )</pre>
> str( epj )
'data.frame':
                     5876 obs. of 15 variables:
 $ dodth: num 15651 NA 17860 NA NA ...
 $ sex : num 2 2 1 1 1 2 2 1 1 2 ...
 $ dobth: num -15340 -13149 -12053 -11322 -10957 ...
 $ dodm : num 6210 11323 10958 11323 9862 ...
 $ codth: Factor w/ 10 levels "", "accidents", ...: 8 1 10 1 1 1 1 5 1 1 ...
 $ docvd: num 12329 14879 14199 17405 13482 ...
 $ cvd : num 1 1 1 1 1 NA 1 1 1 NA ...
 $ dodr : num 12329 NA 14199 NA 17157 ...
 $ dr : num 1 NA 1 NA 1 1 NA 1 NA NA ...
$ donef: num 12329 12329 15498 18852 12329
 $ nef : num 1 1 1 1 1 NA NA 1 1 NA .
 $ doneu: num 12329 12329 14199 NA 12329 ...
 $ neu : num 1 1 1 NA 1 NA 1 1 1 1 ...
```

Then we define sex as a factor and transform a format of fractional years. Since date of diagnosis is only given as a year we pick the date of diagnosis randomly in the year, but so that it is not after entry and at least a month before death:

```
> epj$sex <- factor( epj$sex, labels=c("M","F") )</pre>
> dnum <- c( grep( "entry", names(epj) ),</pre>
              grep( "exit", names(epj) ),
grep( "do", names(epj) )
> names( epj )[dnum]
[1] "entry" "exit" "dodth" "dobth" "dodm" "docvd" "dodr" "doneg" "doneg"
> for( i in dnum ) epj[,i] <- epj[,i]/365.25 + 1960</pre>
> set.seed( 783459876 )
> epj$dodm <- pmin( epj$dodm + runif( nrow(epj) ),</pre>
                     epj$entry,
                     epj$dodth-1/12,
                     na.rm=TRUE )
> options(digits=6)
> head( epj )
                                               codth
                                                        docvd cvd
                                                                       dodr dr
                                                                                 donef nef
    dodth sex dobth
                        dodm
                                 exit
                                        entry
                                                                                              doneu neu
                1918 1977.54 2002.85 2001.24 kidney 1993.75
1 2002.85
            F
                                                                1 1993.75 1 1993.75
                                                                                         1 1993.75
       NA
            F
                1924 1991.33 2012.43 2001.24
                                                      2000.74
                                                                 1
                                                                         NA NA 1993.75
                                                                                          1 1993.75
3 2008.90
            М
                1927 1990.18 2008.90 2001.24
                                                other 1998.87
                                                                 1 1998.87
                                                                            1 2002.43
                                                                                          1 1998.87
                                                                                                      1
4
       NA
            M
                1929 1991.92 2012.43 2002.08
                                                      2007.65
                                                                 1
                                                                         NA NA 2011.61
                                                                                          1
                                                                                                      NA
5
                1930 1987.76 2012.43 2001.24
                                                                 1 2006.97 1 1993.75
       NA
            М
                                                      1996.91
                                                                                          1
                                                                                            1993.75
                                                                                                      1
6
       NA
                1930 1988.78 2012.43 2004.96
                                                            NA
                                                                NA 2004.96 1
                                                                                    NA
                                                                                        NA
                                                                                                 NA
                                                                                                      NA
```

> options(digits=8)

Once we read data, we can get a quick overview of the dataset check that entry and death dates are in the correct relation to each other:

```
> with(epj, ftable(addmargins(table(sex,
                                                Death=floor(dodth),
                                                Entry=floor(entry)
+
                                                useNA="ifany" ) ) ) )
+
            Entry 2001 2002 2003 2004 2005 2006 2007 2008 2009 2010
                                                                                Sum
sex Death
    2001
                     18
                            0
                                   0
                                         0
                                               0
                                                     0
                                                           0
                                                                 0
                                                                       0
                                                                             0
                                                                                  18
    2002
                     71
                                                                                  72
                            1
                                         0
                                               0
                                                     0
                                                                       0
    2003
                     72
                            7
                                  8
                                        0
                                               0
                                                     0
                                                           0
                                                                 0
                                                                       0
                                                                             0
                                                                                  87
    2004
                     78
                            4
                                  7
                                        0
                                               0
                                                     0
                                                          0
                                                                 0
                                                                       0
                                                                             0
                                                                                  89
     2005
                     70
                           12
                                         3
                                               3
                                                     0
                                                           0
                                                                                  95
                                  7
                     59
                                         7
                                                                             0
    2006
                           11
                                               8
                                                     1
                                                          0
                                                                 0
                                                                       0
                                                                                  93
    2007
                     42
                            9
                                   6
                                        3
                                               8
                                                     5
                                                           3
                                                                 0
                                                                       0
                                                                             0
                                                                                  76
                                  7
    2008
                     54
                           10
                                         4
                                               5
                                                     3
                                                           6
                                                                 3
                                                                       0
                                                                                  92
    2009
                     65
                                  8
                                        5
                                               3
                                                    5
                                                          4
                                                                 7
                                                                             0
                                                                                 102
                            4
                                                                       1
                     59
                            7
                                   4
                                         6
                                               2
                                                     7
                                                           8
                                                                 2
    2010
                                                                       0
                                                                             1
                    939
                          157
                                177
                                      240
                                                  167
                                                              165
                                                                    203
    NA
                                            189
                                                        182
                                                                          202 2621
    Sum
                   1527
                          222
                                231
                                      268
                                            218
                                                  188
                                                        203
                                                              177
                                                                     204
                                                                          203 3441
    2001
                     14
                            0
                                  0
                                        0
                                               0
                                                     0
                                                          0
                                                                 0
                                                                       0
                                                                                  14
                                                                 0
    2002
                     46
                            4
                                  0
                                        0
                                               0
                                                     0
                                                          0
                                                                       0
                                                                             0
                                                                                  50
    2003
                     38
                            2
                                  2
                                        0
                                               0
                                                     0
                                                          0
                                                                 0
                                                                       0
                                                                             0
                                                                                  42
     2004
                     55
                            1
                                  8
                                        1
                                               0
                                                     0
                                                          0
                                                                 0
                                                                       0
                                                                             0
                                                                                  65
    2005
                     45
                            6
                                  3
                                        4
                                                     0
                                                          0
                                                                 0
                                                                       0
                                                                             0
                                                                                  59
                                               1
                     49
                                   9
                                        9
                                                                                  78
    2006
                            6
                                                     1
                                                           0
                                                                       0
                                   3
                                        7
                     44
                                                          0
                                                                 0
                                                                             0
    2007
                            1
                                               1
                                                     1
                                                                       0
                                                                                  57
                                  2
    2008
                     46
                            2
                                        6
                                               4
                                                     0
                                                           5
                                                                 1
                                                                       0
                                                                             0
                                                                                  66
     2009
                     32
                                   1
                                        8
                                               6
                                                     2
                                                           2
                                                                 4
                                                                       3
                                                                             0
                                                                                  65
                            2
                                                                                 57
                     35
                                  3
                                        3
                                                     4
                                                                 0
                                                                       3
    2010
                                               6
                                                           1
                                                                             0
                    717
                          113
                                131
                                      130
                                            142
                                                  136
                                                        136
                                                              127
                                                                    129
                                                                          121 1882
    NA
```

To see how the follow-up is working we just check how dates of diagnosis resp. complications and date of death are distributed, and also how date of birth and date of diagnosis look, as well as how date of diagnosis and date of exit look:

From figure 1.1 it is clear that the exit date for both all cause mortality analysis and for the cause-specific analyses should be 2010-12-31; the maximal date of death in the data frame is 2010-12-31 So we just check if all persons enter and exits correctly:

```
> all.exit <- cal.yr( "2011-01-01" )</pre>
  with(epj, ftable(addmargins(
               table( sex,
                       deathOK = dodth < all.exit,</pre>
                       entryOK = entry < all.exit,</pre>
                       useNA="ifany" ), margin=1:2 ),
                       col.vars=c(1,3))
                    М
                          F
                             Sum
        sex
        entryOK TRUE TRUE TRUE
deathOK
TRUE
                  820 553 1373
NΑ
                 2621 1882 4503
                 3441 2435 5876
```

From the two bottom panels of figure 1.1 we discover an anomaly in the dates of nephropathy:

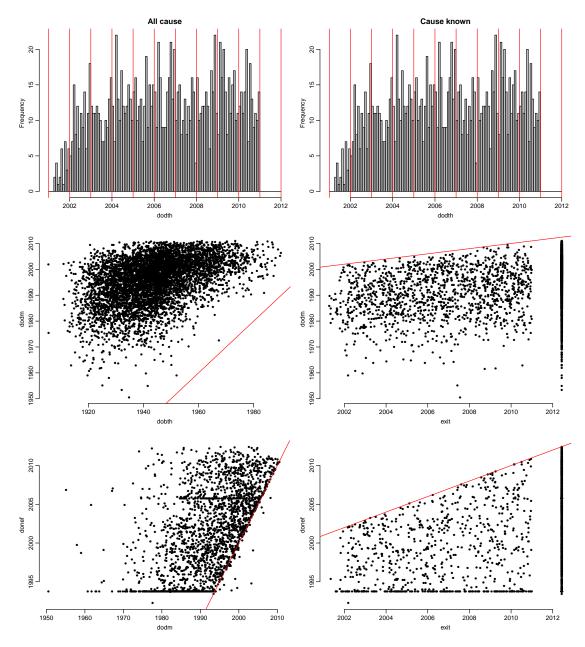


Figure 1.1: Histogram of dates of death for all known deaths and for deaths where a cause is known. The bottom 4 panels have plots of the date of diagnosis resp. complications versus date of birth and date of exit, with a red line indicating the identity (so all points should preferably be on the same side of this).

Lung

84

34

other

288

```
Dead
            FALSE TRUE <NA>
DN
                               Sum
  1993.755
              114
                    157
                            0
                               271
  1994.001
                            0
  2001.999
                            0
                                 8
                      1
  2005.747
                                52
               48
  2005.749
                7
                            0
                      1
                                 8
  <NA>
             3073
                    632
                            0 3705
  Sum
             4503 1373
                            0
                              5876
```

Thus it seems that some sort of update of the patients' nephropathy status has taken place in the fall of 1993 and 2005, and maybe even that the update has been restricted to patients alive at some later state. This means that the nephropathy status presumably is recorded with different precision over the period, such that those with dates recorded at these two dates are patients that are included with DN because of some status, and hence may have their dates of DN recorded earlier in the course of the complications history than the other patients with DN. This would only have the effect that DN is recorded with uncertainly. In future studies it would be prudent to define nephropathy status directly from the clinical recordings.

1.2.2 Causes of death

Finally we define CoD (Cause of Death) as a factor with 4 causes of death and "Alive" for those not yet dead, and make a check that it all went well:

```
> with( epj, table(codth) )
codth
           accidents
                      acute DM
                                   Cancer
                                                 CVD
                                                             GI Infection
                                                                               kidney
     4503
                  17
                             11
                                      288
                                                 493
> # Capitalize the causes of death
> levels( epi$codth )[-1] <-</pre>
+ sapply( strsplit(levels(epj$codth),""),
          function(x) { x[1] <- toupper(x[1]) ; paste(x,collapse="") } )[-1]</pre>
> epj\$codth \leftarrow Relevel(epj\$codth, c(1,5,4,3,8,9,6,7,2))
> epj$CoD <- Relevel( epj$codth, list("Alive"=1,2,3,"Other"=4:10) )
> with(epj, table(codth, CoD))
            CoD
                    CVD Cancer Other
codth
             Alive
              4503
                      0
                              0
  CVD
                 0
                    493
                              0
                                    0
                 0
                      0
                            288
                                    0
  Cancer
  Acute DM
                 0
                      0
                              0
                                    11
                 0
                              0
                                   34
  Kidnev
                      0
                 0
                      0
                              0
                                   84
  Lung
  GI
                 0
                      0
                              0
                                   67
                 0
                              0
  Infection
                      0
                                   91
                              0
  Accidents
                 0
                      0
                                   17
  Other
                 0
                      0
                              0
                                  288
> with(epj, ftable(addmargins(table(sex,
                                           doDTH=floor(dodth), CoD,
                                           useNA="ifany"),
                                   margin=2:3), row.vars=2 ) )
```

	sex	M					F				
	CoD	Alive	CVD	Cancer	Other	Sum	Alive	CVD	Cancer	Other	Sum
doDTH											
2001		0	11	3	4	18	0	9	0	5	14
2002		0	23	11	38	72	0	25	7	18	50
2003		0	41	17	29	87	0	16	12	14	42
2004		0	31	18	40	89	0	22	14	29	65
2005		0	39	25	31	95	0	27	8	24	59
2006		0	32	17	44	93	0	33	15	30	78
2007		0	20	21	35	76	0	14	11	32	57
2008		0	32	19	41	92	0	24	12	30	66
2009		0	32	24	46	102	0	21	16	28	65
2010		0	26	22	48	96	0	15	16	26	57
NA		2621	0	0	0	2621	1882	0	0	0	1882
Sum		2621	287	177	356	3441	1882	206	111	236	2435

1.3 Lexis object for analysis of overall mortality rates

In order to analyze all cause mortality of diabetes patients in SDC we set up a Lexis object which holds the follow-up time on the timescales age, diabetes duration and calendar time. Hence we also exclude those without a date of diabetes diagnosis (and those who have a date of entry before date of diabetes):

```
> L1 <- Lexis( entry = list( age = entry-dobth,
                          Ddur = entry-dodm,
                           per = entry ),
               exit = list( per = pmin(exit,all.exit,na.rm=TRUE) ),
        exit.status = factor(!is.na(dodth), labels=c("Alive", "Dead") ),
NOTE: entry.status has been set to "Alive" for all.
> summary.Lexis( L1, by="sex" )
$M
Transitions:
From Alive Dead Records: Events: Risk time: Persons:
 Alive 2621 820
                     3441
                               820 20144.39
                                                  3441
$F
Transitions:
From Alive Dead Records: Events: Risk time: Persons:
                  2435
 Alive 1882 553
                            553 14597.89
```

1.3.1 Raw mortality by calendar year

We now check how the empirical mortality rates rates look by calendar year after this grooming. To this end we split the follow-up in 3-month intervals by calendar time:

```
> S1 <- splitLexis( L1, time.scale="per", breaks=1995+seq(0,20,1/4) ) > summary( S1 )
```

```
To
From Alive Dead Records: Events: Risk time: Persons:
Alive 142246 1373 143619 1373 34742.28 5876
```

A quick tabulation reveals that early mortality rates are really low; tabulation by 3-month period of follow-up gives:

```
> DY <- xtabs( cbind(D=lex.Xst!="Alive",
                      Y=lex.dur,
                   rate=lex.dur)
                \sim I(floor(per*4)/4) + sex,
               data=S1 )
> DY[,,"rate"] <- DY[,,"D"]/DY[,,"Y"]*100</pre>
> round( ftable( DY, row.vars=1 ), 1 )
                     sex
                             M
                             D
                                   Y rate
                                                D
                                                      Y
                                                         rate
I(floor(per * 4)/4)
2001
                           0.0 12.4
                                       0.0
                                              0.0
                                                    9.1
                                                           0.0
2001.25
                           3.0 330.5
                                       0.9
                                              4.0 239.9
                                                          1.7
                                       1.4
2001.5
                           5.0 347.1
                                              4.0 254.6
                                                          1.6
2001.75
                          10.0 367.6
                                       2.7
                                              6.0 267.7
                                                           2.2
                                            10.0 280.9
2002
                          17.0 383.6
                                       4.4
                                                           3.6
2002.25
                          15.0 394.7
                                       3.8 11.0 288.1
                                                           3.8
2002.5
                          22.0 400.4
                                       5.5 12.0 293.3
                                                           4.1
2002.75
                          18.0 410.3
                                       4.4
                                            17.0 298.1
                                                          5.7
2003
                          17.0 420.2
                                       4.0
                                             17.0 303.0
                                                           5.6
2003.25
                          25.0 430.4
                                       5.8
                                             8.0 312.2
                                                           2.6
2003.5
                          19.0 437.5
                                       4.3
                                             5.0 318.8
                                                           1.6
2003.75
                          26.0 447.5
                                       5.8 12.0 327.1
                                                           3.7
2004
                          27.0 457.3
                                       5.9 14.0 334.7
                                                           4.2
2004.25
                          28.0 468.5
                                       6.0
                                            12.0 343.1
                                                          3.5
                                            21.0 347.6
2004.5
                          14.0 477.5
                                       2.9
                                                           6.0
2004.75
                          20.0 489.7
                                       4.1 18.0 353.4
                                                           5.1
2005
                          23.0 501.0
                                       4.6 17.0 358.2
                                                           4.7
2005.25
                          23.0 508.7
                                             9.0 366.1
                                       4.5
                                                           2.5
2005.5
                          24.0 515.2
                                       4.7
                                            16.0 371.3
                                                           4.3
2005.75
                          25.0 522.7
                                       4.8
                                            17.0 379.5
                                                           4.5
                          25.0 531.4
                                       4.7
                                            19.0 385.5
2006
                                                           4.9
2006.25
                          21.0 537.1
                                       3.9 13.0 391.0
                                                           3.3
2006.5
                          19.0 542.9
                                       3.5 20.0 394.6
                                                          5.1
                                       5.1 26.0 398.3
                          28.0 548.0
                                                          6.5
2006.75
2007
                          26.0 553.6
                                       4.7
                                             13.0 402.1
                                                           3.2
2007.25
                                       2.3 18.0 407.8
                          13.0 562.2
                                                           4.4
2007.5
                          19.0 569.3
                                       3.3 11.0 410.7
                                                           2.7
2007.75
                          19.0 577.8
                                       3.3 15.0 416.1
                                                           3.6
2008
                          21.0 585.5
                                       3.6 16.0 423.5
                                                          3.8
                          21.0 590.4
                                             17.0 425.5
2008.25
                                       3.6
                                                           4.0
2008.5
                          18.0 593.9
                                        3.0
                                             17.0 429.1
                                                           4.0
2008.75
                          31.0 599.7
                                            16.0 435.5
                                       5.2
                                                           3.7
2009
                          27.0 606.8
                                       4.4
                                            18.0 438.6
                                                           4.1
                                       4.7
2009.25
                          29.0 613.8
                                             13.0 442.3
                                                          2.9
2009.5
                          22.0 618.0
                                       3.6
                                             20.0 449.1
                                                           4.5
2009.75
                          24.0 625.0
                                       3.8
                                            14.0 453.6
                                                           3.1
                          23.0 633.1
                                       3.6 14.0 456.4
                                                           3.1
2010
2010.25
                          29.0 639.3
                                       4.5 12.0 460.2
                                                          2.6
2010.5
                          23.0 644.4
                                       3.6 17.0 464.0
                                                          3.7
2010.75
                          21.0 649.4
                                       3.2 14.0 467.6
> matplot( as.numeric(dimnames(DY)[[1]]), log="y", las=1,
           xlab="Date", ylab="Raw mortality (% / year)",
DY[,,"rate"], type="l", lty=1, lwd=3, col=c("blue","red"))
> abline( v=seq(1998,2015,1/4), col=gray(0.9) )
> abline( v=seq(1998,2015,1) , col=gray(0.8) )
> box()
```

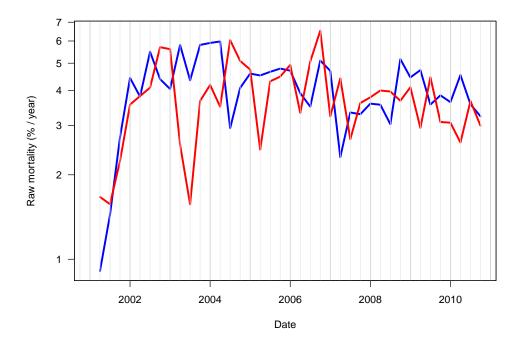


Figure 1.2: Raw mortality rates for T2 patients by 3-month periods; there is something missing prior to 2002.

A quick look at the tables or figure 1.2 shows that data seem incomplete prior to 2002, so to make sure that data are valid, we define entry to be at the start of 2002, and redefine the Lexis object:

