
Time-adjusted effect of socioeconomic status in mortality rates after brain injury: cohort study

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Time-adjusted effect of socioeconomic status in mortality rates after brain injury: cohort study

Document version

Version	Alterations
01	Initial version

1 ABBREVIATIONS

- FIM: Functional Independence Measure
- HR: hazards ratio
- SD: standard deviation
- SES: socioeconomic status

2 CONTEXT

This analysis expands on a previous analysis with a similar objective (**SAR-2023-004-BH-v02**), by employing more flexible modeling strategies to include time-dependent covariates that were dropped from the previous analysis. In the process the raw FIM scores were substituted by their quartiles.

2.1 Objectives

To determine the effect of socioeconomic status of the neighborhood on mortality of patients with brain injury, accounting for time-dependent covariates.

3 METHODS

The data procedures, design and analysis methods used in this report are fully described in the annex document **SAP-2023-016-BH-v01**.

This analysis was performed using statistical software R version 4.3.0.

4 RESULTS

4.1 Study population and follow up

There initially were 76,665 observations on 19,303 study participants considered for inclusion. After excluding follow up measurements during the COVID-19 pandemic to mitigate confounding on mortality causes there were 69,440 observations left in the study sample. After applying the inclusion criteria for the study period between 2010-01-01 and 2018-12-31 and considering the status at the last available follow up time for each individual a total of 7,414 participants were included in the analysis.

The epidemiological profile of the participant included in the study was a male participant (417 (74%)) with an average (SD) age of 43 (20) years.

Races were not homogeneously available in the study population with 315 (56%) individuals being white; 288 (52%) were single (never married) at the time of injury, and most participants were well educated with 208 (38%) at greater than high school level. A total of 334 (60%) were employed and 287 (53%) participants lived in an urban area.

Table 1 Epidemiological, demographic and clinical characteristics of study participants at the time of discharge.

Characteristic	N = 564
SES quintiles, n (%)	
Prosperous	69 (15%)
Comfortable	88 (19%)
Mid-Tier	97 (21%)
At-Risk	119 (26%)
Distressed	91 (20%)
Missing	100
Sex, n (%)	
Male	417 (74%)

Statistical Analysis Report (SAR)

Characteristic	N = 564
Female	146 (26%)
Missing	1
What is your race?, n (%)	
White	315 (56%)
Black	97 (17%)
Hispanic	120 (21%)
Other	30 (5.3%)
Missing	2
What is your marital status?, n (%)	
Single (Never Married)	288 (52%)
Married	153 (27%)
Divorced	65 (12%)
Separated	20 (3.6%)
Widowed	31 (5.5%)
Other	2 (0.4%)
Missing	5
Age at Injury, Mean (SD)	
Missing	2

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Characteristic	N = 564
Substance Problem Use, n (%)	228 (43%)
Missing	33
Education, n (%)	
Greater Than High School	208 (38%)
Less Than High School	142 (26%)
High School/GED	204 (37%)
Missing	10
At time of injury, what was your employment status?, n (%)	
Employed	334 (60%)
Unemployed	76 (14%)
Other	146 (26%)
Missing	8
Urbanization based on zip code of address at discharge., n (%)	
Suburban	145 (27%)
Rural	107 (20%)
Urban	287 (53%)
Missing	25
Prior to this injury, has a physician ever told you that you have a seizure disorder?, n (%)	7 (6.0%)

Statistical Analysis Report (SAR)

Characteristic	N = 564
Missing	447
Spinal cord injury, n (%)	22 (3.9%)
Missing	4
Cause of injury, n (%)	
Vehicular	266 (48%)
Violence	59 (11%)
Falls	171 (31%)
Other	64 (11%)
Missing	4
Primary rehabilitation payor, n (%)	
Private Insurance	237 (42%)
Public Insurance	235 (42%)
Other	90 (16%)
Missing	2
Residence after rehab discharge, n (%)	
Private Residence	441 (80%)
Other	112 (20%)
Missing	11

Statistical Analysis Report (SAR)

Characteristic	N = 564
Days From Injury to Rehab Discharge, Mean (SD)	41 (28)
FIM Motor at Discharge quartiles, n (%)	
Q1	110 (20%)
Q2	150 (27%)
Q3	139 (25%)
Q4	150 (27%)
Missing	15
FIM Cognitive at Discharge quartiles, n (%)	
Q1	143 (26%)
Q2	143 (26%)
Q3	120 (22%)
Q4	149 (27%)
Missing	9

The observed overall mortality was 13.5% in the study period. The distribution of cases appear homogeneous across SES quintiles (Figure 1), ranging from 10.6% to 13.5%. We will test the effect of SES quintiles on the hazard rate in the next section. See also Figure A2 in the appendix for the distribution of sexes in each SES quintile in the study population.

