

```

1
2  cd "."
3  cap log close
4  log using "log_cleaning", replace
5  cls
6  set more off
7  cd "."
8  use "hypo_database_Oct.dta", clear
9  set seed 987654
10
11 /*data checking and cleaning*/
12 rename patid id
13 distinct id
14 rename townsend2001_5 imd
15
16 format %9.0g smk_date
17 foreach var of varlist *date {
18     replace `var' = (`var' - studyentry)/(365.24/12)
19 }
20 mdesc egfr_date-w_date
21
22 tabstat aspirin_date statin_date egfr_date hba1c_date ldl_date chol_date bp_date smk_date alc_date w_date, statistics(mean median p25 p75 p5
p95) columns(statistics) format(%7.2f)
23
24 drop alc_week diastolic marital
25 mdesc imd af_date af0 alc_date alc_status aspirin_date bmi aspirin0 bp_date systolic chol_date cholesterol diagdate egfr_date egfr ethnic
gender /*
26 */hba1c_date hba1c_last ldl_date ldl mean_hba1c median_hba1c sd_hba1c smk_date smk_status statin_date statin0 stroke_date stroke0 w_date weight
27 mdesc imd alc_date alc_status bmi bp_date systolic chol_date cholesterol diagdate egfr_date egfr ethnic gender /*
28 */hba1c_date hba1c_last ldl_date ldl mean_hba1c median_hba1c sd_hba1c smk_date smk_status w_date weight
29
30 rename alc_status alc
31 rename systolic sbp
32 rename cholesterol tchol
33 rename ethnic eth
34 rename gender sex
35 rename hba1c_last la1c
36 rename smk_status smk
37 rename aspirin0 asa0
38 rename statin0 stat0
39 gsort -sex
40 sencode sex, replace
41 sort id
42 mdesc imd alc bmi sbp tchol egfr eth sex la1c smk asa0 stat0 af0 stroke0 pad0 hf0 cancer0 mi0
43
44 tab eth, m
45 replace eth = "nonWhite" if (eth != "White" & eth != "")

```

```

46  tab eth, m
47
48  tab cause, sort m
49  rename cause ICD_code
50  merge m:1 ICD_code using "icd.dta"
51  drop description
52  drop if _merge == 2
53  gsort -death _merge
54  tab _merge if death == 1
55  order ICD_code, before(icd)
56  tab ICD_code if (_merge == 1 & death == 1), sort
57  cls
58  tab ICD_code if (_merge == 1 & death == 1)
59  rename cause_death type
60  replace type = "cvd" if type == "Cardiovascular"
61  replace type = "tum" if type == "Cancer"
62  replace type = "other" if type == "" & ICD_code != ""
63  drop _merge icd_version
64  rename ICD_code cause
65  replace studytime = studytime/365.24
66  rename studytime time
67
68  gen tcvd = time
69  gen dcvd = 1 if type == "cvd"
70  replace dcvd = 0 if type != "cvd"
71  gen ttum = time
72  gen dtum = 1 if type == "tum"
73  replace dtum = 0 if type != "tum"
74  gen tother = time
75  gen dother = 1 if type == "other"
76  replace dother = 0 if type != "other"
77  gen tall = time
78  gen dall = 1 if cause != ""
79  replace dall = 0 if cause == ""
80
81  gen day = runiform()
82  gen datebirth = yob + day
83  drop day
84  format studyentry %td
85  gen timezero = 2011 + runiform()/365.24
86  gen age0 = timezero-datebirth
87  sort eth
88  sencode eth, replace
89  sort id
90  mdesc age0 sex eth imd bmi smk alc sbp tchol ldl egfr la1c mean_hba1c median_hba1c sd_hba1c insulin metformin su othergld cancer0 mi0 pad0
    stroke0 hf0 af0 stat0 asa0
91  egen float glulow = rowtotal(insulin su metformin othergld)

```

```

92  tab glulow
93  egen float glumiss = rowmiss(insulin su metformin othergld)
94  tab glumiss
95  foreach var of varlist insulin su metformin othergld {
96      replace `var' = 0 if `var' == .
97  }
98  mdesc age0 sex eth imd bmi smk alc sbp tchol ldl egfr la1c mean_hba1c median_hba1c sd_hba1c insulin metformin su othergld cancer0 mi0 pad0
stroke0 hf0 af0 stat0 asa0
99  drop glulow glumiss
100 save "db0", replace
101 log close
102
103
104 #####
105 ////////////////////////////////////MAIN ANALYSIS////////////////////////////////////
106 #####
107
108 cap log close
109 log using "log_analysis", replace
110
111 #####
112 *****descriptive*****
113 cls
114 use "db0", clear
115 describe, short
116
117 sum age0 sbp tchol la1c bmi egfr
118 drop if sbp == 0 /*12 patients*/
119 drop if bmi == 0 | bmi <10 | bmi >70 /*735 patients*/
120 drop if tchol>10 /*504 patients*/
121 drop if egfr>150 /*210 patients*/
122
123 mdesc age0 sex eth smk alc sbp tchol la1c bmi egfr imd
124 describe, short
125 egen float miss = rowmiss(age0 sex eth smk alc sbp tchol la1c bmi egfr imd) /*key variables for primary analysis - base model*/
126 tab miss
127 keep if miss == 0
128 drop miss
129 describe, short
130
131 forvalues k = 1/3 {
132     gen tbef`k' = -(hypodate`k' - studyentry)/(365.24/12)
133 }
134 distplot tbef1, xlabel(0(6)156, labsize(vsmall) grid) xtitle("Last hypoglycaemia before study entry (months)", size(small)) /*
135 */ ylabel(#10, angle(horizontal) format(%7.1f) labsize(vsmall)) ytitle("Probability", size(small)) legend(position(5) ring(0))
xsize(6.5) ysize(4.5)
136 graph save Graph "Results\distplot.gph", replace