```
> epj$entry <- pmax( epj$entry, 2002 )</pre>
> L1 <- Lexis( entry = list( age = entry-dobth,
                            Ddur = entry-dodm,
                             per = entry ),
                exit = list( per = pmin(exit,all.exit,na.rm=TRUE) ),
         exit.status = factor( !is.na(dodth), labels=c("Alive", "Dead") )
                data = subset( epj, entry < pmin(exit,all.exit,na.rm=TRUE ) ) )</pre>
NOTE: entry.status has been set to "Alive" for all.
> summary( L1, by="sex" )
$M
Transitions:
     To
      Alive Dead
                    Records:
                              Events: Risk time:
                                  802
  Alive 2621 802
                        3423
                                         19086.81
Transitions:
       Alive Dead
                   Records:
                              Events: Risk time:
  Alive 1882 539
                        2421
                                  539
                                         13826.64
> summary.data.frame( L1 )
                                                         lex.dur
                                                                           lex.Cst
                                                                                         lex.Xst
      age
                       Ddur
                                         per
       :14.290
                                           :2002.0
                        : 0.0000
                                                                          Alive:5844
 Min.
                  Min.
                                    Min.
                                                      Min.
                                                            :0.0068446
                                                                                        Alive:4503
 1st Qu.:52.389
                  1st Qu.: 2.3210
                                    1st Qu.:2002.0
                                                      1st Qu.:2.9226557
                                                                          Dead :
                                                                                        Dead :1341
 Median :61.073
                  Median: 6.9664
                                    Median :2002.8
                                                      Median :6.0479124
 Mean :60.392
                  Mean : 8.6015
                                    Mean :2004.4
                                                      Mean :5.6320081
 3rd Qu.:69.454
                  3rd Qu.:12.8486
                                    3rd Qu.:2006.5
                                                      3rd Qu.:8.9993155
 Max.
        :96.523
                  Max.
                         :51.4427
                                    Max.
                                            :2011.0
                                                      Max.
                                                             :8.9993155
     lex.id
                      dodth
                                    sex
                                                 dobth
                                                                   dodm
                                                                                     exit
                                   M:3423
                                             Min. :1905.6
 Min. : 1.0
                        :2002.0
                                                              Min. :1950.6
                                                                                     :2002.0
                  Min.
                                                                               Min.
 1st Qu.:1461.8
                  1st Qu.:2004.5
                                             1st Qu.:1934.4
                                                              1st Qu.:1990.5
                                   F:2421
                                                                                1st Qu.:2012.4
 Median :2922.5
                  Median :2006.7
                                             Median :1943.6
                                                              Median :1997.3
                                                                               Median :2012.4
 Mean :2922.5
                  Mean
                        :2006.7
                                             Mean
                                                  :1944.0
                                                              Mean
                                                                     :1995.8
                                                                               Mean
                                                                                       :2011.1
 3rd Qu.:4383.2
                  3rd Qu.:2008.9
                                             3rd Qu.:1952.3
                                                              3rd Qu.:2002.3
                                                                                3rd Qu.:2012.4
 Max.
       :5844.0
                  Max.
                         :2011.0
                                             Max.
                                                    :1989.9
                                                              Max.
                                                                     :2011.0
                                                                               Max.
                                                                                       :2012.4
                  NA's
                         :4503
                        codth
                                        docvd
     entry
                                                                         dodr
       :2002.0
                                   Min.
                                          :1988.6
                                                     Min.
                                                                    Min.
                                                                          :1991.5
 Min.
                           :4503
                                                                                      Min.
                                                          :1
                                                                                             :1
                  CVD
                                                     1st Qu.:1
 1st Qu.:2002.0
                           : 473
                                    1st Qu.:1996.8
                                                                    1st Qu.:1996.6
                                                                                      1st Qu.:1
                             286
 Median :2002.8
                  Other
                                    Median :2001.3
                                                     Median:1
                                                                    Median :2001.9
                                                                                      Median:1
                                         :2001.3
      :2004.4
                           : 285
                                   Mean
                                                          :1
                                                                    Mean
                                                                          :2001.5
                                                                                           :1
 Mean
                  Cancer
                                                     Mean
                                                                                      Mean
 3rd Qu.:2006.5
                  Infection: 89
                                    3rd Qu.:2005.1
                                                     3rd Qu.:1
                                                                    3rd Qu.:2005.7
                                                                                      3rd Qu.:1
                           : 82
 Max.
       :2011.0
                  Lung
                                   Max.
                                          :2012.4
                                                     Max.
                                                            :1
                                                                    Max.
                                                                           :2012.4
                                                                                      Max.
                                                                                             :1
                           : 126
                                   NA's
                                           :1045
                                                     NA's
                                                            :1045
                                                                    NA's
                                                                            :2879
                                                                                      NA's
                                                                                             :2879
                  (Other)
                                                                      CoD
     donef
                                     doneu
 Min. :1992.2
                                                                  Alive :4503
                                 Min.
                                       :1991.5
                                                   Min. :1
                  Min. :1
 1st Qu.:1997.2
                  1st Qu.:1
                                  1st Qu.:1996.4
                                                   1st Qu.:1
                                                                  CVD : 473
                                                                  Cancer: 285
 Median :2001.9
                  Median:1
                                 Median :2001.1
                                                   Median:1
 Mean
       :2001.8
                  Mean
                        :1
                                 Mean
                                         :2000.8
                                                   Mean
                                                         :1
                                                                  Other: 583
 3rd Qu.:2005.9
                  3rd Qu.:1
                                  3rd Qu.:2004.6
                                                   3rd Qu.:1
       :2012.4
                                         :2012.4
 Max.
                  Max.
                         : 1
                                 Max.
                                                   Max.
                                                          : 1
 NA's
                  NA's
                         :3686
                                 NA's
                                         :2950
                                                   NA's
                                                          :2950
        :3686
```

```
> save( L1, file="./data/T2L1.Rda" )
```

We can now make an overview of the age and DM-duration distribution at the entry of the study:

```
> par( mfcol=c(2,2), mar=c(2,2,1,1), mgp=c(3,1,0)/1.6, las=1, oma=c(0,0,2,0) )
> y1 <- c(0,190)
> with( subset( L1, sex=="M" ),
        hist(age, breaks=0:101, col="blue", border="blue",
              main="", ylim=yl, xlab="", ylab="" ) )
 with( subset(L1, sex=="F")
       hist(age, breaks=0:100, col="red", border="red",
             main="", ylim=yl, xlab="", ylab=""))
+ with( subset( L1, sex=="M" ),
       hist( Ddur, breaks=0:101, col="blue", border="blue",
             main="", ylim=yl, xlab="", ylab=""))
> text( 1.5, yl[2], zz$counts[1], font=2, adj=c(-0.1,0), col="blue" )
> zz <-
+ with( subset(L1, sex=="F"),
        hist( Ddur, breaks=0:100, col="red", border="red",
             main="", ylim=yl, xlab="", ylab="" ) )
> text( 1.5, yl[2], zz$counts[1], font=2, adj=c(-0.1,0), col="red" )
> mtext( c("Age at entry", "DM duration at entry"), side=3, line=0,
         at=c(1,3)/4, outer=TRUE)
```

1.4 Lexis object for analysis of cause-specific mortality

This is completely parallel to the set-up above, except that we use the factor CoD as the exit variable.

```
> with( epj, table( floor(exit), CoD ) )
      CoD
              CVD Cancer Other
       Alive
  2001
               20
                       3
  2002
           0
               48
                       18
                             56
  2003
           0
               57
                      29
                             43
  2004
           0
               53
                      32
  2005
           0
               66
                      33
  2006
           0
               65
                      32
                             74
  2007
           0
               34
                      32
                             67
  2008
           0
               56
                      31
                             71
                            74
  2009
          0 53
                      40
  2010
          0 41
                      38
                             74
  2012 4503
> with( epj, table( deathOK = dodth < all.exit,</pre>
                     entryOK = entry < all.exit, useNA="ifany" ) )</pre>
       entryOK
deathOK TRUĚ
   TRUE 1373
   <NA> 4503
```

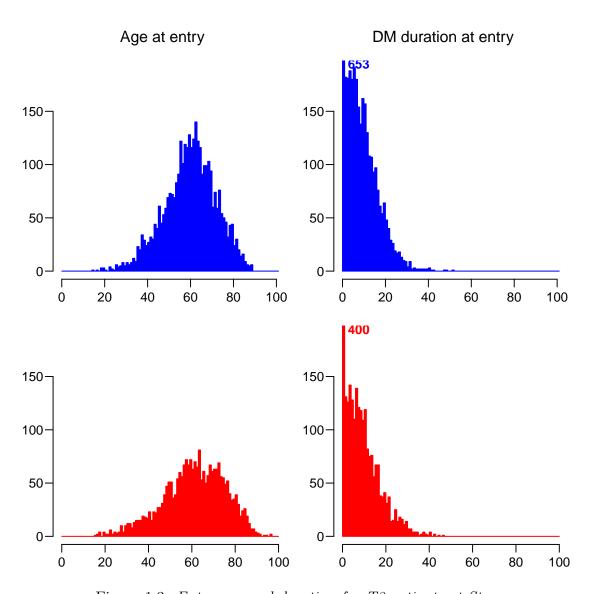


Figure 1.3: Entry age and duration for T2 patients at Steno.

```
> C1 <- Lexis( entry = list( age = entry-dobth,
                          Ddur = entry-dodm,
+
                           per = entry ),
               exit = list( per = pmin(exit,all.exit,na.rm=TRUE) ),
        exit.status = CoD,
               data = subset( epj, entry < pmin(exit,all.exit,na.rm=TRUE) ) )</pre>
NOTE: entry.status has been set to "Alive" for all.
> nrow( C1 )
[1] 5844
> summary( C1 )
Transitions:
From Alive CVD Cancer Other Records: Events: Risk time: Persons:
 Alive 4503 473 285 583
                                 5844
                                        1341 32913.46
                                                              5844
> with( C1, ftable( addmargins( table( codth, sex, CoD ),
                              margin=c(1,3)),
                   col.vars=2:3 ) )
         CoD Alive CVD Cancer Other Sum Alive CVD Cancer Other Sum
codth
              2621
                     0
                            0
                                  0 2621 1882
                                                0
                                                        0
                                                             0 1882
CVD
                0
                   276
                            0
                                  0 276
                                            0
                                               197
                                                        0
                                                              0 197
Cancer
                 0
                     0
                          174
                                  0
                                     174
                                            0
                                                0
                                                      111
                                                             0
                                                                111
Acute DM
                0
                     0
                            0
                                 5
                                      5
                                            0
                                                0
                                                       0
                                                             6
                                 21
                                     21
                                            0 0
                                                             13
Kidney
                0
                   0
                            0
                                                       0
                                                                13
Lung
                0
                   0
                           0
                                 50
                                    50
                                           0 0
                                                      0
                                                            32
                                                                32
                0
                     0
                                 45
                                     45
                                           0 0
                                                            21
GI
                            0
                                                       0
                                                                21
Infection
                 0
                     0
                                 52
                                     52
                                                            37
                                                                 37
                     0
                                 7
                                     7
                                            0
                                                            8
                                                                8
Accidents
                 0
                            0
                                                 0
                                                       0
                                172 172
Other
                 0
                     0
                            0
                                            0
                                                 0
                                                       0
                                                            114 114
Sum
              2621 276
                          174
                                352 3423
                                         1882 197
                                                      111
                                                            231 2421
```

> save(C1, file="./data/T2CoD.Rda")

Deaths

802.0

23.4 539.0

22.3

1.5 Base tables

Once we have groomed the L1 dataset we can start by making the baseline table (table 1): The state of DN is defined as presence of complications 180 days after entry:

```
> tab1 <- NArray(</pre>
                  list( sex = levels(L1$sex),
                                       c("N","Age","Age-IQR",
"DM dur","DMdur-IQR"
                                          "FU time", "FUtime-IQR",
                                          "Nephropathy",
                                          "Neuropathy"
                                          "Retinopathy"
                                          "CVD".
                                          "Deaths")
                                       c("N","%/sd") ) )
   str( tab1 )
  logi [1:2, 1:12, 1:2] NA NA NA NA NA NA ...
   - attr(*, "dimnames")=List of 3
    ..$ sex: chr [1:2] "M" "F"
               : chr [1:12] "N" "Age" "Age-IQR" "DM dur" ...
                : chr [1:2] "N" "%/sd"
> tab1[,"N","N"] <- with( L1, table(sex) )
> tab1["M", "N", "%/sd"] <- tab1["M", "N", "N"]/(tab1["M", "N", "N"]+tab1["F", "N", "N"])*100
> tab1["F", "N", "%/sd"] <- tab1["F", "N", "N"]/(tab1["M", "N", "N"]+tab1["F", "N", "N"])*100
> tab1[,"Age","N"]
                                     <- with( L1, tapply(entry+0.5-dobth,sex,median) )
> tab1[,"Age","%/sd"] <- with( L1, tapply(entry+0.5-dobth,sex,sd) )</pre>
> tab1[, "Age-IQR",1] <- with( L1, tapply(entry+0.5-dobth,sex,quantile,probs=1/4) )
> tab1[, "Age-IQR",2] <- with( L1, tapply(entry+0.5-dobth,sex,quantile,probs=3/4) )
> tab1[, "DM dur", "N"] <- with( L1, tapply(entry+0.5-dodm,sex,median) )
> tab1[, "DM dur", "%/sd1] <- with( L1, tapply(entry+0.5-dodm,sex,sd) )</pre>
> tab1[,"DM dur","%/sd"] <- with( L1, tapply(entry+0.5-dodm,sex,sd) )
> tab1[,"DMdur-IQR",1] <- with( L1, tapply(entry+0.5-dodm,sex,quantile,probs=1/4) )
> tab1[,"DMdur-IQR",2] <- with( L1, tapply(entry+0.5-dodm,sex,quantile,probs=3/4) )
> tab1[,"FU time","N"] <- with( L1, tapply(lex.dur,sex,median) )
> tab1[,"FUtime-IQR","N"] <- with( L1, tapply(lex.dur,sex,quantile,probs=1/4) )
> tab1[,"FUtime-IQR","%/sd"] <- with( L1, tapply(lex.dur,sex,quantile,probs=3/4) )
> tab1[,"FUtime-IQR","%/sd"] <- with( L1, tapply(lex.dur,sex,quantile,probs=3/4) )</pre>
                                          > tab1[,"Nephropathy","N"] <- with( L1, table((entry+0.5)>donef,sex )["TRUE",] )
> tab1[,"Neuropathy","N"] <- with( L1, table((entry+0.5)>doneu,sex )["TRUE",] )
> tab1[,"Retinopathy","N"] <- with( L1, table((entry+0.5)>dodr ,sex )["TRUE",] )
> tab1[,"CVD"
                                    ,"N"] <- with( L1, table((entry+0.5)>docvd,sex )["TRUE",]
> tab1[,"Deaths" ,"N"] <- with( L1, table(lex.Xst=="Dead" ,sex )["TRUE",] )
> tab1[,8:12,"%/sd"] <- tab1[,8:12,"N"] / tab1[,"N",rep(1,5)] * 100
> round( ftable(tab1,col.vars=c(1,3)), 1 )
                                                            F
                                    M
                     sex
                                                            N
                                                                    %/sd
                                    N
                                           %/sd
                            3423.0
                                           58.6 2421.0
                                                                    41.4
                               61.0
                                            12.0
                                                       62.5
                                                                    14.1
Age-IQR
                               52.9
                                           68.6
                                                       52.8
                                                                    72.1
DM dur
                                 7.3
                                             7.4
                                                         7.8
                                                                     7.9
DMdur-IQR
                                 2.6
                                            13.1
                                                         3.1
                                                                    13.6
FU time
                                                                     3.0
                                 6.0
                                             3.0
                                                         6.1
FUtime-IQR
                                 2.8
                                             9.0
                                                         3.1
                                                                     9.0
                            1173.0
                                           34.3 566.0
Nephropathy
                                                                    23.4
Neuropathy
                            1613.0
                                           47.1
                                                      963.0
                                                                    39.8
Retinopathy
                            1426.0
                                           41.7
                                                      983.0
                                                                    40.6
                                                                    67.3
CVD
                            2423.0
                                           70.8 1630.0
```

Data preparation 1.5 Base tables 17

> round(ftable(tab1,col.vars=c(1,3)), 0)

	sex	M		F	
		N	%/sd	N	%/sd
N		3423	59	2421	41
Age		61	12	62	14
Age-IQR		53	69	53	72
DM dur		7	7	8	8
DMdur-IQR		3	13	3	14
FU time		6	3	6	3
FUtime-IQR		3	9	3	9
Nephropathy		1173	34	566	23
Neuropathy		1613	47	963	40
Retinopathy		1426	42	983	41
CVD		2423	71	1630	67
Deaths		802	23	539	22

Chapter 2

Mortality by cause of death

```
> load( file="./data/T2CoD.Rda" )
```

In order to model the mortality rates properly, we split the follow-up in smaller intervals (in this case along the calendar time scale):

```
> S1 <- splitLexis( C1, time.scale="per", breaks=seq(1980,2015,1/4) )
> summary( S1 )

Transitions:
    To
From    Alive CVD Cancer Other Records: Events: Risk time: Persons:
    Alive 132598 473 285 583 133939 1341 32913.46 5844
```

First we illustrate the number of deaths by each cause and by type of diabetes:

Moreover, we show how the distribution of age and diabetes duration is over the follow-up in a Lexis diagram. We compute the height and width of the graph in order to get proper Lexis diagrams:

```
> x1 \leftarrow c(0,60)
> y1 <- c(0,100)
> ypi <- 16
> c( diff(xl)/ypi,
     diff(yl)/ypi )+1
[1] 4.75 7.25
> par( mai=c(3,3,1,1)/4, mgp=c(3,1,0)/1.6, las=1 )
        ( S1, time.scale=2:1,
           col=gray(0.6), grid=seq(5,100,5), lty.grid=1, col.grid=gray(0.9),
           xlim=c(0,60), ylim=c(0,100), xaxs="i", yaxs="i", xlab="Diabetes duration", ylab="Age")
> points( S1, pch=16, cex=0.5,
           col=c("transparent",rainbow(3))[S1$lex.Xst] )
> rect( 48,0,60,17, col="white", border="lightgray" )
> text( rep(58,5), 1:4*3.5, c(levels(S1$lex.Xst)[2:4], "C.o.D."),
        col=c(rainbow(3), "gray"), adj=1, cex=0.9, font=2 )
> box()
```

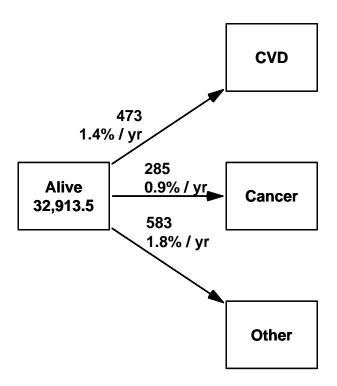


Figure 2.1: Person-years, deaths and mortality rates by cause of death in the SDC T2 patient population.

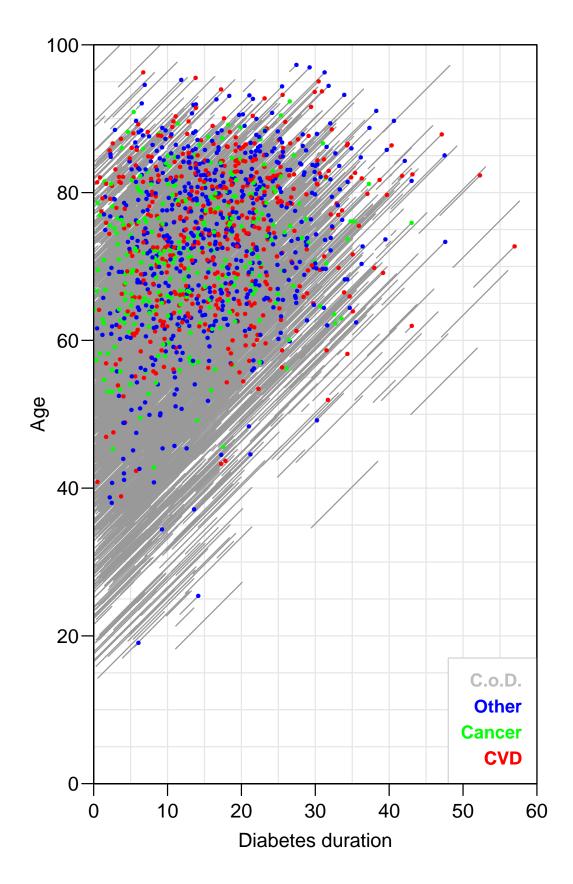


Figure 2.2: Distribution of follow-up and deaths (by cause) for T2. Although not visible directly, no person in this plot has a life-line (total follow-up) of more than 7 years, since the earliest entry is 1.1.2002, and the latest exit is 31.12.2008.

2.1 Statistical analysis

2.1.1 Setup

We first set up the modeling parameters for the age, period and duration effects:

```
> n.pr <- 100
> ( a.kn <- with( subset(S1,lex.Xst!="Alive"),</pre>
                   quantile(age+lex.dur,probs=c(1,3,5,7,9)/10)))
                 30%
                           50%
                                      70%
      10%
59.641342 67.638604 74.168378 79.989049 85.806982
> a.pr <- seq(40,95,,n.pr)
> a.ct <- Ns(a.pr, knots=a.kn)
> pref <- 2010
> ( p.kn <- with( subset(S1,lex.Xst!="Alive"),</pre>
                   quantile(per+lex.dur,probs=c(1,5,9)/10) ) )
                 50%
2003.0883 2006.7187 2010.1300
> p.pr <- seq(2002,2011,,n.pr)
> p.ct <- Ns( p.pr , knots=p.kn )
> p.rf <- Ns( rep(pref,n.pr), knots=p.kn )
> dref <- 10
> ( d.kn <- with( subset(S1,lex.Xst!="Alive"),</pre>
                    c(0,quantile(Ddur+lex.dur,probs=1:2/3,na.rm=TRUE)) ) )
           33.33333% 66.666667%
  0.000000 11.363240 19.399553
> d.pr <- seq(0,40,,n.pr)
> d.ct <- Ns(
                              , knots=d.kn )
                 d.pr
> d.rf <- Ns( rep(dref,n.pr), knots=d.kn )</pre>
```

Finally we can model the cause-specific mortality rates as a function of age and calendar time, and plot the rates and the RRs. But we first set up an array to hold the predicted rates and RRs:

```
> res <- NArray( list( pred = c("Ainc", "PRR"),</pre>
                          cod = levels(C1$lex.Xst)[-1],
                          sex = levels(S1\$sex),
                            x = 1:n.pr,
                         what = c("Est", "lo", "hi") )
 lin <- NArray( c(dimnames(res)[2:3],</pre>
                    list( what=c("P(lin)", "RR/year", "lo", "hi", "P(null)") )) )
> str( res )
 logi [1:2, 1:3, 1:2, 1:100, 1:3] NA NA NA NA NA NA NA ...
  attr(*, "dimnames")=List of 5
..$ pred: chr [1:2] "Ainc" "PRR"
  ..$ cod : chr [1:3] "CVD" "Cancer" "Other"
  ..$ sex : chr [1:2] "M" "F"
  ..$ x : chr [1:100] "1" "2" "3" "4" ...
  ..$ what: chr [1:3] "Est" "lo" "hi"
> str( lin )
 logi [1:3, 1:2, 1:5] NA NA NA NA NA NA ...
 - attr(*, "dimnames")=List of 3
  ..$ cod : chr [1:3] "CVD" "Cancer" "Other"
  ..$ sex : chr [1:2] "M" "F"
  ..$ what: chr [1:5] "P(lin)" "RR/year" "lo" "hi" ...
```

2.2Age and date of follow-up

Then we fit models for all combinations of sex and diabetes type:

```
> system.time(
+ for( sx in dimnames(res)[["sex"]] )
+ for( cd in dimnames(res)[["cod"]] )
+ map <- glm( (lex.Xst == cd) ~ Ns( per, knots=p.kn )
                               + Ns(age, knots=a.kn),
               offset = log(lex.dur/100),
               family = poisson,
                 data = subset( S1, sex==sx) )
+ mal <- update( map, . ~ . - Ns( per, knots=p.kn ) + per )
+ lin[cd,sx,] \leftarrow c(anova(map, mal, test="Chisq")[2,"Pr(>Chi)"],
                    ci.lin( mal, subset="per", Exp=TRUE)[,c(5:7,4)])
+ res["Ainc",cd,sx,,] <- ci.exp( map, ctr.mat=cbind(1,p.rf,a.ct) )
 res["PRR",cd,sx,,] <- ci.exp(map, subset="per", ctr.mat=p.ct-p.rf)
+ } )
   user
        system elapsed
                  35.61
  31.45
           2.81
> round( ftable( lin ), 3 )
           what P(lin) RR/year
                                        hi P(null)
                                  10
cod
       sex
CVD
       M
                 0.541
                         0.902 0.861 0.944
                                              0.000
       F
                 0.356
                         0.910 0.861 0.961
                                             0.001
                 0.621
                         0.981 0.926 1.040
                                              0.526
Cancer M
       F
                 0.743
                         1.006 0.935 1.083
                                              0.863
Other
      Μ
                 0.325
                         0.959 0.920 0.999
                                              0.045
                 0.058
                         0.990 0.941 1.041
                                              0.692
> round( ftable( (lin[,,2:4]-1)*100 ), 1 )
           what RR/year
                           10
                                 hi
cod
       sex
CVD
       Μ
                   -9.8 -13.9
                               -5.6
                   -9.0 -13.9
                               -3.9
       F
Cancer M
                   -1.9 -7.4
                               4.0
       F
                   0.6 - 6.5
                               8.3
                   -4.1 -8.0
      Μ
Other
                               -0.1
                         -5.9
```

We see that there are no signs of non-linear decrease in mortality rates for any of the causes. Also we see that the decrease in mortality is significant for CVD, some 9-10%/year, not detectable for cancer, and for other causes only a borderline significant decrease of some 4%/year, but only for men. Thus it seems that the major change in mortality rates among the T2D patients is for CVD mortality.

We can now plot the age-effects:

```
> mlim <- c(1,1000)/30
> rlim <- c(1/3,3)
> par( mfcol=c(2,3), mar=c(3,0,1,0), mgp=c(3,1,0)/1.6, oma=c(0,5,2,1), las=1) > for( cd in dimnames(res)[["cod"]] )
+ if( cd==dimnames(res)[["cod"]][1] ) axis(side=2)
  abline(v=seq(0,100,5), h=outer(1:9,10^{-2:1}), col=gray(0.8))
+ for( sx in 1:2)
+ matlines( a.pr, res["Ainc",cd,sx,,],
             lwd=c(3,1,1), lty=1, col=c("blue", "red")[sx] )
+ mtext( cd, line=0.5, side=3, outer=FALSE )
 if( cd==dimnames(res)[["cod"]][1] )
      axis( side=2 )
      mtext( "Mortality at 1 Jan 2008 (%/year)", line=3, side=2,
               outer=FALSE, las=0 )
+ matplot( p.pr, p.pr, type="n", log="y", ylim=rlim, las=1,
+ xlab="Date of follow-up", ylab="", yaxt="n")

+ abline( v=2000+0:11, h=c(1:15/10,1:15,1:15*10), col=gray(0.8) )
+ for( sx in 1:2 )
+ matlines( p.pr, res["PRR",cd,sx,,],
             lwd=c(3,1,1), lty=1, col=c("blue", "red")[sx] )
+ abline( h=1 )
+ points( pref ,1, pch=16, col="limegreen" )
+ points( pref ,1, pch=1, lwd=2 )
+ if( cd==dimnames(res)[["cod"]][1] )
      axis( side=2 )
      mtext( "Mortality RR", line=3, side=2, outer=FALSE, las=0 )
```

It is pretty clear from figure 2.3 that the decrease in mortality is mainly for CVD mortality; actually data are compatible with models for each of the cause-specific mortalities with a constant annual change in mortality from each of the causes, but only for CVD this annual change is significantly different from 0.

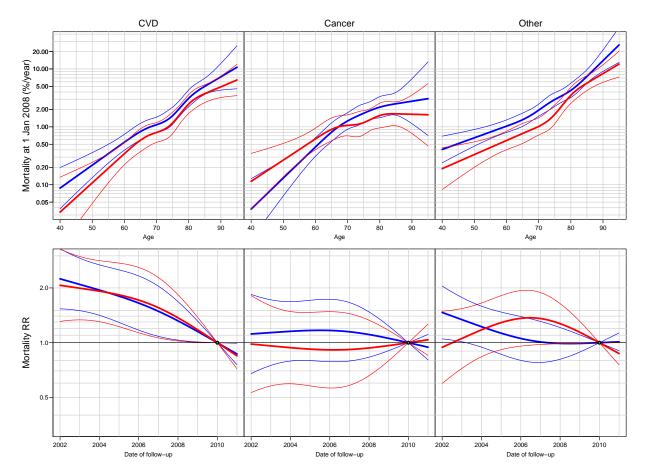


Figure 2.3: Age-specific mortality and the change of this over calendar time for T2 diabetes patients. Red: F; blue: M, thin lines: 95% c.i.

2.3 Including diabetes duration

It would be prudent to control for diabetes duration too. This is simply done by replicating the code above, starting with the array to collect effects, and the array to collect the p-values for linear effects and the estimates of those:

```
> dnam <- dimnames( res )</pre>
> dnam[["pred"]] <- c(dnam[["pred"]],"DRR")</pre>
> resx <- NArray( dnam )
> str( resx )
 logi [1:3, 1:3, 1:2, 1:100, 1:3] NA NA NA NA NA NA NA ...
 - attr(*, "dimnames")=List of 5
  ..$ pred: chr [1:3] "Ainc" "PRR" "DRR"
..$ cod : chr [1:3] "CVD" "Cancer" "Other"
..$ sex : chr [1:2] "M" "F"
  ..$ x : chr [1:100] "1" "2" "3" "4" ...
  ..$ what: chr [1:3] "Est" "lo" "hi"
> linx <- NArray( c(dimnames(resx)[2:3],</pre>
                        list( eff=c("PRR","DRR","DoDM"),
                               what=c("P(lin)", "RR/year", "lo", "hi") )) )
> str( linx )
 logi [1:3, 1:2, 1:3, 1:4] NA NA NA NA NA NA NA ... - attr(*, "dimnames")=List of 4
  ..$ cod : chr [1:3] "CVD" "Cancer" "Other"
  ..$ sex : chr [1:2] "M" "F"
  ..$ eff : chr [1:3] "PRR" "DRR" "DoDM"
  ..$ what: chr [1:4] "P(lin)" "RR/year" "lo" "hi"
```

We also want to extract the linear effect of age at diagnosis, so we set up a separate array to hold these values. Then we fit models for all combinations of sex and cause of death:

```
> system.time(
+ for( cd in dimnames(resx)[["cod"]] )
+ for( sx in dimnames(resx)[["sex"]] )
+ mapD <- glm( (lex.Xst == cd) ~ Ns( per, knots=p.kn ) + I(age-Ddur)
                                          + Ns(age, knots=a.kn)
                                          + Ns( Ddur, knots=d.kn ),
                    offset = log(lex.dur/100),
                    family = poisson,
  data = subset( S1, sex==sx ) )
+ mapd <- update( mapD, . ~ . - I(age-Ddur) )
+ mapl <- update( mapd, . ~ . - Ns( per, knots=p.kn ) + per )
+ madl <- update( mapd, . ~ . - Ns( Ddur, knots=d.kn ) + Ddur )
+ linx[cd,sx,,] \leftarrow cbind(anova(mapl, mapd, madl, test="Chisq")[c(2:3,1),"Pr(>Chi)"], + rbind(ci.exp(mapl, subset="per"),
                                                 ci.exp( madl, subset="Ddur" )
                                                 ci.exp( mapD, subset="I\\(" ) ) )
+ resx["Ainc",cd,sx,,] <- ci.exp( mapd, ctr.mat=cbind(1,p.rf,a.ct,d.rf) )
+ resx["PRR" ,cd,sx,,] <- ci.exp( mapd, subset="per", ctr.mat=p.ct-p.rf )
+ resx["DRR" ,cd,sx,,] <- ci.exp( mapd, subset="dur", ctr.mat=d.ct-d.rf )
   user system elapsed
  63.88
            1.42 67.33
```

We can now inspect the tests for linearity of period and duration effects as well as the estimates of the slope of the linear effects under the null:

```
> round( ftable( linx, col.vars=c(2,4) ), 3 )
```

```
F
                      М
            what P(lin) RR/year
                                          hi P(lin) RR/year
                                    10
cod
       eff
CVD
       PRR
                  0.466
                           0.897 0.857 0.940
                                              0.303
                                                       0.904 0.856 0.955
                           1.033 1.019 1.047
                                                       1.027 1.012 1.042
       DRR
                  0.498
                                              0.989
                           0.964 0.945 0.983
                                                       0.974 0.951 0.997
       DoDM
                     NA
                                                 NA
                  0.642
                           0.983 0.927 1.042
                                              0.695
Cancer PRR
                                                       1.014 0.942 1.092
       DRR
                  0.364
                          0.996 0.977 1.015
                                              0.272
                                                       0.981 0.958 1.004
       DoDM
                     NA
                           1.009 0.989 1.030
                                                       1.026 1.001 1.052
                                                  NA
                  0.411
                           0.952 0.914 0.992
                                              0.048
                                                       0.985 0.936 1.036
Other
       PRR.
                                                       1.011 0.997 1.025
                           1.037 1.025 1.049
       DR.R.
                  0.052
                                              0.247
       DoDM
                     NΑ
                           0.952 0.935 0.970
                                                 NΑ
                                                       0.980 0.960 1.002
```

We can translate these RRs to annual changes in mortality from different causes in units of percentage per year:

```
> round( ftable( (linx[,,,2:4]-1)*100, col.vars=3:4 ), 1 )
```

```
eff
                    PRR
                                         DRR
                                                             DoDM
           what RR/year
                                  hi RR/year
                                                10
                                                       hi RR/year
                                                                           hi
cod
       sex
                   -10.3 -14.3 -6.0
CVD
       M
                                               1.9
                                                             -3.6 -5.5
       F
                   -9.6 -14.4
                                -4.5
                                         2.7
                                               1.2
                                                      4.2
                                                             -2.6
                                                                   -4.9
                                                                         -0.3
                         -7.3
                                4.2
                                        -0.4
                                              -2.3
                                                      1.5
                                                              0.9
                                                                   -1.1
Cancer M
                    -1.7
                                                                          3.0
       F
                    1.4 -5.8
                                 9.2
                                        -1.9
                                              -4.2
                                                      0.4
                                                              2.6
                                                                    0.1
                                                                           5.2
                   -4.8 -8.6
                                         3.7
                                               2.5
Other
       M
                                -0.8
                                                      4.9
                                                             -4.8
                                                                   -6.5
                                                                          -3.0
                         -6.4
                   -1.5
                                                      2.5
                                                             -2.0
                                                                   -4.0
                                 3.6
                                         1.1
                                              -0.3
                                                                           0.2
```

Again it appears that there is not much evidence against (log-)linear effects of calendar time and duration, and that the major effect is for CVD +3%/year by duration, -10%/year by calendar time. There is no effect for Cancer, and for Other causes there seems to be a small effect by duration, in the vicinity of 4%/year, but only for men.