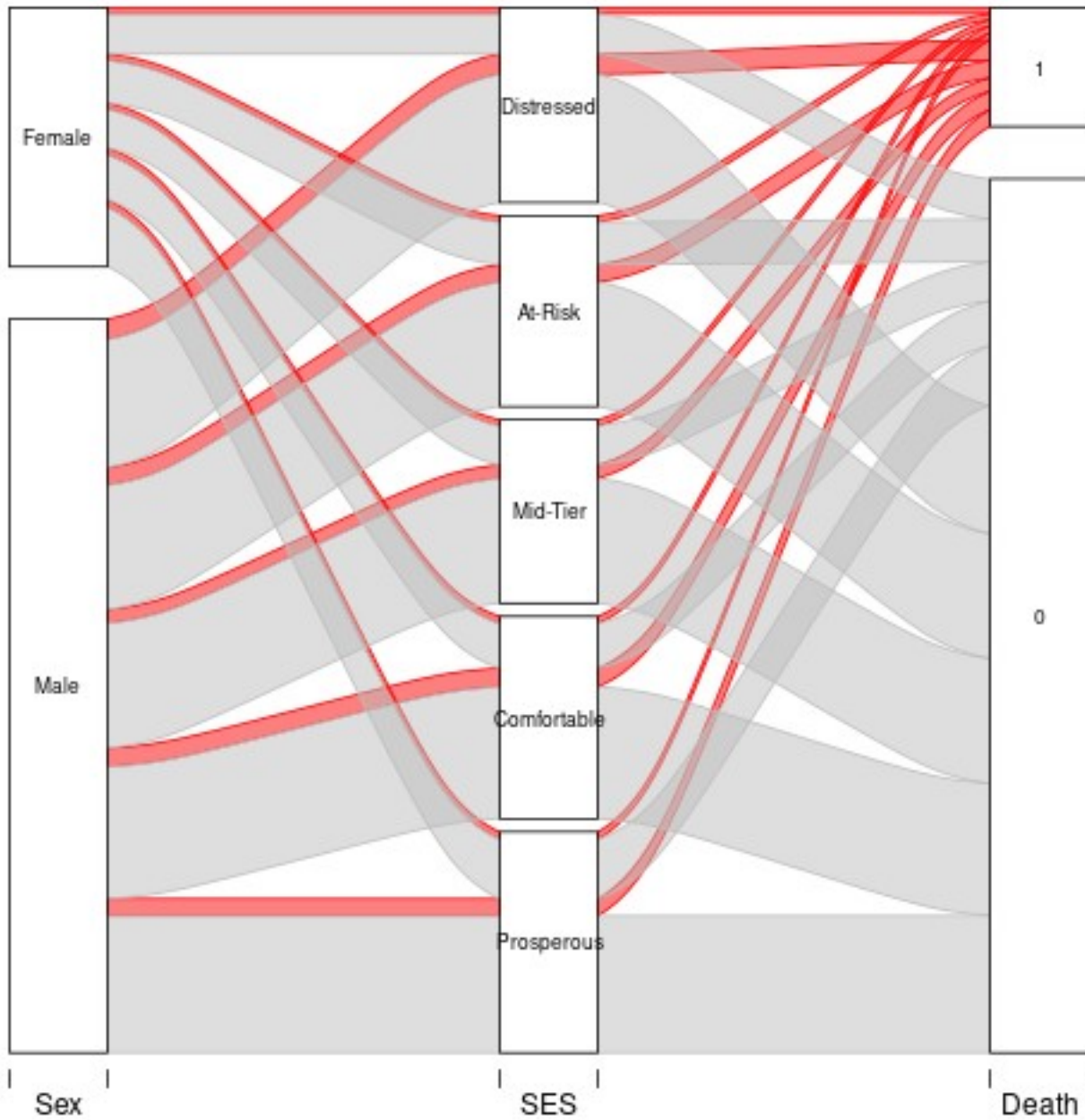


Figure 1 Proportion of cases per SES quintiles.