```

```

137 graph close _all
138
139 tab N_hypo1, m
140 tab N_hypo2, m
141 tab N_hypo3, m
142 gen la1cm = (la1c - 2.15)*10.929
143
144 baselinetable          /*
145 */ age0(cts tab("p50 (p25-p75)")) /*
146 */ sex(cat)            /*
147 */ eth(cat)            /*
148 */ imd(cat)            /*
149 */ smk(cat)            /*
150 */ alc(cat)            /*
151 */ sbp(cts tab("p50 (p25-p75)")) /*
152 */ tchol(cts tab("p50 (p25-p75)")) /*
153 */ la1c(cts tab("p50 (p25-p75)")) /*
154 */ la1cm(cts tab("p50 (p25-p75)")) /*
155 */ bmi(cts tab("p50 (p25-p75)")) /*
156 */ egfr(cts tab("p50 (p25-p75)")) /*
157 */ metformin(cat)     /*
158 */ su(cat)            /*
159 */ insulin(cat)       /*
160 */ othergld(cat)      /*
161 */ mi0(cat)           /*
162 */ stroke0(cat)       /*
163 */ pad0(cat)          /*
164 */ hf0(cat)           /*
165 */ af0(cat)           /*
166 */ stat0(cat)         /*
167 */ asa0(cat)          /*
168 */ cancer0(cat)       /*
169 */ dall(cat)          /*
170 */ dcvd(cat)          /*
171 */ dtum(cat)          /*
172 */ dother(cat)        /*
173 */ , by(hypo1, totalcolumn) notable exportexcel("Results\table_1", replace)
174
175 drop la1cm
176
177 forvalues k = 0/1 {
178     preserve
179     contract cause if type == "other" & hypo1 == `k', freq(freq`k')
180     gsort -freq`k'
181     tempfile other`k'
182     save `other`k'', replace
183     restore

```

```

184 }
185 preserve
186 use `other0`, clear
187 merge 1:1 cause using `other1'
188 gsort -freq1 -freq0
189
190 forvalues k = 0/1 {
191     gen cum`k' = sum(freq`k')
192     egen float tot`k' = total(freq`k')
193     gen p`k' = freq`k'*100/tot`k', after(tot`k')
194     gen p_cum`k' = cum`k'*100/tot`k'
195 }
196 drop if p_cum0 >=75 /*no ties*/
197 forvalues k = 0/1 {
198     replace freq`k' = 0 if freq`k' == .
199     replace p`k' = 0 if p`k' == .
200 }
201 gen cruded = p1-p0
202 rename cause icd
203 drop _merge
204 merge 1:1 icd using "ICD10"
205 drop if _merge == 2
206 sort disease icd
207 replace disease = "Diarrhoea and gastroenteritis of presumed infectious origin" if icd == "A09.9"
208 replace disease = "Unspecified dementia" if icd == "F03"
209 replace disease = "Parkinson's disease" if icd == "G20"
210 replace disease = "Other secondary pulmonary hypertension" if icd == "I27.2"
211 replace disease = "Unspecified atrial fibrillation and atrial flutter" if icd == "I48.9"
212 replace disease = "Unspecified acute lower respiratory infection" if icd == "J22"
213 replace disease = "Bronchiectasis" if icd == "J47"
214 replace disease = "Esophagitis" if icd == "K20"
215 replace disease = "Indeterminate colitis" if icd == "K52.3"
216 replace disease = "Pyoderma gangrenosum" if icd == "L88"
217 replace disease = "Pressure ulcer" if icd == "L89"
218 replace disease = "Unspecified kidney failure" if icd == "N19"
219 replace disease = "Benign prostatic hyperplasia" if icd == "N40"
220
221 replace disease = "Senility" if icd == "R54"
222 replace disease = "Other ill-defined and unspecified causes of mortality" if icd == "R99"
223 save "Results\bars_other", replace
224 restore
225
226 foreach var of varlist age0 sbp tchol la1c bmi egfr {
227     gen ln_`var' = ln(`var')
228 }
229 #####

```

```

230 *****survival*****
231 cls
232 tab sex, m
233 sdecode sex, replace
234 replace sex = "0" if sex == "F"
235 replace sex = "1" if sex == "M"
236 destring sex, replace
237
238 tab eth, m
239 sdecode eth, replace
240 replace eth = "0" if eth == "White"
241 replace eth = "1" if eth == "nonWhite"
242 destring eth, replace
243
244 tab smk, m
245 sdecode smk, replace
246 replace smk = "0" if smk == "no"
247 replace smk = "1" if smk == "ex"
248 replace smk = "2" if smk == "yes"
249 destring smk, replace
250
251 tab alc, m
252 sdecode alc, replace
253 replace alc = "0" if alc == "no"
254 replace alc = "1" if alc == "ex"
255 replace alc = "2" if alc == "yes"
256 destring alc, replace
257
258 tab imd, m
259
260 foreach var of varlist smk alc imd {
261     tab `var', gen(`var')
262 }
263 save "db1", replace
264
265 *****Age-specific CC SURVIVAL at different times: stacked only, no CI*****
266
267 use "db1", clear
268 rcsgen age0, gen(age0s) orthog df(3)
269 global Kage `r(knots)'
270 matrix Mage = r(R)
271 foreach mod of varlist age0s* {
272     gen i_`mod' = `mod'*hypo1
273 }
274 foreach q in cvd tum other {
275     stset t`q', id(id) failure(d`q'==1)
276     stdescribe

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```

277     stsum
278     strate hypo1, per(1000)
279     stpm2 hypo1 age0s1 age0s2 age0s3 i_age0s1 i_age0s2 i_age0s3 sbp tchol la1c bmi egfr sex eth smk2 smk3 alc2 alc3 imd2-imd5, scale(h) df(4)

280     estimates store `q'
281 }
282
283 display "$S_TIME $S_DATE"
284 range tt 0 5 51
285 forvalues k = 50(10)80 {
286     preserve
287     rcsgen, scalar(`k') knots({Kage}) rmatrix(Mage) gen(v)
288     standsurv, crmodels(cvd tum other) cif timevar(tt) atvar(hno hyes) verbose /*
289     /* at1(hypo1 0 age0s1 `=v1' age0s2 `=v2' age0s3 `=v3' i_age0s1 0 i_age0s2 0 i_age0s3 0) /*
290     /* at2(hypo1 1 age0s1 `=v1' age0s2 `=v2' age0s3 `=v3' i_age0s1 `=v1' i_age0s2 `=v2' i_age0s3 `=v3')
291     keep tt hno* hyes*
292     drop if tt == .
293     gen age0 = `k'
294     tempfile r`k'
295     save `r`k'', replace
296     restore
297 }
298
299 display "$S_TIME $S_DATE"
300 preserve
301 clear
302 forvalues k = 50(10)80 {
303     append using `r`k''
304 }
305 gen hno_stack0 = hno_cvd
306 gen hno_stack1 = hno_cvd + hno_tum
307 gen hno_stack2 = hno_cvd + hno_tum + hno_other
308 gen hyes_stack0 = hyes_cvd
309 gen hyes_stack1 = hyes_cvd + hyes_tum
310 gen hyes_stack2 = hyes_cvd + hyes_tum + hyes_other
311 gen dif_stack0 = hyes_stack0 - hno_stack0
312 gen dif_stack1 = hyes_stack1 - hno_stack1
313 gen dif_stack2 = hyes_stack2 - hno_stack2
314 order age0, last
315 foreach var of varlist h* d* {
316     replace `var' = `var' * 100
317 }
318 save "Results\survage", replace
319 restore
320
321 *****Age-specific SURVIVAL at 5 years only: different CC models*****
322 use "db1", clear