```
> mlim <- c(1,1000)/30
> rlim <- c(1/5,5)
> par( mfcol=c(3,3), mar=c(3,0,1,0), mgp=c(3,1,0)/1.6, oma=c(0,5,2,1), las=1 )
> for( cd in dimnames(resx)[["cod"]] )
+ matplot( a.pr, a.pr, type="n", log="y", ylim=mlim, yaxt="n",

+ xlab="Age", ylab="", las=1 )

+ abline( v=seq(0,100,5), h=outer(1:9,10^(-2:2)), col=gray(0.8) )
+ for( sx in 1:2)
+ matlines( a.pr, resx["Ainc",cd,sx,,],
              lwd=c(3,1,1), lty=1, col=c("blue", "red")[sx] )
+ mtext( cd, line=0.5, side=3, outer=FALSE )
  if( cd==dimnames(resx)[["cod"]][1] )
       {
       axis( side=2 )
       mtext( "Mortality at 1 Jan 2010 (%/year)",
               line=3, side=2, outer=FALSE, las=0 )
       7
+ matplot( p.pr, p.pr, type="n", log="y", ylim=rlim, las=1, yaxt="n",
             xlab="Date of follow-up", ylab="" )
+ abline( v=2000+1:15, h=outer(1:9,10^(-2:2)), col=gray(0.8) )
+ for( sx in 1:2 )
```

```
+ matlines( p.pr, resx["PRR",cd,sx,,],
                lwd=c(3,1,1), lty=1, col=c("blue","red")[sx] )
+ abline( h=1 )
+ points( pref,1, pch=16, col="limegreen" )
+ points( dref ,1, pch=1, lws=2 )
+ if( cd==dimnames(resx)[["cod"]][1] )
        axis( side=2 )
        mtext( "Mortality RR", line=3, side=2, outer=FALSE, las=0 )
        7
+ matplot( d.pr, d.pr, type="n", log="y", ylim=rlim, las=1, yaxt="n",
+ xlab="Duration of diabetes", ylab="")
+ abline(v=seq(0,100,5), h=outer(1:9,10^(-2:2)), col=gray(0.8))
+ for( sx in 1:2 )
+ matlines( d.pr, resx["DRR",cd,sx,,],
                lwd=c(3,1,1), lty=1, col=c("blue","red")[sx] )
+ abline( h=1 )
+ points( dref ,1, pch=16, col="limegreen" )
+ points( dref ,1, pch=1, lws=2 )
+ if( cd==dimnames(resx)[["cod"]][1] )
        axis( side=2 )
        mtext( "Mortality RR", line=3, side=2, outer=FALSE, las=0 )
    }
```

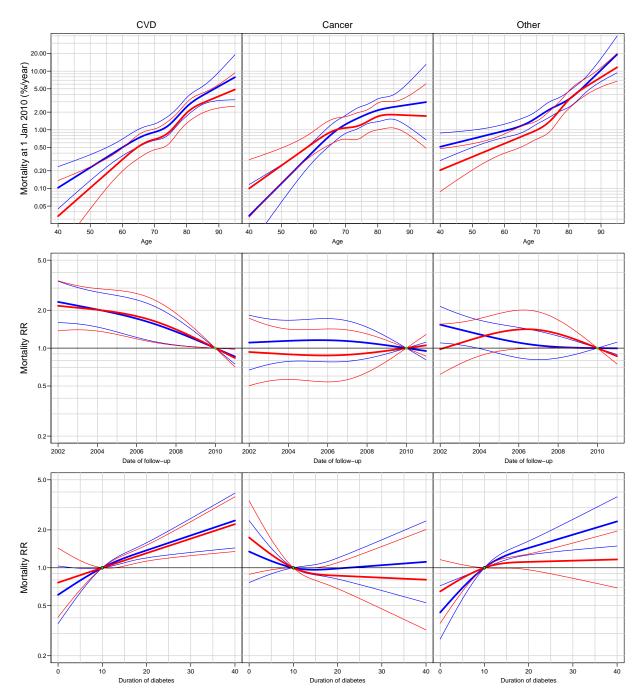


Figure 2.4: Age-specific mortality and the change of this over calendar time for T2 patients. Red: F; blue: M, thin lines: 95% c.i.

Chapter 3

All-cause mortality by complication status

We start by making a tabular overview of how patients go through the study, that is how manu have nephropathy at entry, and exit, subdivided by exit status and sex:

```
> load( file="./data/T2L1.Rda" )
> load( file="./data/T2CoD.Rda" )
> with(C1, ftable(addmargins(table(sex,
                                     eDN=!(donef>entry | is.na(donef)),
                                     lex.Xst,
                                     xD=!is.na(donef) ),
                              margin = c(1,4)),
                   col.vars=4:3 ) )
         xD
                FALSE
                                        TRUE
                                                                Sum
         lex.Xst Alive CVD Cancer Other Alive CVD Cancer Other Alive CVD Cancer Other
sex eDN
   FALSE
                 1658
                       112
                               81
                                   131
                                         244
                                              25
                                                      15
                                                           34
                                                               1902
                                                                    137
                                         719 139
   TRUE
                       0
                               0
                                    0
                                                     78
                                                          187
                                                               719
                                                                    139
                                                                                 187
                 1415
                        94
                               78
                                                     2
   FALSE
                                   117
                                         134 16
                                                           29
                                                               1549 110
                                                                            80
                                                                                 146
                                                          85
                                             87
                  0
                        0
                              0
                                    0
                                         333
                                                     31
                                                               333
                                                                            31
                                                                                 85
   TRUE
                                                                     87
Sum FALSE
                 3073 206
                              159
                                   248
                                         378
                                               41
                                                     17
                                                           63
                                                               3451
                                                                     247
                                                                                 311
                                     0 1052
                                                                           109
                               0
                                              226
                                                    109
                                                          272 1052
                                                                     226
                                                                                 272
   TRUE
```

3.1 Setup

We can now introduce the time-dependent nephropathy status ("DN"):

```
DN
            0 930 164
                            93
                                  221
                                            1408
                                                      478
                                                                75.28
                                                                            1408
         1691 1215 276
                                  352
                                           3708
  Sum
                           174
                                                     1087
                                                               190.87
                                                                            3423
$F
Transitions:
        Alive DN CVD Cancer Other
                                      Records:
From
                                                 Events: Risk time:
                                                                      Persons:
         1431 165 94
                           78
                                 117
                                           1885
                                                     454
                                                              101.40
                                                                           1885
  Alive
                                           701
                                                     250
            0 451 103
                           33
                                                              36.87
                                                                           701
  DN
                                 114
  S11m
         1431 616 197
                          111
                                 231
                                           2586
                                                     704
                                                              138.27
                                                                           2421
> timeScales( C2 )
            "Ddur" "per"
[1] "age"
                              "DNdur"
```

We now have a Lexis object with follow-up along 4 time-scales, age and calendar time as well as duration of diabetes and duration of DN.

We do a few small calculations to enable plotting of the Lexis diagrams properly:

```
> ypi <- 14
> 11 <- 50
> al <- c(0,100)
> dl <- c(0,60)
```

We can then set up the plot correctly in a pdf-file:

```
> pdf( "./graph/T2mort-Lexis-dur.pdf", height=diff(al)/ypi+1, width=diff(dl)/ypi+1)
> par(mai=c(3,3,1,1)/4, mgp=c(3,1,0)/1.5, las=1, oma=c(0,0,0,0))
> clr <- c(gray(c(0.8,0.5)), "Black")
> idt1 <- C1$lex.id
 nt1 <- length( idt1 )</pre>
> sbt1 <- sample( idt1, floor(nt1/1) )</pre>
> plsb <- subset( C2, lex.id %in% sbt1 )
> plot.Lexis( C2, time.scale=2:1, grid=1:20*5, lty.grid=1,
              col=clr[plsb$lex.Cst], lwd=2,
              xlim=dl, ylim=al, xaxs="i", yaxs="i",
              ylab="Age", xlab="Duration of diabetes")
 points( C2, pch=16, cex=0.5,
          col=c(rep("transparent",2),rainbow(3))[C2$lex.Xst] )
 rect( 50,0,60,20, col="white", border="lightgray" )
  text( rep(58,5), 1:4*3.5, c(levels(C2$lex.Xst)[3:5], "C.o.D."),
        col=c(rainbow(3), gray(0.4)), adj=1, cex=0.9, font=2)
> box()
> dev.off()
```

null device

We will also want to see the number of transitions between states:

```
type
              old
1
  lex.Cst
           Alive Alive
  lex.Cst
              DN
                    DN
   lex.Cst
              CVD
  lex.Cst Cancer
  lex.Cst Other
  lex.Xst
           Alive Alive
   lex.Xst
              DN
                    DN
              CVD
                  Dead
   lex.Xst
  lex.Xst Cancer
                  Dead
10 lex.Xst Other
                  Dead
```

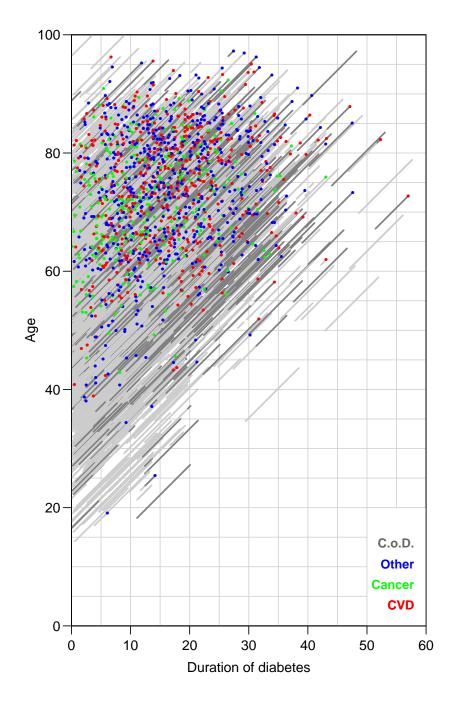


Figure 3.1: Follow-up for T2 patients at Steno. Follow-up after onset of DN is shown in dark gray color, deaths shown as dots.

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From the boxes in figure 3.2 we see that cancer mortality rates are not affected by the occurrence of DN, whereas rates of death from CVD and other causes are, but CVD death somewhat more.

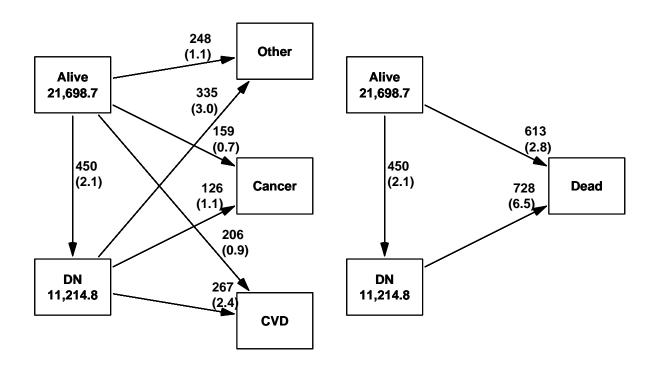


Figure 3.2: Rates of DN and mortality rates. Number in the boxes are person-years, numbers on arrow are no. transitions (rates per 100 PY).

3.2 Duration of complications

Now recall that the time scale <code>DNdur</code> (duration of complications) is not meaningful for persons with a recorded complication date earlier than 1994.02, except as indication of presence of complications by this date. So the complications duration variable must be set to <code>NA</code> for persons for whom the date of complication onset is unknown or non-existent. But we must also construct an indicator for having complications as of 1994 (although formally this could be constructed on the fly as <code>is.na(DNdur) & lex.Cst=="DN")</code>

```
> tt <- with( C1, table(round(donef,4)) )</pre>
> table( tt )
                                           265
                                       52
1167
      254
                                             1
> mdat <- as.numeric( names( tt[tt>50] ) )
> class( mdat ) <- "cal.yr"</pre>
> as.Date( mdat )
[1] "1993-10-04" "2005-09-30"
> C2 <- transform( C2, DNdur = ifelse( donef < 1994.02, NA, DNdur ),
                       comp94 = factor( pmax(donef<1994.02,0,na.rm=TRUE),</pre>
                                         labels=c("None","Prev") ) )
> with( C2, table( lex.Cst, comp94, exclude=NULL ) )
        comp94
lex.Cst None Prev <NA>
  Alive
         4185
                0
  DN
         1811
               298
                       0
  CVD
            0
            0
                 0
                       0
  Cancer
  Other
            0
                 0
                       0
  <NA>
            0
                  0
                       0
> tt <- with( C2, addmargins( table(donef,comp94,exclude=NULL) ) )
> print.table( tt[c(1:5,nrow(tt)-4:0),],zero.print=".")
                   comp94
donef
                   None Prev <NA>
                                     Sum
  1992.23545516769
                            1
                                       1
  1993.41546885695
                            1
                                       1
  1993.66461327858
  1993.75496235455
                          265
                                     265
  1993.75770020534
                            1
                                       1
  2012.34496919918
                       1
                                       1
  2012.37782340862
                      1
                                       1
  2012.41067761807
                      1
                                 . 3686
                    3686
  <NA>
  Sum
                    5996 298
                                 . 6294
```

Splitting follow-up for Poisson analysis 3.3

In order to model the mortality rates properly, we split the follow-up in smaller intervals (in this case along the calendar time scale):

```
> S2 <- splitLexis( C2, time.scale="per", breaks=seq(1980,2015,1/4) )
> summary( C2 )
Transitions:
From
                 DN CVD Cancer Other
                                       Records:
                                                  Events: Risk time:
                                                                       Persons:
  Alive
         3122
               450 206
                           159
                                  248
                                           4185
                                                     1063
                                                            21698.70
                                                                            4185
            0 1381 267
                           126
                                  335
                                           2109
                                                      728
                                                             11214.76
                                                                            2109
  Sum
         3122 1831 473
                           285
                                  583
                                           6294
                                                     1791
                                                            32913.46
                                                                            5844
> summary( S2 )
Transitions:
        Alive
                  DN CVD Cancer Other
From
                                        Records:
                                                   Events: Risk time:
                                                                        Persons:
                                                              21698.70
  Alive 87550
                 450 206
                            159
                                   248
                                           88613
                                                      1063
                                                                             4185
            0 45048 267
                             126
                                   335
                                           45776
                                                       728
                                                              11214.76
                                                                             2109
        87550 45498 473
                             285
                                   583
                                           134389
                                                      1791
                                                              32913.46
                                                                             5844
```

So we observe that the time-splitting has expanded the number of records substantially; from 6294 to 134389. To illustrate how each person contributes to the number of records, we show the records from 3 persons:

```
> options( digits=5 )
> subset( S2, lex.id %in% c(47,108,125,133), select=c(1:8,10) )
```

```
lex.id
                age
                        Ddur
                                per
                                        DNdur
                                                lex.dur lex.Cst lex.Xst sex
         47 80.060
1300
                     1.37301 2005.1
                                           NA 0.1028405
                                                           Alive
                                                                   Alive
1301
         47 80.163
                     1.47585 2005.2
                                           NA 0.2500000
                                                           Alive
         47 80.413
1302
                    1.72585 2005.5
                                           NA 0.2500000
                                                           Alive
                                                                    Alive
1303
         47 80.663
                     1.97585 2005.8
                                           NA 0.2500000
                                                           Alive
                                                                    Alive
                                                                            Μ
1304
         47 80.913
                     2.22585
                             2006.0
                                           NA 0.2500000
                                                           Alive
                                                                    Alive
         47 81.163
1305
                     2.47585 2006.2
                                           NA 0.2500000
                                                           Alive
                                                                    Alive
                                                                            M
1306
                     2.72585 2006.5
                                           NA 0.2500000
         47 81.413
                                                           Alive
                                                                    Alive
1307
         47 81.663
                     2.97585 2006.8
                                           NA 0.2500000
                                                           Alive
                                                                    Alive
                                                                            М
1308
         47 81.913
                    3.22585 2007.0
                                           NA 0.2361396
                                                                      CVD
                                                                            М
                                                           Alive
2591
        108 84.752 14.39061
                                           NA 0.2500000
                                                                            F
                             2002.0
                                                           Alive
                                                                    Alive
2592
        108 85.002 14.64061 2002.2
                                                                            F
                                           NA 0.2500000
                                                           Alive
                                                                    Alive
2593
        108 85.252 14.89061 2002.5
                                           NA 0.2500000
                                                                    Alive
                                                                            F
                                                           Alive
                                                                            F
2594
        108 85.502 15.14061 2002.8
                                           NA 0.2500000
                                                           Alive
                                                                    Alive
2595
        108 85.752 15.39061 2003.0
                                           NA 0.1813826
                                                                       DN
                                                                            F
                                                           Alive
2596
        108 85.933 15.57199
                             2003.2 0.000000 0.0686174
                                                                       DN
                                                                            F
                                                              DN
                                                                            F
2597
        108 86.002 15.64061 2003.2 0.068617 0.2500000
                                                              DN
                                                                       DN
2598
        108 86.252 15.89061 2003.5 0.318617 0.2500000
                                                              DN
                                                                       DN
                                                                            F
2599
        108 86.502 16.14061 2003.8 0.568617 0.0912047
                                                              DN
                                                                      CVD
                                                                            F
                                                                            F
2914
        125 54.672
                     0.73141 2008.9
                                           NA 0.0800821
                                                           Alive
                                                                    Alive
2915
        125 54.752
                     0.81149
                             2009.0
                                           NA 0.2500000
                                                           Alive
                                                                    Alive
                                                                            F
2916
        125 55.002
                     1.06149
                             2009.2
                                           NA 0.2500000
                                                           Alive
                                                                    Alive
                                                                            F
2917
        125 55.252
                     1.31149 2009.5
                                           NA 0.2500000
                                                           Alive
                                                                    Alive
2918
        125 55.502
                     1.56149 2009.8
                                           NA 0.2500000
                                                           Alive
                                                                    Alive
                                                                            F
2919
        125 55.752
                     1.81149 2010.0
                                           NA 0.2500000
                                                           Alive
                                                                    Alive
2920
        125 56.002
                     2.06149 2010.2
                                           NA 0.2500000
                                                           Alive
                                                                    Alive
                                                                            F
                                                                            F
2921
        125 56.252
                     2.31149 2010.5
                                           NA 0.2500000
                                                                    Alive
                                                           Alive
                                                                            F
                     2.56149 2010.8
2922
        125 56.502
                                           NA 0.2493155
                                                           Alive
                                                                    Alive
3121
        133 67.670 29.41918 2002.0 1.917864 0.2500000
                                                              DN
                                                                       DN
```

```
3122
        133 67.920 29.66918 2002.2 2.167864 0.2500000
                                                              DN
                                                                      DN
                                                                           F
                                                                           F
        133 68.170 29.91918 2002.5 2.417864 0.2500000
                                                              DN
                                                                      DN
3123
                                                                           F
3124
        133 68.420 30.16918 2002.8 2.667864 0.2500000
                                                              DN
                                                                      DN
3125
        133 68.670 30.41918 2003.0 2.917864 0.2500000
                                                              DN
                                                                      DN
                                                                           F
        133 68.920 30.66918 2003.2 3.167864 0.2500000
                                                                           F
3126
                                                                      DN
                                                              DN
                                                                           F
3127
        133 69.170 30.91918 2003.5 3.417864 0.2500000
                                                                      DN
                                                                           F
3128
        133 69.420 31.16918 2003.8 3.667864 0.2500000
                                                              DN
                                                                      DN
3129
        133 69.670 31.41918 2004.0 3.917864 0.0027379
                                                              DN
                                                                   Other
```

> options(digits=7)

3.4 Analysis of duration variables

Since the duration of DN is unknown for a substantial part of the patients with DN, we must either exclude these patients from analysis, which is not feasible, or include them in the analysis as a special group, that is with an indicator of "unknown complications duration".

But in order to include these in the model we must decide on a value for the complications duration to assign to observations from this group.

Since the parametrization is constructed so that the c.pr effect is 0 at 0, we should code DNdur to 0 for those with unknown duration of complications, as well as for those with no complications at all.

If we include only an indicator of presence of complications (lex.Cst=="DN") we simply assume that presence of complications increase the mortality by a fixed amount. If we also include the indicator Cprev for those with complications as of 1994, the parameter associated with this will be the extra mortality associated with "early" complications.

Finally, if we add the effect of complications duration DNdur, the coefficients of the complications indicator will be the RR for those with "late" complications at the date of complication onset, and the coefficient of Cprev will be the RR of those with "early" complications (pre-1994) relative to those with "late" complications at the date of complication onset.