4.2 Time-adjusted effect of SES on mortality

Following the findings of **SAR-2023-017-BH-v01** the multiple observations per individual should be favored where the time-varying SES exposure allows the full model specification in this analytical plan to be used. This analysis, however includes an additional model with interactions between the two FIM scores and the exposure that renders those findings obsolete, given that with this new specification all terms satisfy the proportional hazards assumption. This is the model that will be described in this section.

The previous seizure disorder diagnosis was missing for most of the study population and was not included in the model as a covariate to preserve study power. After excluding participants with missing data from other variables a total of 5,754 complete cases were available for analysis. The cause of injury was removed from the model due to violations of the proportional hazards assumption (see section 8.2.1.1.3 in the appendix).

The survival curves of both sexes by SES quintiles can be seen in Figure 2. Overall, the distressed neighborhoods appear to have a lower survival probability than other neighborhoods. This appears to be true for both sexes, and males had a higher risk of dying than females in all neighborhoods. This plot was cropped at 50% survival for presentation purposes, see Figure A3 in the appendix for an uncropped version.

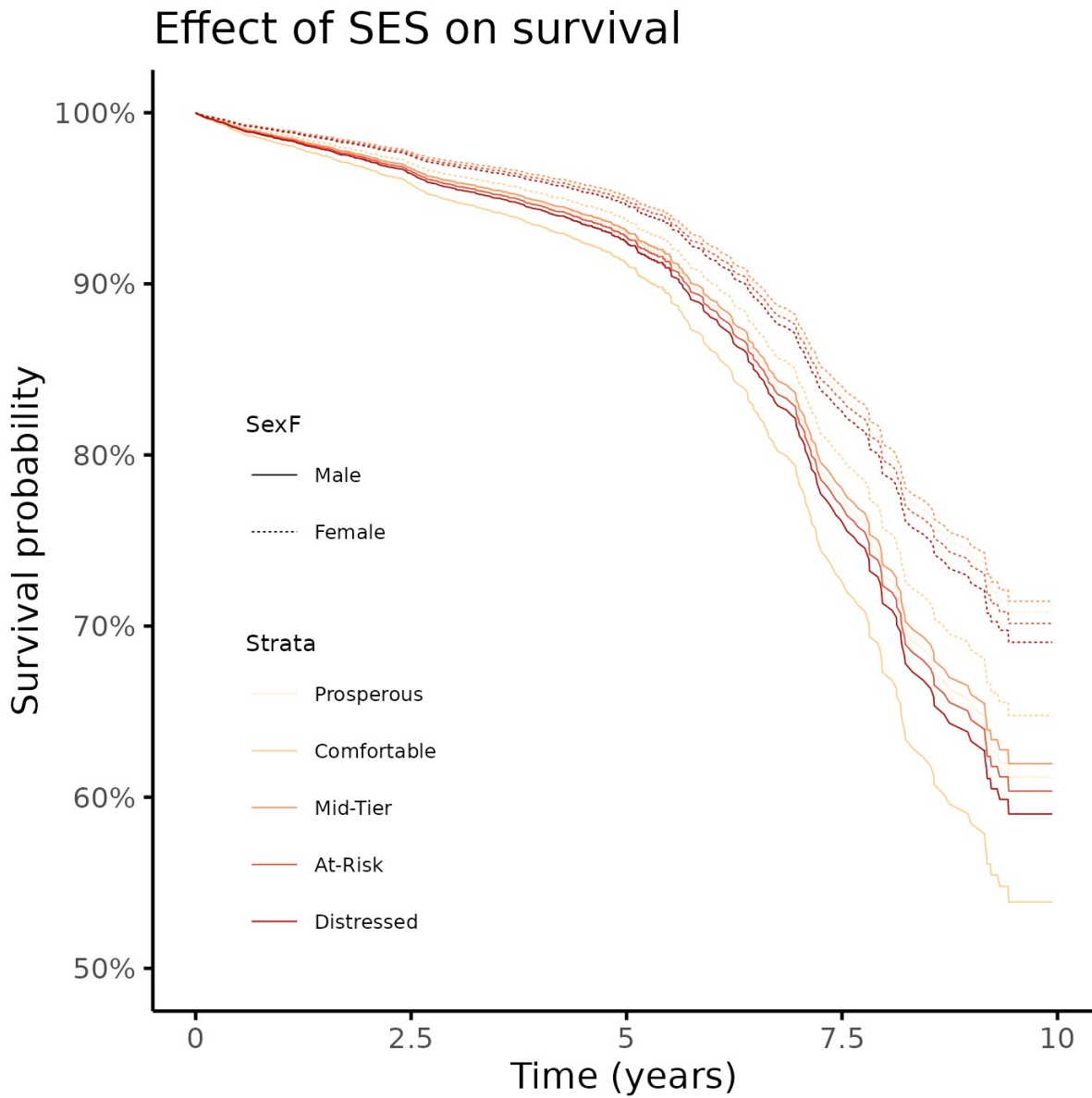


Figure 2 Survival of participants, by sex and by SES quintiles.