```

```

323 gen t5 = 5 in 1
324 display "$S_TIME $S_DATE"
325
326 rcsgen age0, gen(age0s) orthog df(3)
327 global Kage `r(knots)'
328 matrix Mage = r(R)
329 foreach mod of varlist age0s* {
330     gen i_`mod' = `mod'*hypo1
331 }
332
333 *-----
334 ****base model CC - cpr*
335 foreach q in cvd tum other {
336     stset t`q', id(id) failure(d`q'==1)
337     stpm2 hypo1 age0s1 age0s2 age0s3 i_age0s1 i_age0s2 i_age0s3 sbp tchol la1c bmi egfr sex eth smk2 smk3 alc2 alc3 imd2-imd5, scale(h) df(4)
338
339     estimates store `q'
340 }
341 forvalues k = 50(10)80 {
342     preserve
343     rcsgen, scalar(`k') knots(`${Kage}') rmatrix(Mage) gen(v)
344     standsurv, crmodels(cvd tum other) cif timevar(t5) atvar(hno hyes) contrast(difference) contrastvar(dif) ci verbose /*
345     /* at1(hypo1 0 age0s1 `=v1' age0s2 `=v2' age0s3 `=v3' i_age0s1 0 i_age0s2 0 i_age0s3 0) /*
346     /* at2(hypo1 1 age0s1 `=v1' age0s2 `=v2' age0s3 `=v3' i_age0s1 `=v1' i_age0s2 `=v2' i_age0s3 `=v3')
347     keep t5 hno* hyes* dif*
348     drop if t5 == .
349     gen age0 = `k'
350     tempfile r`k'
351     save `r`k'', replace
352     restore
353 }
354 clear
355 forvalues k = 50(10)80 {
356     append using `r`k''
357 }
358 order age0, last
359 gen model = "baseCC"
360 save "Results\fplot_baseCC", replace
361 display "$S_TIME $S_DATE"
362
363 *-----
364 ****other covs model CC - cpr*
365 foreach q in cvd tum other {
366     stset t`q', id(id) failure(d`q'==1)
367     stpm2 hypo1 age0s1 age0s2 age0s3 i_age0s1 i_age0s2 i_age0s3 sbp tchol la1c bmi egfr sex eth smk2 smk3 alc2 alc3 imd2-imd5 /*
368     /* metformin su insulin othergld mi0 stroke0 pad0 hf0 af0 cancer0 stat0 asa0, scale(h) df(4)

```



```

369     estimates store `q'
370 }
371 forvalues k = 50(10)80 {
372     preserve
373     rcsgen, scalar(`k') knots({Kage}) rmatrix(Mage) gen(v)
374     standsurv, crmodels(cvd tum other) cif timevar(t5) atvar(hno hyes) contrast(difference) contrastvar(dif) ci verbose /*
375     */ at1(hypo1 0 age0s1 `=v1' age0s2 `=v2' age0s3 `=v3' i_age0s1 0 i_age0s2 0 i_age0s3 0) /*
376     */ at2(hypo1 1 age0s1 `=v1' age0s2 `=v2' age0s3 `=v3' i_age0s1 `=v1' i_age0s2 `=v2' i_age0s3 `=v3')
377     keep t5 hno* hyes* dif*
378     drop if t5 == .
379     gen age0 = `k'
380     tempfile r`k'
381     save `r`k'', replace
382     restore
383 }
384
385 clear
386 forvalues k = 50(10)80 {
387     append using `r`k''
388 }
389 order age0, last
390 gen model = "covsCC"
391 save "Results\fplot_covsCC", replace
392 display "$S_TIME $S_DATE"
393 restore
394 log close
395
396
397 #####
398 *****MULTIPLE IMPUTATIONS*****
399 #####
400
401 cap log close
402 log using "log_MImputation", replace
403
404 *databases and estimations*
405 cls
406 use "db0", clear
407 describe, short
408 mdesc age0 sex eth smk alc sbp tchol la1c bmi egfr imd /*
409 */ metformin su insulin othergld mi0 stroke0 pad0 hf0 af0 cancer0 stat0 asa0
410
411 drop if sbp == 0 /*12 patients*/
412 drop if bmi == 0 | bmi <10 | bmi >70 /*735 patients*/
413 drop if tchol>10 /*504 patients*/
414 drop if egfr>150 /*210 patients*/
415