```
> S2$DNdur <- ifelse( is.na(S2$DNdur), 0, S2$DNdur )
> summary.data.frame( S2 )
```

```
DNdur
    lex.id
                                      Ddur
                      : 14.29
Min. : 1
               Min.
                                 Min. : 0.000
                                                         :2002
                                                                  Min. : 0.0000
                                                  Min.
1st Qu.:1445
               1st Qu.: 55.27
                                 1st Qu.: 6.068
                                                  1st Qu.:2005
                                                                  1st Qu.: 0.0000
Median:2912
               Median : 63.52
                                 Median :10.890
                                                  Median:2007
                                                                  Median : 0.0000
Mean
       :2916
               Mean
                      : 62.87
                                 Mean
                                        :12.233
                                                  Mean
                                                          :2007
                                                                  Mean
                                                                         : 1.5128
3rd Qu.:4379
               3rd Qu.: 71.85
                                 3rd Qu.:16.925
                                                   3rd Qu.:2009
                                                                  3rd Qu.: 0.9227
       :5844
                      :100.93
                                        :57.397
                                                          :2011
                                                                         :16.6419
Max.
               Max.
                                 Max.
                                                  Max.
                                                                  Max.
  lex.dur
                      lex.Cst
                                      lex.Xst
                                                        dodth
                                                                     sex
                                                                                    dobth
                                                          :2002
       :0.0001711
                    Alive :88613
                                    Alive :87550
                                                   Min.
                                                                     M:78001
                                                                               Min.
                                                                                      :1906
Min.
1st Qu.:0.2500000
                    DN
                           :45776
                                    DN
                                          :45498
                                                    1st Qu.:2006
                                                                     F:56388
                                                                                1st Qu.:1935
                                                   Median:2008
Median :0.2500000
                    CVD
                                0
                                    CVD
                                             473
                                                                                Median: 1943
Mean
       :0.2449118
                    Cancer:
                                    Cancer:
                                             285
                                                   Mean
                                                           :2008
                                                                                Mean
3rd Qu.:0.2500000
                    Other:
                                    Other:
                                             583
                                                    3rd Qu.:2010
                                                                                3rd Qu.:1952
       :0.2500000
                                                   Max.
                                                           :2011
                                                                                Max.
                                                                                       :1990
Max.
                                                    NA's
                                                           :112191
     dodm
                                                    codth
                                                                      docvd
                    exit
                                   entry
                                                                                        cvd
Min. :1951
               Min. :2002
                              Min.
                                    :2002
                                                        :112191
                                                                         :1989
                                                                                   Min.
                                                                  Min.
                                                                                          :1
```

```
1st Qu.:1990
               1st Qu.:2012
                               1st Qu.:2002
                                               CVD
                                                           7615
                                                                   1st Qu.:1997
Median:1996
               Median:2012
                               Median:2002
                                              Other
                                                           5195
                                                                  Median:2001
                                                                                   Median:1
Mean
      :1995
               Mean
                     :2012
                               Mean
                                      :2003
                                              Cancer
                                                           4450
                                                                  Mean
                                                                          :2001
                                                                                   Mean
                                                                                           :1
3rd Qu.:2001
               3rd Qu.:2012
                               3rd Qu.:2004
                                                           1549
                                                                   3rd Qu.:2004
                                                                                   3rd Qu.:1
                                               Lung
                       :2012
                                                           1448
                                                                          :2012
Max.
       :2011
               Max.
                               Max.
                                      :2011
                                               Infection:
                                                                  Max.
                                                                                   Max.
                                                                                           :1
                                               (Other)
                                                           1941
                                                                  NA's
                                                                          :22563
                                                                                   NA's
                                                                                           :22563
     dodr
                       dr
                                     donef
                                                                       doneu
                                                                                         neu
     :1991
                                                  Min.
                                                                          :1991
Min.
                Min.
                                 Min. :1992
                                                                                   Min.
                       : 1
                                                        :1
                                                                  Min.
                                                                                           : 1
1st Qu.:1996
                1st Qu.:1
                                 1st Qu.:1997
                                                  1st Qu.:1
                                                                   1st Qu.:1996
                                                                                   1st Qu.:1
                Median :1
                                                  Median :1
Median:2001
                                 Median: 2001
                                                                  Median: 2001
                                                                                   Median:1
Mean
      :2001
                Mean
                      :1
                                 Mean
                                        :2001
                                                  Mean :1
                                                                  Mean
                                                                          :2000
                                                                                   Mean
                                                                                           : 1
3rd Qu.:2005
                3rd Qu.:1
                                 3rd Qu.:2006
                                                  3rd Qu.:1
                                                                   3rd Qu.:2003
                                                                                   3rd Qu.:1
       :2012
                       :1
                                        :2012
                                                                          :2012
                Max.
                                 Max.
                                                  Max.
                                                                  Max.
                                                                                   Max.
Max.
                                                         :1
                                                                                           : 1
       :60335
                NA's
                        :60335
                                 NA's
                                        :81511
                                                  NA's
                                                         :81511
                                                                  NA's
                                                                          :62368
                                                                                   NA's
                                                                                           :62368
   CoD
                 comp94
Alive :112191
                None: 126710
CVD
      : 7615
                Prev:
                       7679
Cancer:
       4450
Other: 10133
```

Note that it is important that the changing of NAs to 0s for these time-scales is done *after* time-splitting to avoid that the 0s are taken as actual time-points and subsequent intervals counted from that on the Ddur and the DNdur scale.

This is a general phenomenon for timescales that are not known for the entire follow-up of the patients:

- First we must set the date of complications to an arbitrary (early) data for those that are prevalent at entry without known date in order to make sure that the *state* (in casu "Complications") is coded correctly.
- Next the time-scale "duration of complications" must be set to NA for those where the duration is unknown (whether because they have no complications or because of the complications onset is unknown).
- Then we can split the follow-up time, and keep the coding of the duration time-scale NA for those with unknown duration.
- And finally, for analysis purposes we must code the duration variable to a non-missing value (in casu 0) in order to include it in the modeling.
- This analysis must also always include the indicator variable of having complications, and possibly also an indicator of entering the study with prevalent complications.

In the reporting we can reconstruct the ratio of the group with unknown duration relative to persons with a given duration of complication. However, when reporting this and other effects we shall further discuss the problems associated with reporting effects of several simultaneous time scales.

3.4.1 Spline setup

We set up the modeling parameters for the age, period and duration effects. For convenience in definition of contrast matrices with reference points, we will use the same number of rows in all matrices.

Note the convention that current age is denoted by a whereas age at diagnosis of DM is denoted by A, and similarly for period (p, P) and duration of diabetes (d, D) — the latter at diagnosis of complications:

```
> n.pr <- 100
> ( a.kn <- with( subset(S2,!(lex.Xst %in% c("Alive","DN"))),
                  quantile(age+lex.dur,probs=c(1,3,5,7,9)/10)))
     10%
              30%
                       50%
                                70%
59.64134 67.63860 74.16838 79.98905 85.80698
> a.pr <- seq(40,90,,n.pr)
> a.ct <- Ns( a.pr, knots=a.kn )</pre>
> ( A.kn <- with( subset(S2,!(lex.Xst %in% c("Alive","DN"))),</pre>
                   quantile(age-Ddur+lex.dur,probs=c(1,3,5,7,9)/10))
     10%
              30%
                       50%
                                70%
                                         90%
40.81414 50.92603 57.85626 63.65393 72.55930
> A.pr <- seq(5,75,,n.pr)
> A.ct <- Ns( A.pr, knots=A.kn )
> pref <- 2010
> ( p.kn <- with( subset(S2,!(lex.Xst %in% c("Alive","DN"))),</pre>
                quantile(per+lex.dur,probs=c(1,5,9)/10)))
     10%
              50%
2003.088 2006.719 2010.130
> p.pr <- seq(2002,2010,,n.pr)
> p.ct <- Ns( p.pr , knots=p.kn )
> p.rf <- Ns( rep(pref,n.pr), knots=p.kn )</pre>
> Pref <- 2010
> ( P.kn <- with( subset(S2,!(lex.Xst %in% c("Alive","DN"))),</pre>
                  quantile(per-Ddur,probs=c(1,5,9)/10)))
     10%
              50%
                       90%
1978.863 1991.327 2001.567
> P.pr <- seq(2000,2010,,n.pr)
> P.ct <- Ns( P.pr , knots=P.kn )
> P.rf <- Ns( rep(Pref,n.pr), knots=P.kn )
> dref <- 10
> ( d.kn <- with( subset(S2,!(lex.Xst %in% c("Alive","DN"))),</pre>
                  c(0,quantile(Ddur+lex.dur,probs=1:3/4,na.rm=TRUE)) ) )
                25%
                          50%
 0.000000 9.254377 15.488044 21.669897
> d.pr <- seq(0,50,,n.pr)
> d.ct <- Ns( d.pr
                            , knots=d.kn )
> d.rf <- Ns( rep(dref,n.pr), knots=d.kn )</pre>
> Dref <- 10
> ( D.kn <- with( subset(S2,!(lex.Xst %in% c("Alive","DN")) & !is.na(DNdur)),
                   c(0,quantile(Ddur-DNdur+lex.dur,probs=1:4/5,na.rm=TRUE)) ) )
```

```
20%
                            40%
                                       60%
                                                 80%
 0.000000 \quad 5.167533 \quad 10.088817 \quad 15.108586 \quad 21.239940
> D.pr <- seq(0,50,,n.pr)
> D.ct <- Ns( D.pr
                              , knots=D.kn
> D.rf <- Ns( rep(Dref,n.pr), knots=D.kn )
> cref <- 5
> ( c.kn <- with( subset(S2,lex.Cst=="DN" & lex.Xst!="DN" & comp94=="None"),</pre>
                   c(0,quantile(DNdur+lex.dur,probs=1:3/4,na.rm=TRUE)) ) )
               25%
                         50%
                                  75%
0.000000 2.922656 5.574264 8.848049
> c.pr <- seq(0,20,,n.pr)
> c.ct <- Ns(
                c.pr
                              , knots=c.kn )
> c.rf <- Ns( rep(cref,n.pr), knots=c.kn )</pre>
```

We plot the columns of the contrast matrix c.ct as functions of c.pr (figure 3.3) to ascertain that the time-scales are actually coded so that the effects are 0 at 0. This is a consequence of explicitly setting the first knot (lower boundary knot) to 0.

```
> par( mfrow=c(1,2), mar=c(3,3,1,1), mgp=c(3,1,0)/1.6 )
> matplot( d.pr, d.ct, type="1", lwd=2, lty=1, ylim=c(-1,1) )
> abline( v=d.kn )
> matplot( c.pr, c.ct, type="1", lwd=2, lty=1, ylim=c(-1,1) )
> abline( v=c.kn )
```

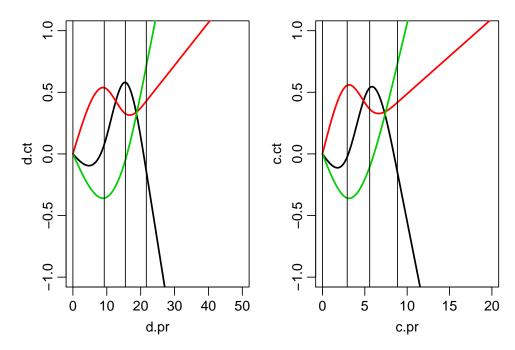


Figure 3.3: The columns of the contrast matrices for diabetes and complications durations; note that for both duration codings, the value of all columns is 0 at 0.

> data(M.dk)

nef

doneu

3.5 Including population mortality rates

We now further merge in the population mortality data in order to be able to compute SMR using the expected number of cases. Note we use the midpoint of each interval for assigning population rates. Since we only split on calendar time (per), we can only compute the midpoint of each interval on this scale, and then use date of birth to compute the age at this midpoint. Once this is done, we take the integer part in order to have variables that match with those in the population data set. Basically what we are doing is that we for each follow-up interval determine which one-year age and period class the midpoint of the interval belongs to. Note that we use timeBand to determine the interval midpoint; this function gives the midpoint of the interval as it would have been if the person were not truncated, censored or exited to another state.

```
> M.dk <- transform( M.dk, sex = factor(sex,labels=c("M","F")) )</pre>
> S2$P <- timeBand( S2, "per", "middle" )</pre>
> S2 <- transform(S2, A=floor(P-dobth), P=floor(P) )
> S2 <- merge( S2, M.dk[,c("A","P","sex","rate")] )
> S2 <- transform( S2, E=rate*lex.dur/1000 )
> subset( S2, !(E>0) )
 [1] sex
              Р
                                                                  DNdur
                      Α
                               lex.id
                                       age
                                                Ddur
                                                         per
                                                                           lex.dur lex.Cst lex.Xst dodth
[13] dobth
              dodm
                      exit
                               entry
                                        codth
                                                 docvd
                                                         cvd
                                                                  dodr
                                                                           dr
                                                                                   donef
                      comp94 rate
[25] neu
              CoD
                                        Ε
<0 rows> (or 0-length row.names)
> S2 <- subset( S2, E>0 )
> str(S2)
Classes 'Lexis' and 'data.frame':
                                            134384 obs. of 29 variables:
          : Factor w/ 2 levels "M", "F": 2 2 2 2 2 2 2 2 2 2 ...
 $ sex
           : num 2002 2002 2002 2002 2002
           : num 17 17 17 17 17 17 17 17 17 17 ...
 $ lex.id : int
                 5844 1814 3378 5844 2222 5844 1814 5844 2222 2222 ...
          : num
                  17.3 17.2 17.9 17 17.8
                  4.147 1.975 0.037 3.897 0.27 ...
 $ Ddur
           : num
                  2002 2002 2002 2002 2003 ...
 $ per
          : num
 $ DNdur : num
                 0 0 0 0 0 0 0 0 0
 $ lex.dur: num 0.25 0.25 0.25 0.25 0.25 ...
 $ lex.Cst: Factor w/ 5 levels "Alive", "DN", "CVD", ...: 1 1 1 1 1 1 1 1 1 1 1 ... $ lex.Xst: Factor w/ 5 levels "Alive", "DN", "CVD", ...: 1 1 1 1 1 1 1 1 1 1 ...
 $ dodth : num NA ...
 $ dobth : num 1985 1985 1984 1985 1985 ...
         : num 1998 2000 2002 1998 2002 ...
 $ dodm
                  2012 2012 2012 2012 2012
 $ exit
           : num
                  2002 2002 2002 2002 2002
          : num
          : Factor w/ 10 levels "", "CVD", "Cancer", ...: 1 1 1 1 1 1 1 1 1 1 ...
          : num NA NA 2002 NA NA ...
 $ cvd
          : num
                 NA NA 1 NA NA NA NA NA NA ...
 $ dodr
                  NA NA NA NA 2007
          : num
 $ dr
                  NA NA NA NA 1 NA NA NA 1 1
           : num
 $ donef : num
                  NA NA NA NA NA NA NA NA NA ...
 $ nef
           : num NA NA NA NA NA NA NA NA NA ...
 $ doneu
          : num NA NA NA NA NA NA NA NA NA ...
          : num NA NA NA NA NA NA NA NA NA ...
 $ neii
           : Factor w/ 4 levels "Alive", "CVD", ...: 1 1 1 1 1 1 1 1 1 1 ...
 $ comp94 : Factor w/ 2 levels "None", "Prev": 1 1 1 1 1 1 1 1 1 1 ...
          : num 0.252 0.252 0.252 0.252 0.252 ...
```

```
: num 6.3e-05 6.3e-05 6.3e-05 6.3e-05 ...
 - attr(*, "breaks")=List of 4
  ..$ age : NULL
  .. $ Ddur : NULL
  ..$ per : num 1980 1980 1981 1981 ...
  ..$ DNdur: NULL
 - attr(*, "time.scales")= chr "age" "Ddur" "per" "DNdur" - attr(*, "time.since")= chr "" "" "DN"
> summary( S2 )
Transitions:
     To
        Alive
                  DN CVD Cancer Other
                                         Records:
                                                    Events: Risk time:
  Alive 87546
                 450 205
                             159
                                    248
                                            88608
                                                       1062
                                                               21697.65
                                                                              4185
  DN
             0 45048 267
                             126
                                    335
                                            45776
                                                        728
                                                               11214.76
                                                                               2109
  Sum
        87546 45498 472
                             285
                                    583
                                           134384
                                                       1790
                                                               32912.41
                                                                              5844
```

This enables us to model the mortality rates and SMR as a function of age, calendar time, diabetes duration and complication status, and plot the rates and the RRs. But we first set up an array to hold the predicted rates and RRs, and we also make space in the array for analyses by cause of death.

3.6 Modeling all cause mortality rates

The basic model must include age, period, diabetes duration and complication status. This will form the basis for exploring extensions before we decide on a model to use for reporting mortality rates and SMR. The model considerations will be made for all cause mortality and SMR and the model structure chosen will be applied to all causes of death.

The general model will be as follows (here fitted for the entire dataset, ignoring sex):

```
> S3 <- Relevel( S2, list( Dead=3:5 ), first=FALSE )
```

old

type

```
lex.Cst
1
            Alive Alive
  lex.Cst
              DN
              CVD
3
  lex.Cst
4
  lex.Cst Cancer
5
   lex.Cst
            Other
6
            Alive Alive
  lex.Xst
  lex.Xst
               DN
8
  lex.Xst
              CVD
                   Dead
9
  lex.Xst Cancer
                   Dead
  lex.Xst
           Other
                   Dead
> m0 <- glm( (lex.Xst=="Dead" ) ~ Ns( age, knots=a.kn )
                                 + Ns( per, knots=p.kn )
+
                                 + Ns( Ddur, knots=d.kn )
                                 + I( age*Ddur/100 )
                                 + I(lex.Cst=="DN")
                                 + comp94,
              offset = log(lex.dur/100),
              family = poisson,
              data = S3)
> round( ci.exp( m0 ), 3 )
```