Statistical Analysis Report (SAR)

The effect of SES of the neighborhood to which the individuals were discharged was associated with mortality and it was modified by the FIM Motor at Discharge quartiles (Table 2). No level of FIM motor function appears to be protective, but participants with the highest functional scores (within the fourth quartile) had a significant increased risk of dying in all neighborhoods, compared to the prosperous neighborhoods.

Table 2 Effect of SES on mortality; HR estimates were adjusted for sex, race, age, education, employment status, residence after rehab discharge, urbanization, rehabilitation payer, spinal cord injury, substance abuse, days from injury to rehab, FIM scores quartiles and interactions between FIM scores and the exposure.

Characteristic	HR ¹²	95% CI ²	p-value
SES quintiles			
Prosperous	—	—	
Comfortable	0.81	0.53 to 1.24	0.328
Mid-Tier	0.69	0.43 to 1.11	0.125
At-Risk	0.84	0.54 to 1.31	0.440
Distressed	1.07	0.71 to 1.62	0.742
SES quintiles * FIM Motor at Discharge quartiles			
Comfortable * Q2	1.56	0.86 to 2.83	0.147
Mid-Tier * Q2	1.41	0.74 to 2.71	0.296
At-Risk * Q2	1.22	0.68 to 2.21	0.504
Distressed * Q2	1.00	0.55 to 1.82	0.998
Comfortable * Q3	1.06	0.52 to 2.17	0.880
Mid-Tier * Q3	1.15	0.56 to 2.39	0.702
At-Risk * Q3	1.09	0.54 to 2.21	0.802

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Characteristic	HR ¹²	95% CI ²	p-value
Distressed * Q3	1.05	0.54 to 2.04	0.880
Comfortable * Q4	5.22	2.09 to 13.0	<0.001
Mid-Tier * Q4	3.60	1.38 to 9.43	0.009
At-Risk * Q4	3.43	1.35 to 8.71	0.009
Distressed * Q4	5.14	2.07 to 12.7	<0.001
SES quintiles * FIM Cognitive at Discharge quartiles			
Comfortable * Q2	0.93	0.49 to 1.76	0.826
Mid-Tier * Q2	1.19	0.60 to 2.33	0.617
At-Risk * Q2	0.82	0.44 to 1.56	0.549
Distressed * Q2	0.76	0.41 to 1.41	0.379
Comfortable * Q3	0.78	0.38 to 1.59	0.497
Mid-Tier * Q3	2.04	0.98 to 4.25	0.056
At-Risk * Q3	1.25	0.64 to 2.45	0.516
Distressed * Q3	1.01	0.51 to 1.98	0.979
Comfortable * Q4	0.73	0.34 to 1.54	0.406
Mid-Tier * Q4	0.87	0.38 to 2.01	0.742
At-Risk * Q4	1.81	0.85 to 3.84	0.125
Distressed * Q4	0.89	0.42 to 1.91	0.773

Statistical Analysis Report (SAR)

Characteristic	HR ¹²	95% CI ²	p-value
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¹Adjusted by demographic + geographical + clinical variables + FIM scores + Interactions

²HR = Hazard Ratio, CI = Confidence Interval

Additionally it appears that the risk of dying associated with the DCI in neighborhoods has a “U-shape”, where “comfortable” and “distressed” locations show a higher incidence than both “mid-tier” and “at-risk” locations. This might indicate a more complex non-linear relationship between SES and FIM scores that could be evaluated in future studies.

5 OBSERVATIONS AND LIMITATIONS

Recommended reporting guideline

The adoption of the EQUATOR network (<http://www.equator-network.org/>) reporting guidelines have seen increasing adoption by scientific journals. All observational studies are recommended to be reported following the STROBE guideline (von Elm et al, 2014).