```

```

416 mdesc age0 sex eth smk alc sbp tchol la1c bmi egfr imd /*
417 */      metformin su insulin othergld mi0 stroke0 pad0 hf0 af0 cancer0 stat0 asa0
418 describe, short
419
420 cls
421 tab sex, m
422 sdecode sex, replace
423 replace sex = "0" if sex == "F"
424 replace sex = "1" if sex == "M"
425 destring sex, replace
426 tab eth, m
427 sdecode eth, replace
428 replace eth = "0" if eth == "White"
429 replace eth = "1" if eth == "nonWhite"
430 destring eth, replace
431 tab smk, m
432 sdecode smk, replace
433 replace smk = "0" if smk == "no"
434 replace smk = "1" if smk == "ex"
435 replace smk = "2" if smk == "yes"
436 destring smk, replace
437 tab alc, m
438 sdecode alc, replace
439 replace alc = "0" if alc == "no"
440 replace alc = "1" if alc == "ex"
441 replace alc = "2" if alc == "yes"
442 destring alc, replace
443 tab imd, m
444
445 local u = 10          /*databases imputed*/
446
447 mi set mlong
448
449 mi register imputed eth smk alc sbp la1c imd          /* variables with missing data*/
450
451 mi register regular age0 sex tchol bmi egfr /*
452 */      metformin su insulin othergld mi0 stroke0 pad0 hf0 af0 cancer0 stat0 asa0 /* covariates included in the model without missing
+ outcomes
453 */      dcvd dtum dother tall hypo1          /* time is the same for all outcomes*/
454
455 mi impute chained (regress) sbp la1c (logit) eth (mlogit) smk alc imd =          /* covariates needed to be imputed
456 */      age0 sex tchol bmi egfr          /* all other covariates
457 */      metformin su insulin othergld mi0 stroke0 pad0 hf0 af0 cancer0 stat0 asa0 /*
458 */      dcvd dtum dother tall hypo1, add(`u')          /* seed not defined as already defined above*/
459
460 foreach var of varlist smk alc imd {
461     tab `var', gen(`var')

```

```

462 }
463
464 forvalues j = 1/\`u' {
465     display "$S_TIME  $S_DATE -- database MI: `j'"
466
467     preserve
468     *single dataset
469     mi extract `j', clear
470
471     *make spline & interactions
472     rcsgen age0, gen(age0s) orthog df(3)
473     global Kage `r(knots)'
474     matrix Mage = r(R)
475     foreach mod of varlist age0s* {
476         gen i_`mod' = `mod'*hypo1
477     }
478
479     *cmprisk - coeffs
480     foreach q in cvd tum other {
481         stset t`q', id(id) failure(d`q'==1)
482         stpm2 hypo1 age0s1 age0s2 age0s3 i_age0s1 i_age0s2 i_age0s3 sbp tchol la1c bmi egfr sex eth smk2 smk3 alc2 alc3 imd2-imd5 /*
483         */      metformin su insulin othergld mi0 stroke0 pad0 hf0 af0 cancer0 stat0 asa0, scale(h) df(4)
484         estimates store `q'
485     }
486
487     *cmprisk - standsurv
488     gen t5 = 5 in 1
489     forvalues k = 50(10)80 {
490         rcsgen, scalar(`k') knots(`${Kage}`) rmatrix(Mage) gen(v)
491         standsurv, crmodels(cvd tum other) cif timevar(t5) atvar(hno hyes) contrast(difference) contrastvar(dif) se ci verbose /*
492         */      at1(hypo1 0 age0s1 `=v1' age0s2 `=v2' age0s3 `=v3' i_age0s1 0      i_age0s2 0      i_age0s3 0) /*
493         */      at2(hypo1 1 age0s1 `=v1' age0s2 `=v2' age0s3 `=v3' i_age0s1 `=v1' i_age0s2 `=v2' i_age0s3 `=v3')
494         gen age = `k' in 1
495         gen db  = `j' in 1
496         tempfile c`k'_`j'
497         save `c`k'_`j'', replace
498         drop hno* hyes* dif* age db
499     }
500
501     *all death - coeffs
502     stset tall, id(id) failure(dall==1)
503     stpm2 hypo1 age0s1 age0s2 age0s3 i_age0s1 i_age0s2 i_age0s3 sbp tchol la1c bmi egfr sex eth smk2 smk3 alc2 alc3 imd2-imd5 /*
504     */      metformin su insulin othergld mi0 stroke0 pad0 hf0 af0 cancer0 stat0 asa0, scale(h) df(4)
505
506     *all death - standsurv
507     forvalues k = 50(10)80 {
508         rcsgen, scalar(`k') knots(`${Kage}`) rmatrix(Mage) gen(v)

```

```

509     standsurv, timevar(t5) atvar(hno_all hyes_all) contrast(difference) contrastvar(dif_all) ci se verbose /*
510     */ at1(hypo1 0 age0s1 `=v1' age0s2 `=v2' age0s3 `=v3' i_age0s1 0 i_age0s2 0 i_age0s3 0) /*
511     */ at2(hypo1 1 age0s1 `=v1' age0s2 `=v2' age0s3 `=v3' i_age0s1 `=v1' i_age0s2 `=v2' i_age0s3 `=v3')
512     gen age = `k' in 1
513     gen db = `j' in 1
514     tempfile a`k'`j'
515     save `a`k'`j'', replace
516     drop hno* hyes* dif* age db
517 }
518 restore
519 }
520
521 clear
522 tempfile cmpr
523 forvalues k = 50(10)80 {
524     forvalues j = 1/`u' {
525         append using `c`k'`j''
526     }
527 }
528 keep t5 hno* hyes* dif* age db
529 drop if t5 == .
530 save `cmpr', replace
531
532 clear
533 tempfile alld
534 forvalues k = 50(10)80 {
535     forvalues j = 1/`u' {
536         append using `a`k'`j''
537     }
538 }
539 keep t5 hno* hyes* dif* age db
540 drop if t5 == .
541 merge 1:1 db age using `cmpr'
542 drop _merge
543 order t5 db age, first
544 drop t5
545 display "$S_TIME $S_DATE"
546 save "Results\MI", replace
547 log close
548
549 use "Results\MI", clear
550 keep db age dif*
551 drop *_lci *_uci
552 foreach var of varlist dif_all - dif_other_se {
553     replace `var' = `var' * 100
554 }
555 replace dif_all = -dif_all /*for all-cause the estimate is survival, for cause-specific is cif*/

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556 foreach k in all cvd tum other {
557     rename dif_`k' `k'
558     rename dif_`k'_se `k'_se
559 }
560 sort age db
561
562 preserve
563 clear
564 tempfile mim
565 save `mim', emptyok replace
566 restore
567
568 forvalues k = 50(10)80 {
569     foreach e in all cvd tum other {
570         preserve
571         keep if age == `k'
572         local m = _N
573         di `m'                                /*This is Rubin's rule on the survival difference*/
574         keep age `e' `e'_se
575         egen q = mean(`e')
576         gen u1 = `e'_se^2
577         egen u = mean(u1)
578         gen b1 = (`e'-q)^2
579         egen b2 = total(b1)
580         gen b = b2/(`m'-1)
581         gen t = u + b*(1+1/`m')
582         gen se = t^0.5
583         keep in 1
584         keep age q se
585         gen lb = q - 1.96*se
586         gen ub = q + 1.96*se
587         rename q es
588         gen end = "`e'"
589         append using `mim'
590         save `mim', replace
591         restore
592     }
593 }
594 use `mim', clear
595 sort end age
596 gen s = 1 if end == "cvd"
597 replace s = 2 if end == "tum"
598 replace s = 3 if end == "other"
599 replace s = 4 if end == "all"
600 sort s age
601 foreach var of varlist es lb ub {
602     tostring `var', replace format(%7.1f) force