```
exp(Est.) 2.5%
                                           97.5%
                              1.740 1.285
(Intercept)
                                           2.355
Ns(age, knots = a.kn)1
                             2.339 1.773
                                           3.087
Ns(age, knots = a.kn)2
Ns(age, knots = a.kn)3
                              4.507 3.542
                                            5.734
                            11.134 8.203 15.111
Ns(age, knots = a.kn)4
                             6.057 4.619
Ns(per, knots = p.kn)1
                             0.758 0.594
                                           0.966
Ns(per, knots = p.kn)2
                             0.755 0.648
                                           0.878
Ns(Ddur, knots = d.kn)1
                              1.803 1.001
Ns(Ddur, knots = d.kn)2
                              2,400 0,658
Ns(Ddur, knots = d.kn)3
                              2.263 1.050
I(age * Ddur/100)
                              0.956 0.899
                                           1.016
I(lex.Cst == "DN")TRUE
                              1.862 1.657
                                            2.091
comp94Prev
                              1.128 0.939
```

Patients with complications already in 1994 are in this model assumed to have a different mortality from those seeing complications later. Moreover we will explore whether there are different period effects in patients with and without complications.

3.6.1 Timescale selection

First we will explore whether using current age / age at diagnosis or current data / date at diagnosis gives the better description of the mortality rates.

For more detailed duration analyses we test whether current age or age at diagnosis and whether current date or date of diagnosis gives the better description of rates when diabetes duration and complications status is included in the model.

To create an overview we set up an array classified by sex and type of test. As basis model we use the model with current age (age at follow-up, AoF), date of follow-up (PoF), and a single indicator of complication status.

We test 5 changes to the model:

- +AoD Adding age at diagnosis to the model.
- -AoF Removing age at follow-up from the model with both.
- -AoD Removing age at follow-up and age at diagnosis from the model.
- +PoD Adding date of diagnosis to the model.
- -PoF Removing date of follow-up from the model with both.
- -PoD Removing date of follow-up and date of diagnosis entirely.
- -comp94 Removing the indicator of prevalent complications from the base model.

and hence the following lay-out of the table with all the tests:

We can now fit the models for all 4 combinations of diabetes type and sex, and put the tests in the array. Note that the naming convention for the models here is that A and P refer to age and date of diagnosis of DM, whereas a, p and d refer to current age, date and diabetes duration, respectively:

```
> system.time(
+ for( rs in dimnames(ta)[["cod"]][1:2] )
+ for( sx in dimnames(ta)[["sex"]] )
+ apd <- glm( (lex.Xst=="Dead") ~ Ns( age , knots=a.kn )
                                                 + Ns( per , knots=p.kn )
                                                 + Ns( Ddur, knots=d.kn )
                                                 + I(lex.Cst=="DN")
                                                 + comp94,
                       offset = log(if(rs=="SMR") E else lex.dur/100),
                       family=poisson,
                       data = subset(S3,sex==sx) )
+ aApd <- update( apd, . ~ . + Ns( age-Ddur, knots=A.kn ) )
+ Apd <- update( aApd, . ~ . - Ns( age , knots=a.kn ) )
+ pd <- update( Apd, . ~ . - Ns( age-Ddur, knots=A.kn ) )
+ apPd <- update( apd, . ~ . + Ns( per-Ddur, knots=P.kn ) )
+ aPd <- update( apPd, . ~ . - Ns( per , knots=p.kn ) )
+ ad <- update( aPd, . ~ . - Ns( per-Ddur, knots=P.kn ) )
+ ad <- update( apd, . ~ . - comp94 )
+ tafrager 1 <- abs( as matrix( rhind(
   ta[rs,sx,,] <- abs( as.matrix( rbind(</pre>
                                   anova( apd,aApd,Apd,pd, test="Chisq" )[-1,c(4,3,5)], anova( apd,aPd,aPd,ad, test="Chisq" )[-1,c(4,3,5)],
                                                                       test="Chisq")[-1,c(4,3,5)])))
                                   anova(apd,apdc,
+
    user system elapsed
   82.94
                5.24
                         89.97
> round( ftable( ta[,,,3], row.vars=3 ), 3 )
            cod AllD
                                       SMR.
test
                  0.275 0.993 0.260 0.988
+AoD
-AoF
                  0.432 0.080 0.735 0.069
                  0.000 0.000 0.000 0.000
-AoD
                  0.213 0.847 0.201 0.805
+PoD
-PoF
                  0.919 0.115 0.973 0.081
-PoD
                  0.000 0.177 0.053 0.761
-comp94
                  0.174 0.612 0.180 0.578
```

The conclusion from these p-values is that either age at diagnosis or current age could be used. Likewise there is no possibility to choose between period of follow-up and period of diagnosis, but at least for men some period effect is needed. Finally that there is no evidence of difference between patients with complications present in 1994 and those getting complications later.

Hence the base model with the three timescales seems to provide an adequate description for both sexes, and we shall proceed with this.

3.7 Estimation and extraction of the results

When we fit a model we extract the results at the same time, which in this case will be the age-specific rates for persons diagnosed in ages 25, 30,...,75, and followed till age 90. However, even if we use current date in the model, we will make predictions ignoring this

by fixing the value for the date of follow-up to 1.1.2010, our reference point for the calendar time effect.

We should keep in mind that the predictions we make are from a model with three timescales: age, duration of diabetes and calendar time. So we should put in values for the period of follow-up that corresponds to a given date of diagnosis, otherwise we will miss out on the trend along the calendar time axis.

Thus we will extract three things from the model:

- 1. Age-specific mortality rates for persons diagnosed in various ages.
- 2. The annual change in mortality, overall and subdivided by complication status.
- 3. The RR between patients with and without complications as of 1.1.2002 and 1.1.2010.

So we fit separate models for both sexes; note that we also have an outer loop over "All cause" and "SMR" (dimnames(res)[["cod"]][1:2]).

However we first set up a data frame to use for prediction of mortality rates as a function of age for select values of age at diagnosis, in order to show how the joint effect of age at follow-up, age at diagnosis and duration of diabetes influence the mortality rates. Note that we put per equal to 2010, as a constant, thus we show the predicted mortality of patients diagnosed at a given age in 2010, under the assumption that calendar time effect remains flat at the 2010 level. This is because we want to make predictions over much longer time-spans than we actually have data for, so including increasing calendar time in the predictions would mean that we would have to accommodate predictions of calendar time effects substantially outside our data.

So we should think of the predictions as counterfactuals, that is, how rates would have been if rates were constant at the 2010 level.

As a technical aside, note that the prediction frame we construct contains rows of NAs, in order to get predictions that also have single NAs in it so that plotting of a set of separate age-curves can be done in one statement.

```
> make.frame <-
+ function( aD ) # aD is age at DM diagnosis
+ a.pr <- seq(10,90,0.5)
+ df <- data.frame( age = a.pr,
                    per = 2010,
                   \overline{D}dur = a.pr-aD,
                 lex.Cst = factor( rep(0,length(a.pr)),
                                   levels=0:2,
                                   labels=levels(S3$lex.Cst) ),
                 lex.dur = 1000,
                      E = 1,
                      aD = aD )
  rbind( NA, df[df$age>aD,] )
  ( f0 <- make.frame(40)[1:6,] )
    age per Ddur lex.Cst lex.dur E aD
                      <NA>
                                NA NA NA
    NA
          NA
              NΑ
62 40.5 2010
             0.5
                     Alive
                              1000
                                    1 40
63 41.0 2010
              1.0
                    Alive
                              1000
                                    1 40
64 41.5 2010
              1.5
                     Alive
                              1000
                                    1 40
65 42.0 2010
              2.0
                              1000
                                    1 40
                    Alive
66 42.5 2010
             2.5
                    Alive
                              1000
```

```
> new.frame <- f0[NULL,]
> for( da in seq(25,75,5) )
+ new.frame <- rbind( new.frame,
                make.frame(da) )
> str( new.frame )
'data.frame':
                891 obs. of 7 variables:
$ age : num NA 25.5 26 26.5 27 27.5 28 28.5 29 29.5 ...
        $ Ddur : num NA 0.5 1 1.5 2 2.5 3 3.5 4 4.5 .
$ lex.Cst: Factor w/ 3 levels "Alive", "DN", "Dead": NA 1 1 1 1 1 1 1 1 1 ...
: num NA 1 1 1 1 1 1 1 1 ...
        : num NA 25 25 25 25 25 25 25 25 ...
> # A prediction frame for persons with DN
> DN.frame <- transform( new.frame,
                    lex.Cst=factor( as.integer(lex.Cst)+1,
                                 levels=1:3,
                                 labels=levels(lex.Cst) ) )
```

We the set up arrays to hold the resulting mortality predictions, the resulting period effects and the tests for the effect of complications. We also fit a model ignoring the complication status altogether (termed the "Naive" model):

```
> AMort <- NArray( list( cod = c("All cause", "SMR", "CVDonly", "CVD", "Cancer"),</pre>
                         mod = c("Final", "Main", "Int", "Naive"),
state = c("Alive", "DN"),
                           sex = levels(S3\$sex),
                          pred = new.frame[,"age"]
                          what = c("Est","lo","hi") ) )
 AgeDM <- NArray( dimnames(AMort)[c(1,4,6)] )</pre>
  ComplTt <- NArray( c( dimnames(AMort)[c(1,4)],</pre>
                       list( pred = c("Linear DdurxAge interaction",
                                       "Linear CxP interaction",
                                       "Linear period effect",
                                       "No CxP interaction"
                                       "Compl 1994 ne Compl"
                                       "No Compl effect"),
                             what = c("Chisq", "df", "Pval") ) )
  ComplRR <- NArray( c(dimnames(AMort)[\bar{c}(1,4)]
                          list( pred = c("Compl 1994 vs. later",
                                            "Compl later vs. None",
                                            "Compl vs. None",
                                            "Change / year",
                                            "Compl vs. None (2002)"
                                            "Compl vs. None (2010)",
                                            "Change / year (None)"
                                 "Change / year (Compl)"),
what = c("Est","lo","hi") ) )
 p.pr \leftarrow seq(2001, 2011, 30)
 p.rf <- 2010
                                          , knots=p.kn ) -
> p.CMs <- Ns(
                     p.pr
           Ns(rep(p.rf,length(p.pr)), knots=p.kn)
> CurveRR <- NArray( c( dimnames(AMort)[1:4],</pre>
                          list( pred = p.pr,
                                 what = c("Est", "lo", "hi") ) )
```

With these structures in place we can now fit the relevant models, extract the tests and the effect parameters.

Since we want to give the RR between patients with complications and patients without both at 2010 and at 2002, we need a contrast matrix to apply to the parameters of the

model apdcll. If we name the three parameters from the terms I(lex.Cst=="DN") and I(per-2010):I(lex.Cst=="DN") as $(\gamma, \beta_0, \beta_1)$, then γ is the log-RR at 2010, but we additionally want the log-RR in 2002, which is:

$$\gamma + \beta_1(2002 - 2010) - (0 + \beta_0(2002 - 2010)) = \gamma + 8\beta_0 - 8\beta_1$$

So we construct the contrast matrix to provide this parameter too:

```
> # Contrast matrix to get the RR both at 2010 and at 2002
> (CMi \leftarrow rbind(c(1,8,-8),diag(3)))
      [,1] [,2] [,3]
[1,]
                8
                     -8
         1
[2,]
          1
                0
                     0
                   0
         0
[3,]
                1
[4,]
> system.time(
+ for( rs in dimnames(AMort)[["cod"]][1:2] )
+ for( sx in dimnames(AMort)[["sex"]] )
+ # rs <- dimnames(AMort)[["cod"]][1]
+ # sx <- dimnames(AMort)[["sex"]][1]
+ apdci <- glm( (lex.Xst=="Dead") ~ Ns( age , knots=a.kn )
                                           + Ns(per, knots=p.kn):I(lex.Cst=="DN")
                                           + Ns( Ddur, knots=d.kn )
                                           + I(age*Ddur)
                                           + I(lex.Cst=="DN"),
                     offset = log(if(rs=="SMR") E else lex.dur/100),
                     family=poisson,
                     data = subset(S3,sex==sx) )
+ apdcs <- update(apdci, . ~ . - I(age*Ddur))
+ apdcl <- update(apdcs, . ~ . - Ns(per, knots=p.kn):I(lex.Cst=="DN")
+ Ns(per, knots=p.kn)
                                        + I(per-2010):as.numeric(lex.Cst=="DN") )
  apdcll<- update( apdcs, . ~ . - Ns( per, knots=p.kn ):I(lex.Cst=="DN")
                                        + I(per-2010):I(lex.Cst=="DN") )
  apdc <- update( apdcs, . ~ . - Ns( per, knots=p.kn ):I(lex.Cst=="DN")</pre>
+ apdcp <- update( apdc , . ~ . + comp94 )
+ apd <- update( apdc , . ~ . - I(lex.Cst=="DN") )
+ apD <- update( apd , . ~ Ns( age , knots=a.kn ) + I(age-Ddur)
                                        + I(per-2010) )
                                    + Ns( per , knots=p.kn )
+ Ns( Ddur, knots=d.kn ) )
+ ComplTt[rs,sx,,] <- as.matrix( abs( anova( apdcs,
                                                         apdcl,
                                                         apdcll,
                                                         apdc,
                                                         apdcp,
                                                         apdc,
                                                         apd,
                                                         test="Chisq")[-c(1,7),c(4,3,5)]))
+ # Age-specific mortality rates
+ zf <- predict( apdc , newdata=new.frame, type="link", se.fit=TRUE )
+ zm <- predict( apdcs, newdata=new.frame, type="link", se.fit=TRUE )
+ zi <- predict( apdci, newdata=new.frame, type="link", se.fit=TRUE )
+ zn <- predict( apd , newdata=new.frame, type="link", se.fit=TRUE )
+ AMort[rs, "Final", "Alive", sx,,] <- exp( cbind(zf\fit,zf\fit,zf\fit) %*\% ci.mat() )
+ AMort[rs, "Main", "Alive", sx,,] <- exp( cbind(zm\fit,zm\fit,zm\fit) %*\% ci.mat() )
+ AMort[rs, "Int", "Alive", sx,,] <- exp( cbind(zi\fit,zi\fit,zi\fit) %*\% ci.mat() )
```

```
46
        All-cause mortality by complication status
+ AMort[rs, "Naive", "Alive", sx,,] <- exp( cbind(zn$fit,zn$se.fit) %*% ci.mat() )
+ zf <- predict( apdc , newdata=DN.frame, type="link", se.fit=TRUE )
+ zm <- predict( apdcs, newdata=DN.frame, type="link", se.fit=TRUE )
+ zi <- predict( apdci, newdata=DN.frame, type="link", se.fit=TRUE )</pre>
+ AMort[rs, "Final", "DN", sx,,] <- exp( cbind(zf$fit,zf$se.fit) %*% ci.mat() )
+ AMort[rs, "Main", "DN", sx,,] <- exp( cbind(zm$fit,zm$se.fit) %*% ci.mat() )
+ AMort[rs, "Int", "DN", sx,,] <- exp( cbind(zi$fit,zi$se.fit) %*% ci.mat() )
+ # Age at diagnosis effects
+ AgeDM[rs,sx,] <- ci.exp( apD, subset="I\\(" )
+ \# RR by calendar time
+ CurveRR[rs, "Final", "Alive", sx,,] <-
+ CurveRR[rs, "Final", "DN" ,sx,,] <- ci.exp( apdc , subset="per" , ctr.mat=cbind(p.pr-p.rf) )
+ CurveRR[rs, "Main" , "Alive", sx,,] <- ci.exp( apdcs, subset="FALSE:Ns", ctr.mat=p.CMs )
+ CurveRR[rs, "Main" , "DN" ,sx,,] <- ci.exp( apdcs, subset= "TRUE:Ns", ctr.mat=p.CMs )
+ CurveRR[rs, "Naive", "Alive", sx,,] <- ci.exp( apd , subset="per" , ctr.mat=cbind(p.pr-p.rf) )
+ # Complication effects
+ ComplRR[rs,sx,"Compl 1994 vs. later",] <- ci.exp( apdcp, subset="Prev" )
+ ComplRR[rs,sx,"Compl later vs. None",] <- ci.exp(apdcp, subset="DN") 
+ ComplRR[rs,sx,"Compl vs. None",] <- ci.exp(apdc, subset="DN")
                                                               <- ci.exp( apdc , subset="DN" )
+ ComplRR[rs,sx,"Change / year",]
+ ComplRR[rs,sx,c("Compl vs. None (2002)",
                                                               <- ci.exp( apdc , subset="per" )
                           "Compl vs. None (2010)",
                           "Change / year (None)"
                           "Change / year (Compl)"),] <- ci.exp( apdcll,
                                                                                    subset="DN".
+
                                                                                    ctr.mat=CMi )
+ } )
    user system elapsed
   82.91
                1.15
                         88.98
> ## Just to show the parameters actually extracted in the code above:
> ci.exp( apdc )
                                    exp(Est.)
                                                          2.5%
(Intercept)
                                    2.4143201 1.5196521 3.8357079
Ns(age, knots = a.kn)1 \quad 0.4555361 \quad 0.2976718 \quad 0.6971207
Ns(age, knots = a.kn)2 0.7772101 0.5889821 1.0255925
Ns(age, knots = a.kn)3 0.5411388 0.3979321 0.7358824
Ns(age, knots = a.kn)4 0.5717310 0.4464008 0.7322484
Ns(Ddur, knots = d.kn)1 0.9580779 0.6972619 1.3164540
Ns(Ddur, knots = d.kn)2 0.6658865 0.2576499 1.7209590
Ns(Ddur, knots = d.kn)3 1.0722389 0.8420628 1.3653330
I(lex.Cst == "DN")TRUE 1.9926924 1.6724267 2.3742882
```

```
> ci.exp( apdcs )
                                                  exp(Est.)
                                                                  2.5%
                                                  2.4248983 1.5084862 3.8980349
(Intercept)
                                                  0.4597599 0.3004526 0.7035358
Ns(age, knots = a.kn)1
                                                  0.7694033 0.5826289 1.0160523
Ns(age, knots = a.kn)2
Ns(age, knots = a.kn)3
Ns(age, knots = a.kn)4
                                                  0.5367366 0.3946416 0.7299946
                                                  0.5697035 0.4447888 0.7296994
Ns(Ddur, knots = d.kn)1
                                                  0.9768536 0.7104202 1.3432091
Ns(Ddur, knots = d.kn)2
                                                  0.6875832 0.2654226 1.7811994
```

0.9862718 0.9540445 1.0195876

I(per - 2010)