6 CONCLUSIONS

The epidemiological profile of the study participant is a 31 years old white male, that has greater than high school level of education, is actively employed and lives in an urban setting.

After controlling for demographic, geographical, clinical variables and FIM scores SES is associated with an increased incidence of mortality when participants also have higher levels of motor function. This association holds regardless of what neighborhood participants were discharged to.

7 REFERENCES

- **SAP-2023-016-BH-v03** – Analytical Plan for Time-adjusted effect of socioeconomic status in mortality rates after brain injury: cohort study
- **SAR-2023-017-BH-v01** – Sensitivity of mortality rates to the imputation of missing socioeconomic data: cohort study
- **SAR-2023-004-BH-v02** – Effect of socioeconomic status in mortality rates after brain injury: cohort study
- von Elm E, Altman DG, Egger M, Pocock SJ, Gøtzsche PC, Vandembroucke JP; STROBE Initiative. The Strengthening the Reporting of Observational Studies in Epidemiology (STROBE) Statement: guidelines for reporting observational

studies. Int J Surg. 2014 Dec;12(12):1495-9
(<https://doi.org/10.1016/j.ijisu.2014.07.013>).

8 APPENDIX

8.1 Exploratory data analysis

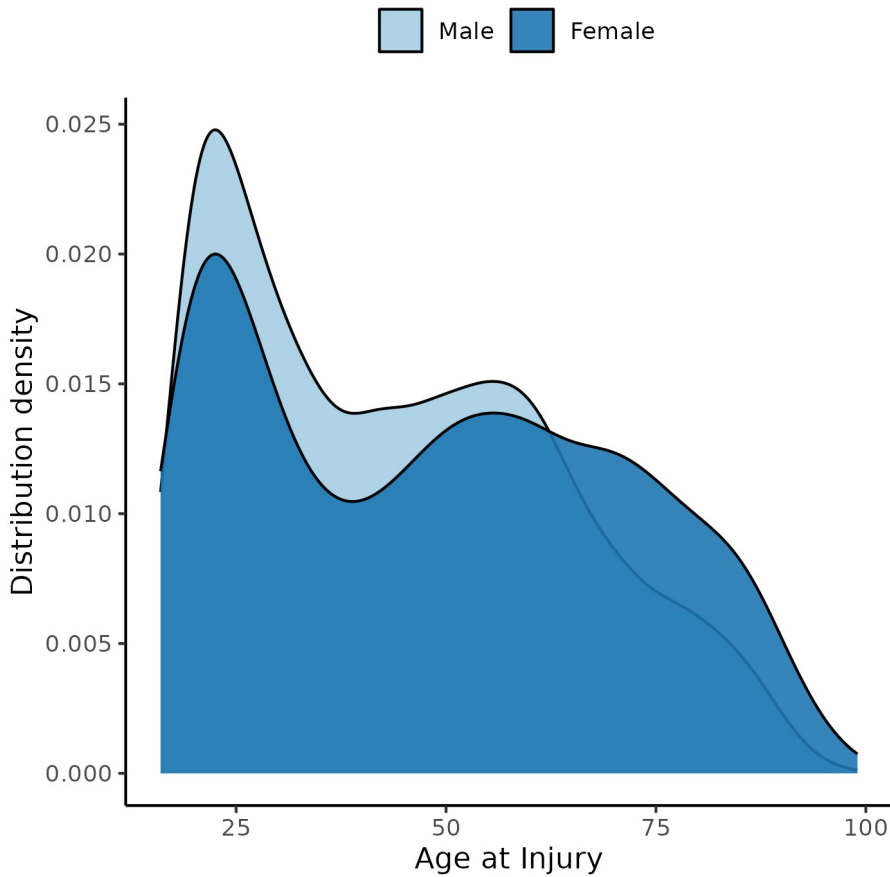


Figure A1 Distribution of age in the study population.