```

```

603 }
604 gen dif = es + " (" + lb + ", " + ub + ")"
605 keep age end dif
606 reshape wide dif, i(age) j(end) string
607 order age difcvd diftum difother difall
608 export excel using "Results\MI_results.xls", firstrow(variables) replace
609
610
611 #####
612 *****GRAPHS*****
613 #####
614
615 ****BARS
616 cd "..."
617 use "Results\bars_other", clear
618 set scheme s2color
619 distinct disease
620 duplicates tag disease, generate(dupdis)
621 replace disease = disease + " (" + icd + ")" if dupdis == 2
622 replace disease = "COPD with acute exacerbation, unspec" if disease == "Chron obstruct pulmonary dis with acute exacerbation, unspec"
623 replace disease = "COPD with acute lower resp infec" if disease == "Chronic obstruct pulmonary dis with acute lower resp infec"
624 replace disease = "COPD unspecified" if disease == "Chronic obstructive pulmonary disease, unspecified"
625 replace disease = "IDDM with renal complications" if disease == "Insulin-dependent diabetes mellitus with renal complications"
626 replace disease = "NIDDM without complications" if disease == "Non-insulin-depend diabetes mellitus without complication"
627 replace disease = "NIDDM with multiple complications" if disease == "Non-insulin-dependent diabetes mellitus with multiple comps"
628 replace disease = "NIDDM with renal complications" if disease == "Non-insulin-dependent diabetes mellitus with renal comps"
629 replace disease = "UDM with ketoacidosis" if disease == "Unspecified diabetes mellitus with ketoacidosis"
630 replace disease = "UDM with multiple complications" if disease == "Unspecified diabetes mellitus with multiple complications"
631 replace disease = "UDM with renal complications" if disease == "Unspecified diabetes mellitus with renal complications"
632 replace disease = "UDM without complications" if disease == "Unspecified diabetes mellitus without complications"
633 graph hbar (asis) p0 p1, over(disease, sort(cruded) label(labsize(tiny))) /*
634 */ bar(1, fcolor(forest_green) lcolor(forest_green) lwidth(none)) bar(2, fcolor(red) lcolor(red) lwidth(none)) /*
635 */ xsize(9) ysize(8) legend(order(1 "No hypoglycaemia" 2 "Hypoglycaemia") symysize(*0.5) symxsize(*0.5) cols(1) colgap(small) size(vsmall) /*
636 */ region(fcolor(none) lwidth(none)) position(5) ring(0)) ylabel(0(1)12, labsize(small)) ytitle("Other causes of death (%)")
637 graph save Graph "Results\bars_other.gph", replace
638 graph close _all
639
640 ****SURVAGE
641 use "Results\savage", clear
642 set scheme plottig
643 twoway (area hno_stack0 tt, fcolor(green%30) lcolor(green) lwidth(none)) /*
644 */ (line hno_stack0 tt, lcolor(green) lpattern(solid)) /*
645 */ (rarea hno_stack1 hno_stack0 tt, fcolor(green%50) lcolor(green) lwidth(none)) /*
646 */ (line hno_stack1 tt, lcolor(green) lpattern(solid)) /*
647 */ (rarea hno_stack2 hno_stack1 tt, fcolor(green%70) lcolor(green) lwidth(none)) /*
648 */ (line hno_stack2 tt, lcolor(green) lpattern(solid)), /*
649 */ xlabel(#5, grid labsize(small)) by(, legend(off) note("")) subtitle(, size(small)) ylabel(0(10)50, angle(h) labsize(small)) xsize(2)

```

```

ysize(7) xtitle("") by(age0, cols(4)) name(st_no, replace) nodraw
650 twoway (area hyes_stack0 tt, fcolor(red%30) lcolor(red) lwidth(none)) /*
651 */ (line hyes_stack0 tt, lcolor(red) lpattern(solid)) /*
652 */ (rarea hyes_stack1 hyes_stack0 tt, fcolor(red%50) lcolor(red) lwidth(none)) /*
653 */ (line hyes_stack1 tt, lcolor(red) lpattern(solid)) /*
654 */ (rarea hyes_stack2 hyes_stack1 tt, fcolor(red%70) lcolor(red) lwidth(none)) /*
655 */ (line hyes_stack2 tt, lcolor(red) lpattern(solid)), /*
656 */ xlabel(#5, grid labsize(small)) by(, legend(off) note("")) subtitle(, size(small)) ylabel(0(10)50, angle(h) labsize(small)) xsize(2)
ysize(7) xtitle("") by(age0, cols(4)) name(st_yes, replace) nodraw
657 twoway (area dif_stack0 tt, fcolor(blue%30) lcolor(blue) lwidth(none)) /*
658 */ (line dif_stack0 tt, lcolor(blue) lpattern(solid)) /*
659 */ (rarea dif_stack1 dif_stack0 tt, fcolor(blue%50) lcolor(blue) lwidth(none)) /*
660 */ (line dif_stack1 tt, lcolor(blue) lpattern(solid)) /*
661 */ (rarea dif_stack2 dif_stack1 tt, fcolor(blue%70) lcolor(blue) lwidth(none)) /*
662 */ (line dif_stack2 tt, lcolor(blue) lpattern(solid)), /*
663 */ xlabel(#5, grid labsize(small)) by(, legend(off) note("")) subtitle(, size(small)) ylabel(0(10)50, angle(h) labsize(small)) xsize(2)
ysize(7) xtitle("") by(age0, cols(4)) name(st_dif, replace) nodraw
664 graph combine st_no st_yes st_dif, ycommon rows(4) xsize(6.5) ysize(6) nocopies
665 graph save Graph "Results\savage.gph", replace
666 graph close _all
667
668
669 ****GRADIENT FOREST PLOT
670 use "Results\fplot_baseCC", clear
671 append using "Results\fplot_covsCC"
672 drop t5
673 order model age0, first
674
675 foreach e in dif_cvd dif_tum dif_other {
676     replace `e' = -`e' /*model for all estimate the difference for survival while in cmprisk is the difference in cif*/
677 }
678 foreach e in dif_cvd dif_tum dif_other {
679     renames `e'_lci \ `e'_1
680     renames `e'_uci \ `e'_2
681 }
682 foreach e in dif_cvd dif_tum dif_other {
683     renames `e'_1 \ `e'_uci
684     renames `e'_2 \ `e'_lci
685 }
686
687 *Difference - normal scale
688 qui {
689     foreach m in baseCC covsCC {
690         forvalues a = 50(10)80 {
691             foreach e in dif_cvd dif_tum dif_other dif_all {
692                 preserve
693                 keep model age0 `e'*