```
Ns(Ddur, knots = d.kn)3
                                                1.0875588 0.8537523 1.3853948
I(lex.Cst == "DN")TRUE
                                                2.0108237 1.4328838 2.8218702
I(lex.Cst == "DN")FALSE:Ns(per, knots = p.kn)1 1.1987803 0.6944684 2.0693157
I(lex.Cst == "DN")TRUE:Ns(per, knots = p.kn)1 1.0430612 0.5983416 1.8183203
I(lex.Cst == "DN")FALSE:Ns(per, knots = p.kn)2 0.6521453 0.4636892 0.9171951
I(lex.Cst == "DN")TRUE:Ns(per, knots = p.kn)2 1.0309941 0.7323797 1.4513631
> ci.exp( apdcp )
                         exp(Est.)
                                        2.5%
                                                 97.5%
                        2.4294405 1.5282849 3.8619640
(Intercept)
Ns(age, knots = a.kn)1 0.4554513 0.2975923 0.6970473
Ns(age, knots = a.kn)2 0.7836084 0.5929695 1.0355374
Ns(age, knots = a.kn)3 \quad 0.5424703 \quad 0.3989120 \quad 0.7376915
Ns(age, knots = a.kn)4 \quad 0.5732549 \quad 0.4475306 \quad 0.7342988
Ns(Ddur, knots = d.kn)1 0.9549534 0.6946931 1.3127178
Ns(Ddur, knots = d.kn)2 0.6650127 0.2572458 1.7191411
Ns(Ddur, knots = d.kn)3 1.0582754 0.8270709 1.3541124
I(lex.Cst == "DN")TRUE 1.9592696 1.6267640 2.3597383
I(per - 2010)
                  0.9876584 0.9550217 1.0214105
comp94Prev
                        1.0938205 0.7960679 1.5029413
> ci.exp( apd )
                        exp(Est.)
                                        2.5%
                                                 97.5%
                        2.5437993 1.6039846 4.0342748
(Intercept)
Ns(age, knots = a.kn)1 0.4883967 0.3196207 0.7462950
Ns(age, knots = a.kn)2 0.7625204 0.5772803 1.0072010
Ns(age, knots = a.kn)3 \quad 0.5363264 \quad 0.3945901 \quad 0.7289744
Ns(age, knots = a.kn)4 0.5630533 0.4394684 0.7213921
Ns(Ddur, knots = d.kn)1 1.1564677 0.8454647 1.5818727
Ns(Ddur, knots = d.kn)2 0.9277629 0.3623429 2.3754956
Ns(Ddur, knots = d.kn)3 1.2869219 1.0151843 1.6313964
I(per - 2010)
                        0.9801094 0.9481106 1.0131883
> save( AMort, AgeDM, CurveRR, ComplRR, ComplTt, file="./data/T2AllCau.Rda")
The average change in mortality by age at onset are:
> round( (ftable(AgeDM[1:2,,])-1)*100, 2 )
                            10
              what
                     Est
                                   hi
cod
          sex
All cause M
                   -3.22 -4.33 -2.10
                   -1.54 -2.91 -0.15
          F
SMR.
          M
                   -3.22 -4.33 -2.10
                   -1.53 -2.90 -0.14
```

In order to assess how different these slopes by age at diagnosis are, we need a small function to compute the ratio of the rates from the confidence intervals:

```
> r2rr <-
+ function( r1, r2 )
  11 \leftarrow log(r1[1])
+ sl1 <- log( r1[3]/r1[2] )/(2*1.96)
  12 <- log( r2[1] )
+ s12 <- log( r2[3]/r2[2] )/(2*1.96)
+ 1r <- 11-12
+ slr <- sqrt( sl1^2 + sl2^2 )
+ res <- c( exp( c(lr,slr) %*% ci.mat() ),
            1-pchisq((lr/slr)^2, 1))
+ names( res ) <- c("RR", "lo", "hi", "P")
+ res
+ }
> round( ftable(AgeDM[1:2,,]-1)*100, 1 )
              what Est
                         10
cod
          sex
All cause M
                   -3.2 -4.3 -2.1
                   -1.5 -2.9 -0.2
          F
SMR
                   -3.2 -4.3 -2.1
          M
                   -1.5 -2.9 -0.1
> round( r2rr( AgeDM["All cause","M",], AgeDM["All cause","F",] ), 3 )
         10
               hi
0.983 0.965 1.001 0.062
> round( r2rr( AgeDM["SMR","M",], AgeDM["SMR","F",] ), 3 )
   R.R.
         10
               hi
0.983 0.965 1.001 0.061
```

Thus we see that the male mortality decreases by 3.2% per year of age at diagnosis, the female only by 1.5% per year, the difference is 1.7% (0.0–3.5), p=0.061, so a tendency of a steeper decrease by age at diagnosis for men than women.

A quick look at the tests for the various subsets of data, and the corresponding estimates of effects:

```
> str( ComplTt)

num [1:5, 1:2, 1:6, 1:3] 1.83 1.78 NA NA NA ...
- attr(*, "dimnames")=List of 4
    ..$ cod : chr [1:5] "All cause" "SMR" "CVDonly" "CVD" ...
    ..$ sex : chr [1:2] "M" "F"
    ..$ pred: chr [1:6] "Linear DdurxAge interaction" "Linear CxP interaction" "Linear period effect"
    ..$ what: chr [1:3] "Chisq" "df" "Pval"

> round( ftable( ComplTt[1:2,,,"Pval"], row.vars=3, col.vars=c(1,2) ), 3 )
```

```
cod All cause
                                                   SMR
                                                     Μ
                             sex
pred
Linear DdurxAge interaction
                                     0.176 0.964 0.183 0.956
Linear CxP interaction
                                     0.281 0.248 0.292 0.259
Linear period effect
                                     0.962 0.120 0.931 0.086
No CxP interaction
                                     0.095 0.283 0.084 0.281
Compl 1994 ne Compl
                                     0.174 0.616 0.180 0.582
No Compl effect
                                     0.000 0.000 0.000 0.000
```

The table shows that the models with linear period effect is pretty much the adequate one to report from. There is no duration by age interaction, no complications by period interactions and no difference in mortality or SMR between those that have complications before or after 1994.

Thus the base model (apdc in the above code) has an effect of current age, current duration of diabetes, a fixed complications effect and a (log-)linear change in mortality over calendar time.

In the following, the first 2 estimates are from a model where there is an additional complications effect for those with complication onset before 1994 (that is, with unknown complications duration), the next two estimates are from the base model, and the last 4 estimates are from the model with a separate complications RR and separate calendar time trend between persons with and without complications (that is the model including the non-significant period by complications interaction):

```
> round( ftable( ComplRR[1:2,,,], row.vars=c(3) ), 2 )
```

```
cod All cause
                                                                SMR
                                                  F
                                                                                 F
                      sex
                                   M
                                                                 M
                      what
                                 Est
                                       10
                                           hi Est
                                                      10
                                                           hi Est
                                                                      10
                                                                          hi Est
                                                                                          hi
pred
Compl 1994 vs. later
                                1.17 0.93 1.46 1.09 0.79 1.49 1.17 0.93 1.46 1.09 0.80 1.50
                                1.71 1.47 1.99 1.97 1.63 2.37 1.71 1.47 1.99 1.96 1.63 2.36
Compl later vs. None
Compl vs. None
                                1.76 1.52 2.03 2.00 1.68 2.38 1.76 1.52 2.03 1.99 1.67 2.37
                                0.95 0.92 0.97 0.97 0.94 1.00 0.97 0.94 1.00 0.99 0.95 1.02
Change / year
Compl vs. None (2002)
                                1.42 1.07
                                          1.89 1.69 1.19 2.40 1.41 1.06 1.88 1.69
                                2.06 1.62 2.62 2.26 1.70 3.01 2.07 1.63 2.64 2.26 1.70
Compl vs. None (2010)
Change / year (None)
                                0.92 0.88 0.96 0.95 0.91 1.00 0.94 0.90 0.98 0.97 0.93 1.01
Change / year (Compl)
                                0.96 0.93 1.00 0.99 0.94 1.04 0.99 0.95 1.02 1.01 0.96 1.06
```

The general picture from the interaction is that the complications RR in 2010 is slightly above 2, and that there is an annual decrease in mortality of 5% (3–8) for men and a decrease of 3% (0–6) for women, whereas the corresponding decreases in SMR are M: 3% (0–6) and W: 1% (–2–5). The changes are not significantly different between men and women, though. We here make a quick test for the equality of the trends:

```
> ci.indep <-
+ function( EE )
+ {
+ # Assume that EE is a 2-row matrix with 3 columnas:
+ # Estimate, lower and upper ci
+ le <- log( EE[,1] )
+ sl <- log(EE[,3]/EE[,2])/(1.96*2)
+ dl <- diff(le)
+ sd <- sqrt(sum(sl^2))
+ res <- c( exp(dl),
+ exp(dl-1.96*sd),
+ exp(dl+1.96*sd),
+ 1-pchisq((dl/sd)^2,1) )</pre>
```

```
+ names( res ) <- c("RR", "lo", "up", "Pval")
+ res
+ }
> ftable( ComplRR[c("All cause", "SMR"),, "Change / year",] )
                         Est
                                    10
              what
                                               hi
          sex
                   0.9452018 0.9198842 0.9712162
All cause M
                   0.9672470 0.9355611 1.0000060
          F
                   0.9695112 0.9435926 0.9961417
SMR
          Μ
          F
                   0.9862718 0.9540445 1.0195876
> round( ci.indep( ComplRR["All cause",,"Change / year",] ), 3 )
               up Pval
   R.R.
         10
1.023 0.980 1.068 0.293
> round( ci.indep( ComplRR["SMR"
                                       ,,"Change / year",] ), 3 )
         10
               up Pval
1.017 0.975 1.062 0.433
```

> round(ftable(Est, col.vars=c(2,4), row.vars=c(3,1)), 1)

We then transform this to the relevant numbers for the table in the paper, that is, RR at fixed times and % change for the mortality trends.

```
> dimnames( ComplRR )
$cod
[1] "All cause" "SMR"
                             "CVDonly"
                                         "CVD"
                                                       "Cancer"
$sex
[1] "M" "F"
[1] "Compl 1994 vs. later" "Compl later vs. None" "Compl vs. None"
                                                                                 "Change / year"
[5] "Compl vs. None (2002)" "Compl vs. None (2010)" "Change / year (None)" "Change / year (Compl)"
$what
[1] "Est" "lo" "hi"
> Est <- ComplRR[1:2,,3:8,]
> str( Est )
 num [1:2, 1:2, 1:6, 1:3] 1.757 1.756 1.998 1.993 0.945 ... - attr(*, "dimnames")=List of 4
  ..$ cod : chr [1:2] "All cause" "SMR"
  ..$ sex : chr [1:2] "M" "F"
  ..$ pred: chr [1:6] "Compl vs. None" "Change / year" "Compl vs. None (2002)" "Compl vs. None (2010)
  ..$ what: chr [1:3] "Est" "lo" "hi"
> Est[,,c(2,5,6),] \leftarrow round((Est[,,c(2,5,6),]-1)*100,1)
```

```
Μ
                                                             F
                                 sex
                                 what
                                        Est
                                               10
                                                      hi
                                                           Est
                                                                  10
                                                                         hi
                       cod
pred
Compl vs. None
                       All cause
                                        1.8
                                               1.5
                                                     2.0
                                                           2.0
                                                     2.0
                                                           2.0
                                                                        2.4
                       SMR
                                        1.8
                                               1.5
                                                                  1.7
                       All cause
Change / year
                                        -5.5
                                              -8.0
                                                    -2.9
                                                          -3.3
                                                                -6.4
                                                                        0.0
                       SMR
                                        -3.0
                                              -5.6
                                                    -0.4
                                                          -1.4
                                                                -4.6
Compl vs. None (2002) All cause
                                                                 1.2
                                        1.4
                                              1.1
                                                     1.9
                                                           1.7
                                                                        2.4
                                        1.4
                       SMR
                                               1.1
                                                     1.9
                                                           1.7
Compl vs. None (2010) All cause
                                        2.1
                                                     2.6
                                                           2.3
                                               1.6
                       SMR
                                        2.1
                                              1.6
                                                     2.6
                                                           2.3
                                                                 1.7
                                                                        3.0
Change / year (None)
                       All cause
                                       -8.1 -11.9
                                                    -4.1
                                                          -4.9
                                                                -9.2
                                                    -1.7
                                                                -7.4
                       SMR.
                                       -5.8 -9.7
                                                          -3.0
                                                                        1.5
Change / year (Compl)
                       All cause
                                       -3.7
                                             -7.0
                                                    -0.3
                                                          -1.4
                                                                -6.1
                                                                        3.5
                                             -4.5
                       SMR
                                       -1.1
                                                     2.4
                                                           0.5
                                                                -4.2
                                                                        5.5
```

From this we see that there is a significant decrease of 5.5% per year for male T2D and a 3.3% borderline significant decrease in mortalty among women.

With these estimates we can now plot the age-effects for all cause mortality:

We can do the same for the corresponding SMR-model, giving the SMR by age for a fixed value of period (1.1.2008):

We also show the shape of the RR as a function of (current) calendar time, both for the model with and without nephropathy interaction:

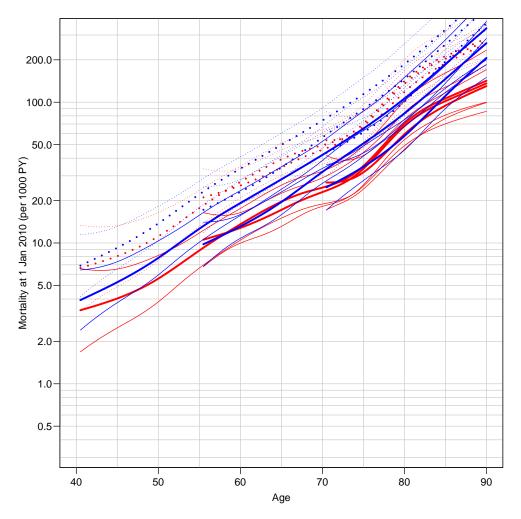


Figure 3.4: Age-specific all-cause mortality rates without (full lines) and with (broken lines) DN for T2 patients aged 40, 55 and 75 at diagnosis (assumed to be in 2010). Red: F; blue: M; thin lines: 95% c.i.

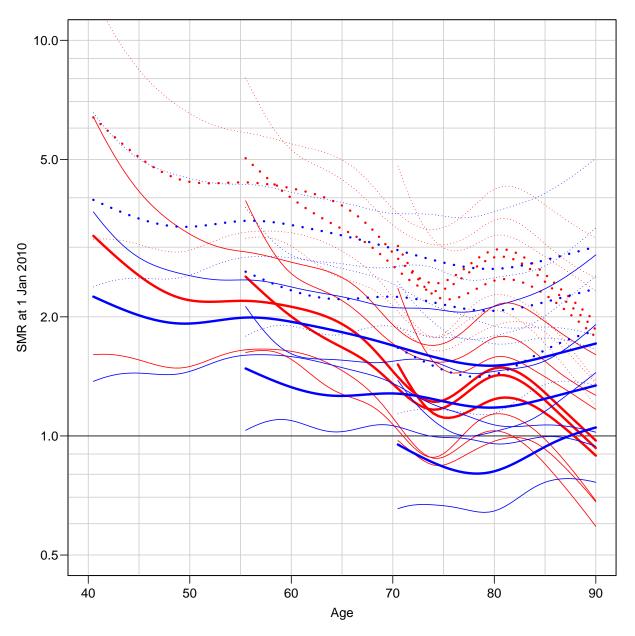


Figure 3.5: Age-specific all-cause relative mortality (SMR). T2 patients aged 15, 30, 45 at diagnosis, T2 patients age 40, 55, 70 at diagnosis. Red: F; blue: M; thin lines: 95% c.i.

To explore the shape of the (non-significant) interactions we plot all the mortality curves for the two models together:

```
> par(mfrow=c(2,4), mar=c(3,3,1,1), mgp=c(3,1,0)/1.6, oma=c(0,2,2,0))
> for( rs in dimnames(AMort)[[1]][1:2] )
+ for( md in dimnames(AMort)[[2]] )
+ plot( NA, type="n", log="y", ylim=if(rs=="SMR") rlim else mlim,
        xlim=c(40,90), xlab="Age", ylab="", las=1)
+ abline( v=seq(0,100,5), h=outer(1:15,10^(-1:2),"*"), col=gray(0.8) )
+ if( rs=="All cause"
   mtext( paste( md, "model"), side=3, line=1 )
+ if( md=="Final" )
    mtext( c( paste("Mortality at 1 Jan", pref, "(per 1000 PY)"),
              paste("SMR 1 Jan", pref ) )[1+(rs=="SMR")],
           line=3, side=2)
+ if(rs=="SMR") abline(h=1)
+ for( sx in 1:2)
+ matlines( as.numeric( dimnames(AMort)[["pred"]] ),
            AMort[rs,md, "Alive",sx,,],
            lwd=2, lty=c(1,0,0),
col=c("blue","red")[sx] )
+ box()
```

3.7.1 Graphs and tables for the paper

First we extract the numbers we need for the table of estimates

```
> str( ComplRR )
num [1:5, 1:2, 1:8, 1:3] 1.17 1.17 NA NA NA ... - attr(*, "dimnames")=List of 4
  ..$ cod : chr [1:5] "All cause" "SMR" "CVDonly" "CVD" ...
  ..$ sex : chr [1:2] "M" "F"
  ..$ pred: chr [1:8] "Compl 1994 vs. later" "Compl later vs. None" "Compl vs. None" "Change / year'
  ..$ what: chr [1:3] "Est" "lo" "hi"
> arttab <- ComplRR[1:2,,,]
> dimnames( arttab )
$cod
[1] "All cause" "SMR"
[1] "M" "F"
[1] "Compl 1994 vs. later" "Compl later vs. None" "Compl vs. None"
                                                                                 "Change / year"
[5] "Compl vs. None (2002)" "Compl vs. None (2010)" "Change / year (None)" "Change / year (Compl)"
$what
[1] "Est" "lo" "hi"
```

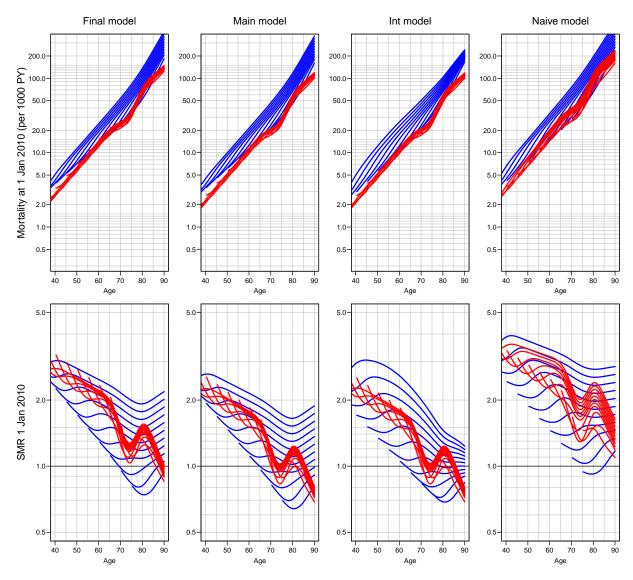


Figure 3.6: Age-specific all-cause mortality and SMR for T2D patients without complications, diagnosed 1.1.2010 in ages 25,30,...75. The final model have a linear effect of calendar time, the main and the interaction model a 2-parameter-spline effect of calendar time; in all models the calendar time effect is separate for persons with and without complications. The interaction model has an extra 1-parameter (product) interaction between current age and current duration of diabetes. Red: F; blue: M