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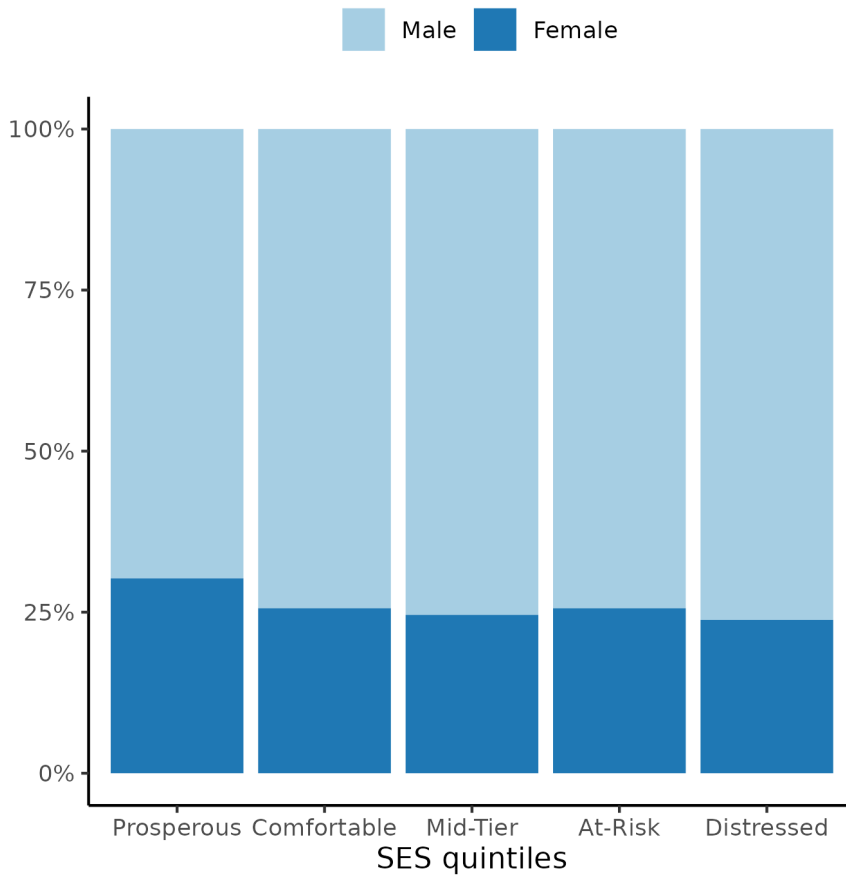


Figure A2 Distribution of SES in the study population.

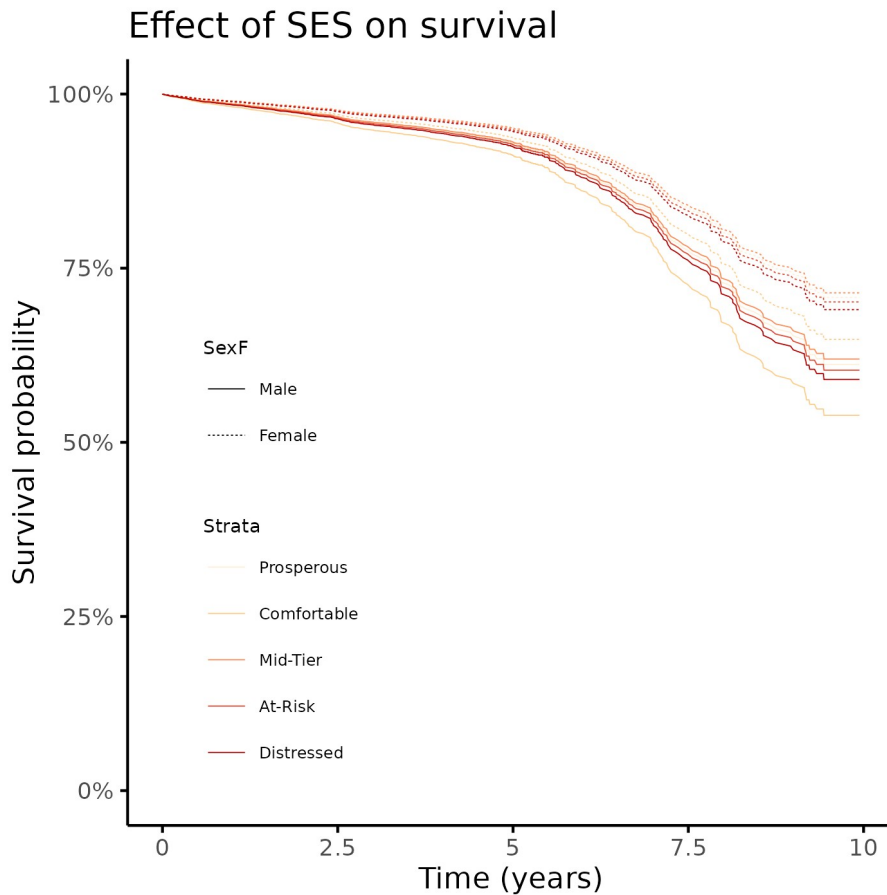


Figure A3 Alternative version of figure 2.