```

```

694         keep if age0 == `a'
695         keep if model == "`m'"
696         drop model age0
697         gen se = (`e'_uci - `e'_lci)/3.92
698         forvalues k = 1(1)95 {
699             gen lb`k' = `e' - invnorm(1-(100-`k')/200)*se
700             gen ub`k' = `e' + invnorm(1-(100-`k')/200)*se
701         }
702         rename `e' es
703         keep es lb* ub*
704         foreach var of varlist * {
705             replace `var' = 100*`var'
706         }
707         gen p = "`e'_`a'"
708         reshape long lb ub, i(p) j(ci)
709         rename lb bl
710         rename ub bu
711         reshape long b, i(ci) j(conf) string
712         gen seq = _n
713         replace es = . if seq !=1
714         gen m = "`m'"
715         tempfile `m'`e'`a'
716         save ``m'`e'`a'', replace
717         restore
718     }
719 }
720 }
721 }
722
723 preserve
724 clear
725 foreach m in baseCC covsCC {
726     forvalues a = 50(10)80 {
727         foreach e in dif_cvd dif_tum dif_other dif_all {
728             append using ``m'`e'`a''
729         }
730     }
731 }
732 sum b
733
734 split p, p(_)
735 gen m1 = "0" if m == "baseCC"
736 replace m1 = "1" if m == "covsCC"
737 gen g = m1+p2+p3
738 gen t = 1 if p2 == "cvd"
739 replace t = 2 if p2 == "tum"
740 replace t = 3 if p2 == "other"

```



```

741 replace t = 4 if p2 == "all"
742 sort t p3 ci m
743 destring p3, gen(age)
744 replace age = age + 1.5 if m == "covsCC"
745 sencode p, replace
746 sencode m, replace
747 sencode p2, replace
748 replace es = -es /*to be consistent with graph of cumulative incidence above*/
749 replace b = -b
750 save "Results\covs", replace
751
752 *graph*
753 set scheme s2color
754 *set scheme plottig
755 local sug ""
756 local sag ""
757 local sup ""
758 local sap ""
759 forvalues k = 1/95 {
760     local i = (95-`k')/100
761     local sug "`sug' (scatter b age if m == 1 & ci == `k', msymbol(square) msize(small) mcolor(blue*`i') mlwidth(none))"
762     local sag "`sag' (scatter b age if m == 2 & ci == `k', msymbol(square) msize(small) mcolor(orange*`i') mlwidth(none))"
763     local sup "`sup' (scatter es age if m == 1, msymbol(circle) msize(small) mcolor(white) mlwidth(thin) mlcolor(black))"
764     local sap "`sap' (scatter es age if m == 2, msymbol(circle) msize(small) mcolor(white) mlwidth(thin) mlcolor(black))"
765 }
766 twoway `sug' `sag' `sup' `sap', by(, legend(off)) by(p2, cols(4) note("")) subtitle(, size(small)) /*
767 */ ylabel(30(-5)-10, labsize(small) angle(horizontal)) xlabel(, labsize(small)) xtitle("") xsize(6.5) ysize(2) scale(1.3) yline(0, lwidth(
768 vthin) lcolor(black) lpattern(solid))
769 graph save Graph "Results\covs.gph", replace
770 graph close _all
771 restore
772
773 #####
774 *****SENSITIVITY - TIME FROM HYPO*****
775 #####
776 cls
777 use "db1", clear
778 rcsgen age0, gen(age0s) orthog df(3)
779
780 foreach mod of varlist age0s* {
781     gen i_`mod' = `mod'*hypo1
782 }
783
784 replace tbef1 = 0 if hypo1 == 0
785 qladder tbef1
786 graph close _all

```

```

787
788 preserve
789 clear
790 tempfile res
791 save `res', emptyok replace
792 restore
793
794 foreach q in cvd tum other {
795     preserve
796     stset t`q', id(id) failure(d`q'==1)
797     stpm2 hypo1 age0s1 age0s2 age0s3 i_age0s1 i_age0s2 i_age0s3 sbp tchol la1c bmi egfr sex eth smk2 smk3 alc2 alc3 imd2-imd5, scale(h) df(4)
798     parmes, fast
799     gen outcome = "`q'"
800     gen model   = "base"
801     append using `res'
802     save `res', replace
803     restore
804     preserve
805     stset t`q', id(id) failure(d`q'==1)
806     stpm2 hypo1 age0s1 age0s2 age0s3 i_age0s1 i_age0s2 i_age0s3 sbp tchol la1c bmi egfr sex eth smk2 smk3 alc2 alc3 imd2-imd5 tbef1, scale(h)
807     df(4)
808     parmes, fast
809     gen outcome = "`q'"
810     gen model   = "timebefore"
811     append using `res'
812     save `res', replace
813     restore
814 }
815 use `res', clear
816 keep if (parm == "hypo1" | parm == "tbef1")
817 sort outcome model
818
819 gen hr = exp(estimate)
820 gen lb = exp(min95)
821 gen ub = exp(max95)
822 foreach var of varlist hr lb ub {
823     tostring `var', format(%7.2f) replace force
824 }
825 gen es = hr + " (" + lb + ", " + ub + ")"
826 export excel using "Results\timebefore.xls", firstrow(variables) replace
827
828 #####
829 *****SUMMARY RESULTS TABLE*****
830 #####
831 cls
832 use "Results\covs.dta", clear