```
> arttab[,,c(4,7,8),] \leftarrow round((arttab[,,c(4,7,8),] - 1)*100, 1)
> round( ftable( arttab, row.vars=c(3,1)), 2)
                                                                   F
                                             М
                                  sex
                                  what
                                           Est
                                                   10
                                                           hi
                                                                 Est
                                                                          10
                                                                                 hi
pred
                       cod
Compl 1994 vs. later
                                                 0.93
                       All cause
                                          1.17
                                                         1.46
                                                                1.09
                                                                        0.79
                                                                               1.49
                       SMR.
                                          1.17
                                                 0.93
                                                         1.46
                                                                1.09
                                                                        0.80
                                                                               1.50
Compl later vs. None
                       All cause
                                          1.71
                                                 1.47
                                                         1.99
                                                                1.97
                                                                        1.63
                                                                               2.37
                                                         1.99
                       SMR
                                         1.71
                                                 1.47
                                                                1.96
                                                                               2.36
                                                                        1.63
                                                                2.00
Compl vs. None
                                         1.76
                                                 1.52
                                                         2.03
                                                                               2.38
                       All cause
                                                                        1.68
                       SMR.
                                         1.76
                                                 1.52
                                                         2.03
                                                                1.99
                                                                               2.37
                                                                       1.67
Change / year
                       All cause
                                         -5.50
                                                -8.00
                                                        -2.90
                                                               -3.30
                                                                       -6.40
                                                                               0.00
                       SMR
                                         -3.00
                                                -5.60
                                                        -0.40
                                                               -1.40
                                                                       -4.60
                                                                               2.00
                                                                               2.40
Compl vs. None (2002) All cause
                                         1.42
                                                 1.07
                                                         1.89
                                                                1.69
                                                                       1.19
                       SMR.
                                          1.41
                                                 1.06
                                                         1.88
                                                                1.69
                                                                        1.19
                                                                               2.39
Compl vs. None (2010)
                       All cause
                                          2.06
                                                 1.62
                                                         2.62
                                                                2.26
                                                                        1.70
                                                                               3.01
                       SMR
                                         2.07
                                                         2.64
                                                                2.26
                                                 1.63
                                                                        1.70
                                                                               3.00
Change / year (None)
                       All cause
                                         -8.10 -11.90
                                                        -4.10
                                                               -4.90
                                                                       -9.20
                                                                              -0.50
                                         -5.80
                                                        -1.70
                                                                       -7.40
                                               -9.70
                                                               -3.00
                                                                               1.50
                       SMR
                                               -7.00
Change / year (Compl)
                       All cause
                                         -3.70
                                                       -0.30
                                                               -1.40
                                                                       -6.10
                                                                               3.50
                       SMR
                                        -1.10 -4.50
                                                         2.40
                                                                0.50 - 4.20
                                                                               5.50
```

It is the last 6 lines of output that enters as the table in the paper. We then draw the figure(s) for the paper:

```
> f1 <-
+ function(cls=1:3,dr=TRUE,my=2.5,ry=0.55,aod=c(4,7,10))
+ {
+ par( mfrow=if(dr) c(3,2) else c(2,2), mar=c(3,0,1,0), oma=c(0,4,1,1), mgp=c(3,1,0)/1.6,
      las=1, lend=1 )
+ scol <- c("blue", "red")
+ pr.A <- as.numeric( dimnames(AMort)[["pred"]] )
+ agr <- cumsum( is.na(pr.A) )
+ wh <- (agr %in% aod)
                                  ## Age at dx indicator
+ fs <- which(diff(c(0,wh*agr))>0)+1 ## First point of predictions
+ p.pr <- as.numeric( dimnames(CurveRR)[["pred"]] )
+ # Mortality
+ mlim < - c(2,500)
+ for( sx in 1:2)
+
 + abline( v=seq(0,100,5), h=outer(1:9,10^(-1:2),"*"), col=gray(0.8) )
+ matlines( pr.A[wh], AMort["All cause", "Final", "Alive", sx, wh, cls],
           lwd=c(3,1,1), lty=1, col=scol[sx])
 matlines( pr.A[wh], AMort["All cause", "Final", "DN"
                                                   ,sx,wh,cls],
           lwd=c(3,1,1), lty="11", lend=1, col=scol[sx] )
+ if( sx==1 )
   {
   axis(side=2)
+
   mtext( paste("Mortality at 1 Jan", pref, "(per 1000 PY)"),
          line=2.5, side=2, outer=FALSE, las=0, cex=0.7)
+
 if( !is.null(my) )
+
   segments( floor(pr.A[fs]),
             pmin(my,apply(AMort["All cause", "Final", c("Alive", "DN"), sx,fs,1],2,min)),
             floor(pr.A[fs]),
             pmax(my,apply(AMort["All cause","Final",c("Alive","DN"),sx,fs,1],2,max)),
             col=scol[sx] )
```

```
text( floor(pr.A[fs])+1, my, paste(floor(pr.A[fs])), adj=0, col=scol[sx] )
+ mtext(c("a","b")[sx], side=3, adj=0.01, line=0.2)
+ mtext(c("Men","Women")[sx], side=3, adj=0.5, line=1)
+ box()
+ rlim < - c(1/2, 10)
+ for( sx in 1:2 )
+ plot( NA, type="n", log="y", ylim=rlim, xlim=c(40,90),
+ xlab="Age", ylab="", yaxt="n", las=1 )
+ abline( v=seq(0,100,5), h=outer(1:9,10^(-1:2),"*"), col=gray(0.8) )
+ abline( h=1 )
+ matlines( pr.A[wh], AMort["SMR", "Final", "Alive", sx, wh, cls],
,sx,wh,cls],
 if( sx==1 )
    ₹
+
    axis(side=2)
    mtext( paste("SMR at 1 Jan", pref )
           line=2.5, side=2, outer=FALSE, las=0, cex=0.7)
  if( !is.null(ry) )
+
+
    segments( floor(pr.A[fs]),
               pmin(ry,apply(AMort["SMR","Final",c("Alive","DN"),sx,fs,1],2,min)),
+
              floor(pr.A[fs]),
               pmax(ry,apply(AMort["SMR","Final",c("Alive","DN"),sx,fs,1],2,max)),
              col=scol[sx] )
    text( floor(pr.A[fs])+1, ry, paste(floor(pr.A[fs])), adj=0, col=scol[sx] )
+
+
+ box()
+ mtext( c("c", "d")[sx], side=3, adj=0.01, line=0.2 )
+ if( dr ) {
+ # Mortality RR
+ rlim < - c(0.4,4)
+ for( sx in 1:2)
+ plot( NA, type="n", log="y", ylim=rlim, xlim=c(2002,2011),
        xlab="Date of follow-up", ylab="", las=1, yaxt="n" )
+ abline( v=2000:2015, h=outer(1:9,10^(-1:2),"*"), col=gray(0.8) )
+ abline( h=1 )
+ matlines( p.pr, CurveRR["All cause", "Final", "Alive", sx,,cls],
+ lwd=c(3,1,1), lty=1, col=scol[sx])
+ matlines(p.pr, CurveRR["SMR", "Final","
                                    ,"Final","Alive",sx,,cls],
            lwd=c(3,1,1), lty="11", lend=1, col=scol[sx] )
+ if( sx==1 )
+
+
    axis(side=2)
    mtext( "SMR ratio (broken)
                                   Mortality ratio (full)",
           line=2.5, side=2, outer=FALSE, las=0, cex=0.7 )
+ box()
+ mtext( c("e", "f")[sx], side=3, adj=0.01, line=0.2 )
+
+ }
> f1(aod=c(4,6,8,10))
```

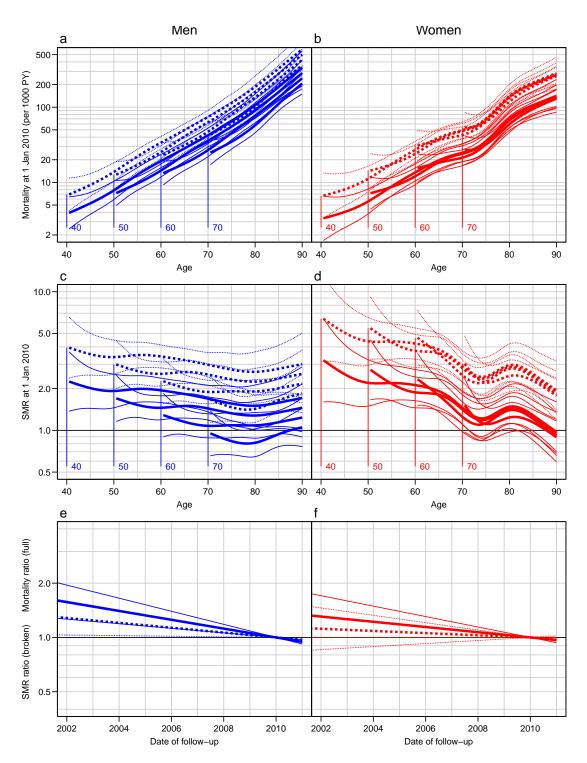


Figure 3.7: Mortality rates (a,b), SMR (c,d) and changes in these (e,f). Patients diagnosed with DM in ages 40, 50, 60 and 70. For mortality rates and SMR, patients without nephropathy are with full lines, patients with nephropathy are with dotted lines. For the changes (e,f), the full lines are changes in mortality, dotted lines changes in SMR. Thin lines indicate 95% confidence intervals throughout.

```
> f1( cls=1,aod=4:10 )
> pdf( "T2Fig1.pdf", height=9, width=7 )
> f1( cls=1, aod=c(4,6,8,10) )
> dev.off()

pdf
   2

> win.metafile( "T2Fig1.emf", height=9, width=7 )
> f1( cls=1, aod=c(4,6,8,10) )
> dev.off()
```

3.7.2 Results from the naive model

We also show results for the overall mortality and SMR as estimated from the naïve model where nephropathy status is ignored. Hence we only have one set of curves in each graph, referring to the overall mortality regardless of nepropathuy status.

```
> f1n <-
+ function(cls=1:3,dr=TRUE,my=2.5,ry=0.55,aod=c(4,7,10))
+ {
+ par( mfrow=if(dr) c(3,2) else c(2,2), mar=c(3,0,1,0), oma=c(0,4,1,1), mgp=c(3,1,0)/1.6,
       las=1, lend=1 )
+ scol <- c("blue", "red")
+ pr.A <- as.numeric( dimnames(AMort)[["pred"]] )
+ agr <- cumsum( is.na(pr.A) )
+ wh <- (agr %in% aod)
                                        ## Age at dx indicator
+ fs \leftarrow \text{which}(\text{diff}(c(0,\text{wh*agr}))>0)+1 \text{ ## } First \text{ point of predictions}
+ p.pr <- as.numeric( dimnames(CurveRR)[["pred"]] )</pre>
+ # Mortality
+ mlim <- c(2,500)
+ for( sx in 1:2)
+ plot( NA, type="n", log="y", ylim=mlim, xlim=c(40,90),

+ xlab="Age", ylab="", las=1, yaxt="n")

+ abline( v=seq(0,100,5), h=outer(c(1.5,1:9),10^(-1:2),"*"), col=gray(0.8) )
+ matlines(pr.A[wh], AMort["All cause", "Naive", "Alive", sx, wh, cls],
             lwd=c(3,1,1), lty=1, col=scol[sx])
+ if( sx==1 )
    axis(side=2)
    mtext( paste("Mortality at 1 Jan", pref, "(per 1000 PY)"),
            line=2.5, side=2, outer=FALSE, las=0, cex=0.7)
  if( !is.null(my) )
    segments( floor(pr.A[fs]),
               pmin(my, AMort["All cause", "Naive", "Alive", sx,fs,1]),
               floor(pr.A[fs]),
               pmax(my,AMort["All cause","Naive","Alive",sx,fs,1]),
               col=scol[sx] )
    text( floor(pr.A[fs])+1, my, paste(floor(pr.A[fs])), adj=0, col=scol[sx] )
```

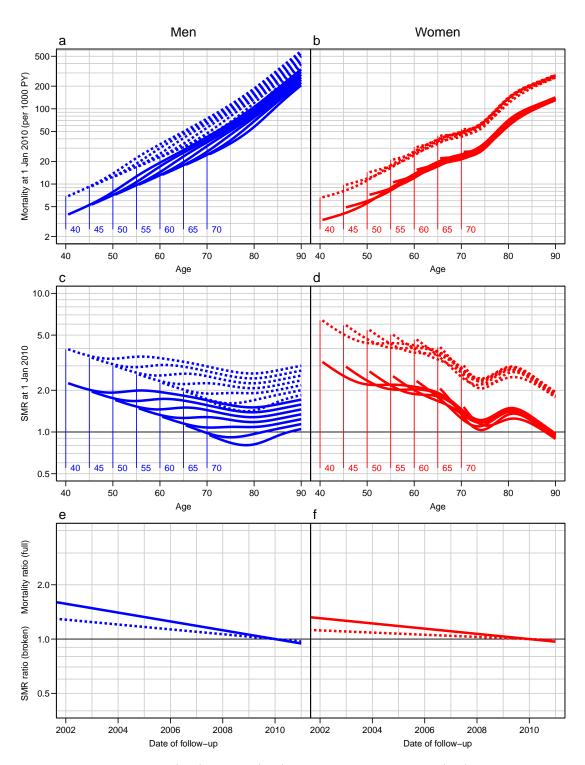


Figure 3.8: Mortality rates (a,b), SMR (c,d) and changes in these (e,f). Patients diagnosed with DM in ages 40, 45,...,70. For mortality rates and SMR, patients without nephropathy are with full lines, patients with nephropathy are with dotted lines. For the changes (e,f), the full lines are changes in mortality, dotted lines changes in SMR.

```
+ mtext( c("a", "b")[sx], side=3, adj=0.01, line=0.2 )
+ mtext( c("Men", "Women")[sx], side=3, adj=0.5, line=1 )
+ box()
+ rlim < - c(1/2,5)
+ for( sx in 1:2)
+ plot( NA, type="n", log="y", ylim=rlim, xlim=c(40,90),
       xlab="Age", ylab="", yaxt="n", las=1)
+ abline( v=seq(0,100,5), h=outer(c(1.5,1:9),10^(-1:2),"*"), col=gray(0.8))
+ abline( h=1 )
+ matlines( pr.A[wh], AMort["SMR","Naive","Alive",sx,wh,cls],
           lwd=c(3,1,1), lty="11", lend=1, col=scol[sx] )
+ if( sx==1 )
+
    {
+
    axis(side=2)
    mtext( paste("SMR at 1 Jan", pref );
           line=2.5, side=2, outer=FALSE, las=0, cex=0.7 )
 if( !is.null(ry) )
+
+
    segments( floor(pr.A[fs]),
               pmin(ry, AMort["SMR", "Naive", "Alive", sx,fs,1]),
+
              floor(pr.A[fs]),
              pmax(ry, AMort["SMR", "Naive", "Alive", sx,fs,1]),
+
              col=scol[sx] )
    text( floor(pr.A[fs])+1, ry, paste(floor(pr.A[fs])), adj=0, col=scol[sx] )
+
    7
+ box()
+ mtext( c("c", "d")[sx], side=3, adj=0.01, line=0.2 )
+ if( dr ) {
+ # Mortality RR
+ rlim < - c(0.5,5)
+ for( sx in 1:2 )
+ plot( NA, type="n", log="y", ylim=rlim, xlim=c(2002,2011),
+ xlab="Date of follow-up", ylab="", las=1, yaxt="n")
+ abline( v=2000:2015, h=outer(c(1.5,1:9),10^(-1:2),"*"), col=gray(0.8) )
+ abline( h=1 )
+ matlines( p.pr, CurveRR["All cause", "Naive", "Alive", sx,,cls],
            lwd=c(3,1,1), lty=1, col=scol[sx])
+ matlines( p.pr, CurveRR["SMR"
                                  ,"Naive","Alive",sx,,cls],
            lwd=c(3,1,1), lty="11", lend=1, col=scol[sx])
+ points( pref, 1, pch=16, col="white" )
+ points( pref, 1, pch=1 , col=scol[sx], lwd=2 )
+ if ( sx==1 )
   ₹
    axis(side=2)
+
   mtext( "Relative SMR
                            Relative mortality",
+
          line=2.5, side=2, outer=FALSE, las=0, cex=0.7)
+ box()
+ mtext( c("e", "f")[sx], side=3, adj=0.01, line=0.2 )
+ }
> f1n(c1s=1,aod=c(4,6,8,10))
> pdf( "T2Fig1n.pdf", height=9, width=7 )
> f1n( cls=1, aod=c(4,6,8,10) )
> dev.off()
```

```
2
```

pdf

```
> win.metafile( "T2Fig1n.emf", height=9, width=7 )
> f1n( cls=1, aod=c(4,6,8,10) )
> dev.off()
pdf
2
```

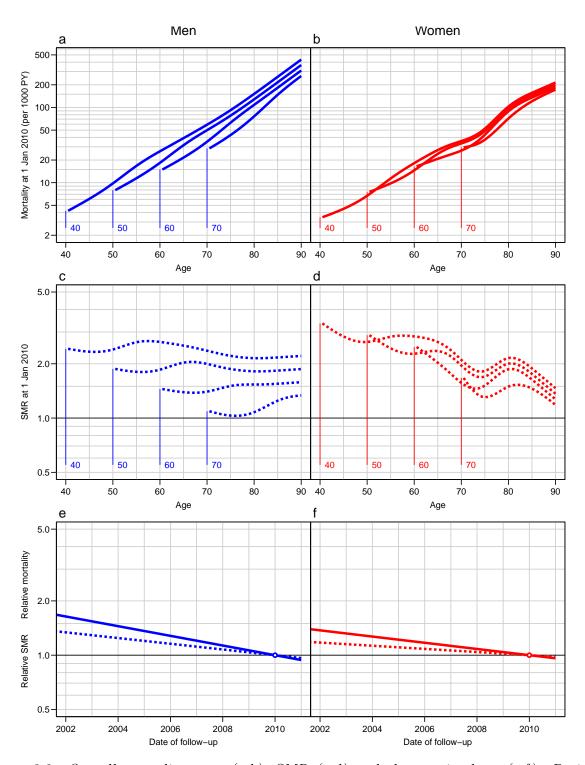


Figure 3.9: Overall mortality rates (a,b), SMR (c,d) and changes in these (e,f). Patients diagnosed with DM in ages 40, 50, 60 and 70. Mortality rates are full lines, SMRs are with broken lines.