```

```

833 keep if (ci == 1 | ci == 95)
834 sort p2 p3 m seq
835 by g, sort : egen float lb = min(b)
836 by g, sort : egen float ub = max(b)
837 sort p2 p3 m seq
838 drop if es == .
839 keep p es m lb ub
840 foreach var of varlist es lb ub {
841     tostring `var', replace force format(%7.1f)
842 }
843 gen dif = es + " (" + lb + ", " + ub + ")"
844 drop es lb ub
845 sdecode p, replace
846 split p, parse(_)
847 rename p2 out
848 keep m dif p3 out
849 rename p3 age
850 sdecode m, replace
851 sort m out age
852 gen c = m + "_" + age
853 drop age m
854 reshape wide dif, i(c) j(out) string
855 split c, parse(_)
856 rename c2 age
857 destring age, replace
858 sort age c1
859 order age c1 difc dift difo difa
860 rename c1 model
861 drop c
862
863 preserve
864 import excel "Results\MI_results.xls", sheet("Sheet1") firstrow clear
865 gen model = "mi"
866 tempfile mi
867 save `mi', replace
868 restore
869
870 append using `mi'
871 sort age model
872 export excel using "Results\compare_results.xls", firstrow(variables) replace
873
874
875
876
877 *****
878 *****
879 * R E V I S I O N --- R1 *

```

```

880 *****
881 *****
882
883 display "$S_TIME $S_DATE"
884 set seed 987654321
885
886 #####
887 *****MULTIPLE IMPUTATIONS R1*****
888 #####
889
890 *databases and estimations*
891 cls
892 use "db0", clear
893 describe, short
894 mdesc age0 sex eth smk alc sbp tchol la1c bmi egfr imd /*
895 */      metformin su insulin othergld mi0 stroke0 pad0 hf0 af0 cancer0 stat0 asa0
896
897 drop if sbp == 0                /*12 patients*/
898 drop if bmi == 0 | bmi <10 | bmi >70 /*735 patients*/
899 drop if tchol>10                /*504 patients*/
900 drop if egfr>150                /*210 patients*/
901
902 mdesc age0 sex eth smk alc sbp tchol la1c bmi egfr imd /*
903 */      metformin su insulin othergld mi0 stroke0 pad0 hf0 af0 cancer0 stat0 asa0
904 describe, short
905
906 cls
907 tab sex, m
908 sdecode sex, replace
909 replace sex = "0" if sex == "F"
910 replace sex = "1" if sex == "M"
911 destring sex, replace
912 tab eth, m
913 sdecode eth, replace
914 replace eth = "0" if eth == "White"
915 replace eth = "1" if eth == "nonWhite"
916 destring eth, replace
917 tab smk, m
918 sdecode smk, replace
919 replace smk = "0" if smk == "no"
920 replace smk = "1" if smk == "ex"
921 replace smk = "2" if smk == "yes"
922 destring smk, replace
923 tab alc, m
924 sdecode alc, replace
925 replace alc = "0" if alc == "no"
926 replace alc = "1" if alc == "ex"

```

```

927 replace alc = "2" if alc == "yes"
928 destring alc, replace
929 tab imd, m
930
931 local u = 50          /*databases imputed*/
932
933 mi set mlong
934
935 mi register imputed eth smk alc sbp la1c imd          /* variables with missing data*/
936
937 mi register regular age0 sex tchol bmi egfr /*
938 */      metformin su insulin othergld mi0 stroke0 pad0 hf0 af0 cancer0 stat0 asa0 /* covariates included in the model without missing
+ outcomes
939 */      dcvd dtum dother tall hypo1          /* time is the same for all outcomes*/
940
941 mi impute chained (regress) sbp la1c (logit) eth (mlogit) smk alc imd =          /* covariates needed to be imputed
942 */      age0 sex tchol bmi egfr          /* all other covariates
943 */      metformin su insulin othergld mi0 stroke0 pad0 hf0 af0 cancer0 stat0 asa0 /*
944 */      dcvd dtum dother tall hypo1, add(`u')          /* seed not defined as already defined above*/
945
946 foreach var of varlist smk alc imd {
947     tab `var', gen(`var')
948 }
949
950 forvalues j = 1/`u' {
951     display "$S_TIME $S_DATE -- database MI: `j'"
952
953     preserve
954     *single dataset
955     mi extract `j', clear
956
957     *make spline & interactions
958     rcsgen age0, gen(age0s) orthog df(3)
959     global Kage `r(knots)'
960     matrix Mage = r(R)
961     foreach mod of varlist age0s* {
962         gen i_`mod' = `mod'*hypo1
963     }
964
965     *cmprisk - coeffs
966     foreach q in cvd tum other {
967         stset t`q', id(id) failure(d`q'==1)
968         stpm2 hypo1 age0s1 age0s2 age0s3 i_age0s1 i_age0s2 i_age0s3 sbp tchol la1c bmi egfr sex eth smk2 smk3 alc2 alc3 imd2-imd5 /*
969 */      metformin su insulin othergld mi0 stroke0 pad0 hf0 af0 cancer0 stat0 asa0, scale(h) df(4)
970         estimates store `q'
971     }
972

```

```

973 *cmprisk - standsurv
974 gen t5 = 5 in 1
975 forvalues k = 50(10)80 {
976     rcsgen, scalar(`k') knots(`${Kage}`) rmatrix(Mage) gen(v)
977     standsurv, crmodels(cvd tum other) cif timevar(t5) atvar(hno hyes) contrast(difference) contrastvar(dif) se ci verbose /*
978     */ at1(hypo1 0 age0s1 `=v1' age0s2 `=v2' age0s3 `=v3' i_age0s1 0 i_age0s2 0 i_age0s3 0) /*
979     */ at2(hypo1 1 age0s1 `=v1' age0s2 `=v2' age0s3 `=v3' i_age0s1 `=v1' i_age0s2 `=v2' i_age0s3 `=v3')
980     gen age = `k' in 1
981     gen db = `j' in 1
982     tempfile c`k'`j'
983     save `c`k'`j'', replace
984     drop hno* hyes* dif* age db
985 }
986
987 *all death - coeffs
988 stset tall, id(id) failure(dall==1)
989 stpm2 hypo1 age0s1 age0s2 age0s3 i_age0s1 i_age0s2 i_age0s3 sbp tchol la1c bmi egfr sex eth smk2 smk3 alc2 alc3 imd2-imd5 /*
990 */ metformin su insulin othergld mi0 stroke0 pad0 hf0 af0 cancer0 stat0 asa0, scale(h) df(4)
991
992 *all death - standsurv
993 forvalues k = 50(10)80 {
994     rcsgen, scalar(`k') knots(`${Kage}`) rmatrix(Mage) gen(v)
995     standsurv, timevar(t5) atvar(hno_all hyes_all) contrast(difference) contrastvar(dif_all) ci se verbose /*
996     */ at1(hypo1 0 age0s1 `=v1' age0s2 `=v2' age0s3 `=v3' i_age0s1 0 i_age0s2 0 i_age0s3 0) /*
997     */ at2(hypo1 1 age0s1 `=v1' age0s2 `=v2' age0s3 `=v3' i_age0s1 `=v1' i_age0s2 `=v2' i_age0s3 `=v3')
998     gen age = `k' in 1
999     gen db = `j' in 1
1000     tempfile a`k'`j'
1001     save `a`k'`j'', replace
1002     drop hno* hyes* dif* age db
1003 }
1004 restore
1005 }
1006
1007 clear
1008 tempfile cmpr
1009 forvalues k = 50(10)80 {
1010     forvalues j = 1/`u' {
1011         append using `c`k'`j''
1012     }
1013 }
1014 keep t5 hno* hyes* dif* age db
1015 drop if t5 == .
1016 save `cmpr', replace
1017
1018 clear
1019 tempfile alld

```

```

1020   forvalues k = 50(10)80 {
1021       forvalues j = 1/`u' {
1022           append using `a`k'_'j''
1023       }
1024   }
1025   keep t5 hno* hyes* dif* age db
1026   drop if t5 == .
1027   merge 1:1 db age using `cmpr'
1028   drop _merge
1029   order t5 db age, first
1030   drop t5
1031
1032   keep db age dif*
1033   drop *_lci *_uci
1034   foreach var of varlist dif_all - dif_other_se {
1035       replace `var' = `var' * 100
1036   }
1037   replace dif_all = -dif_all           /*for all-cause the estimate is survival, for cause-specific is cif*/
1038   foreach k in all cvd tum other {
1039       rename dif_`k' `k'
1040       rename dif_`k'_se `k'_se
1041   }
1042   sort age db
1043
1044   preserve
1045   clear
1046   tempfile mim
1047   save `mim', emptyok replace
1048   restore
1049
1050   forvalues k = 50(10)80 {
1051       foreach e in all cvd tum other {
1052           preserve
1053           keep if age == `k'
1054           local m = _N
1055           di `m'           /*This is Rubin's rule on the survival difference*/
1056           keep age `e' `e'_se
1057           egen q = mean(`e')
1058           gen u1 = `e'_se^2
1059           egen u = mean(u1)
1060           gen b1 = (`e'-q)^2
1061           egen b2 = total(b1)
1062           gen b = b2/(`m'-1)
1063           gen t = u + b*(1+1/`m')
1064           gen se = t^0.5
1065           keep in 1
1066           keep age q se

```

```

1067         gen lb = q - 1.96*se
1068         gen ub = q + 1.96*se
1069         rename q es
1070         gen end = "`e'"
1071         append using `mim'
1072         save `mim', replace
1073         restore
1074     }
1075 }
1076 use `mim', clear
1077 sort end age
1078 gen s = 1 if end == "cvd"
1079 replace s = 2 if end == "tum"
1080 replace s = 3 if end == "other"
1081 replace s = 4 if end == "all"
1082 sort s age
1083 foreach var of varlist es lb ub {
1084     tostring `var', replace format(%7.1f) force
1085 }
1086 gen dif = es + " (" + lb + ", " + ub + ")"
1087 keep age end dif
1088 reshape wide dif, i(age) j(end) string
1089 order age difcvd diftum difother difall
1090 export excel using "MI_results_r1.xls", firstrow(variables) replace
1091 display "$S_TIME $S_DATE"
1092
1093
1094 /*****
1095 /*INSULIN AND SU CAUSE-SPECIFIC HAZARD RATIO - COMPLETE CASE*/
1096
1097 cls
1098 use "db1", clear
1099
1100 rcsgen age0, gen(age0s) orthog df(3)
1101 global Kage `r(knots)'
1102 matrix Mage = r(R)
1103 foreach mod of varlist age0s* {
1104     gen i_`mod' = `mod'*hypo1
1105 }
1106
1107 preserve
1108 clear
1109 tempfile hrs
1110 save `hrs', emptyok replace
1111 restore
1112

```



```
1113 foreach q in cvd tum other {
1114     stset t`q', id(id) failure(d`q'==1)
1115     stpm2 hypo1 age0s1 age0s2 age0s3 i_age0s1 i_age0s2 i_age0s3 sbp tchol la1c bmi egfr sex eth smk2 smk3 alc2 alc3 imd2-imd5 /*
1116     */ metformin su insulin othergld mi0 stroke0 pad0 hf0 af0 cancer0 stat0 asa0, scale(h) df(4)
1117     preserve
1118     parmes, fast
1119     gen outcome = "`q'"
1120     append using `hrs'
1121     save `hrs', replace
1122     restore
1123 }
1124
1125 use `hrs', clear
1126 keep if parm == "insulin" | parm == "su"
1127 keep parm estimate min95 max95 outcome
1128 foreach var of varlist estimate-max95 {
1129     gen `var'_exp = exp(`var')
1130     tostring `var'_exp, format(%7.2f) force replace
1131 }
1132 export excel using "hrs_r1.xls", firstrow(variables) replace
```