8.2 Modeling strategy

8.2.1 Approaches to control for time-dependent covariates

8.2.1.1 Before location/SES imputation

Imputation was done in a separate analysis and is described in the report **SAR-2023-017-v01**.

8.2.1.1.1 Schoenfeld and Martingale residuals

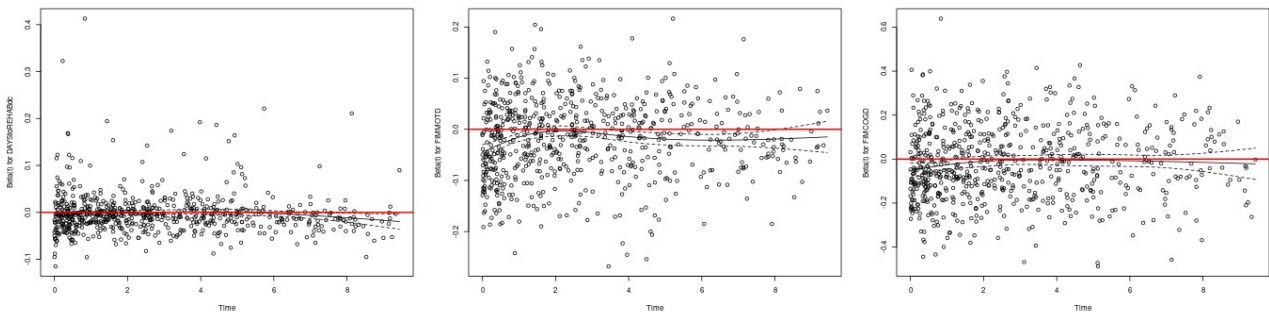


Figure A4 caption

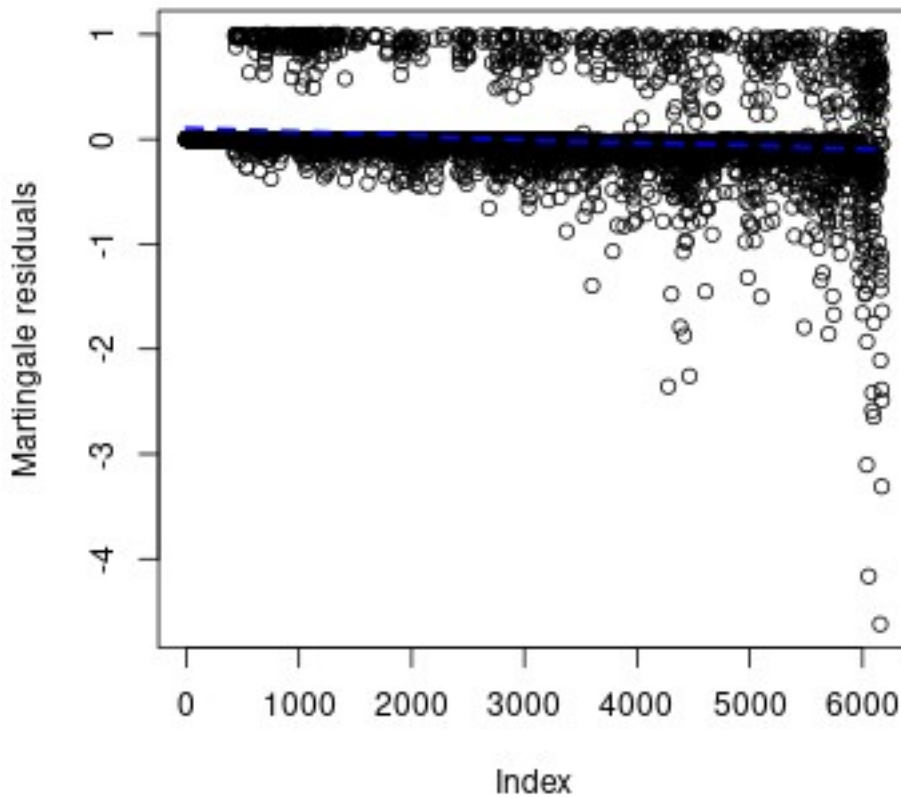


Figure A5 caption

Notes:

- cause, days, fimmot and fimcog are time-dependent (fail schoenfeld test) (A4)
- a few observations might be outliers, but do not appear to be influential (A5)

8.2.1.1.2 Martingale residuals of covariates against the null model

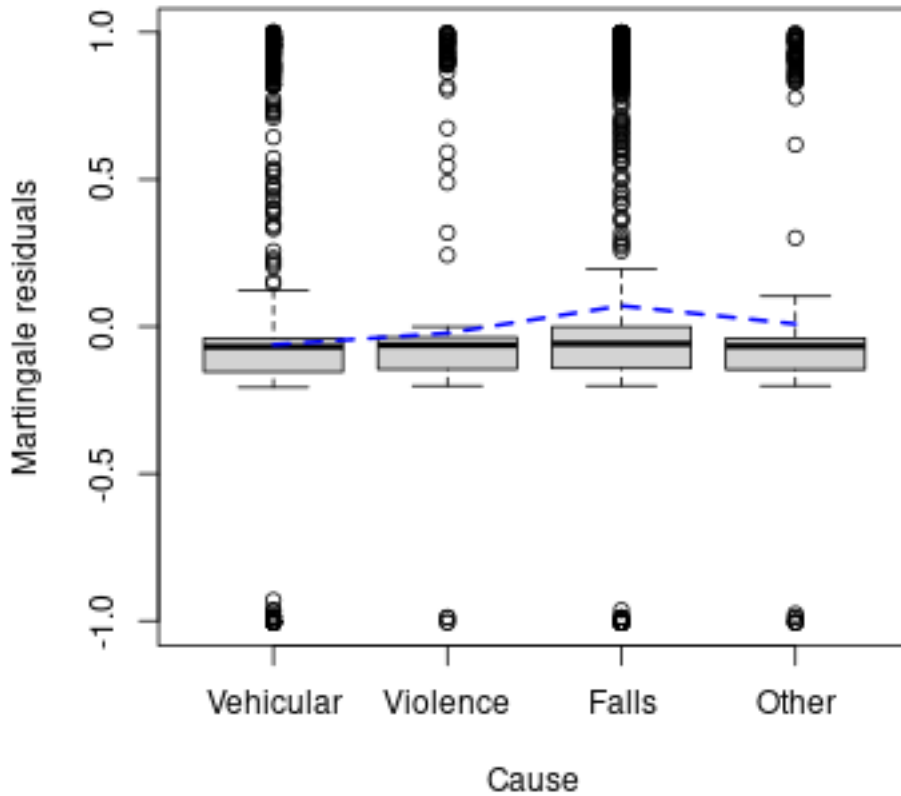


Figure A6 caption

Statistical Analysis Report (SAR)

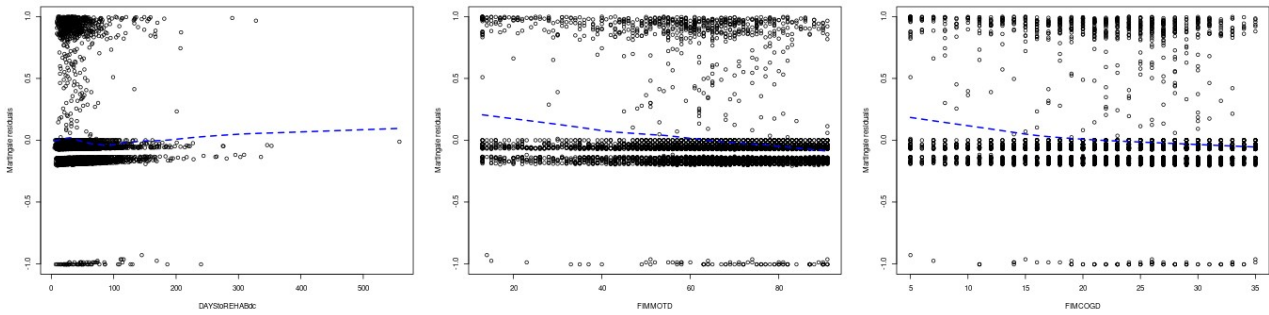


Figure A7 caption

Notes:

- Cause has an extreme non-PH violation, falls are much higher risk (A6)
- this justifies stratifying by Cause
- individuals with lower days/fimmot/fimcog have higher non-PH risk (A7)
- days is much worse than FIM scores (highly non-linear) (A7)

8.2.1.1.3 Stratification by cause of injury

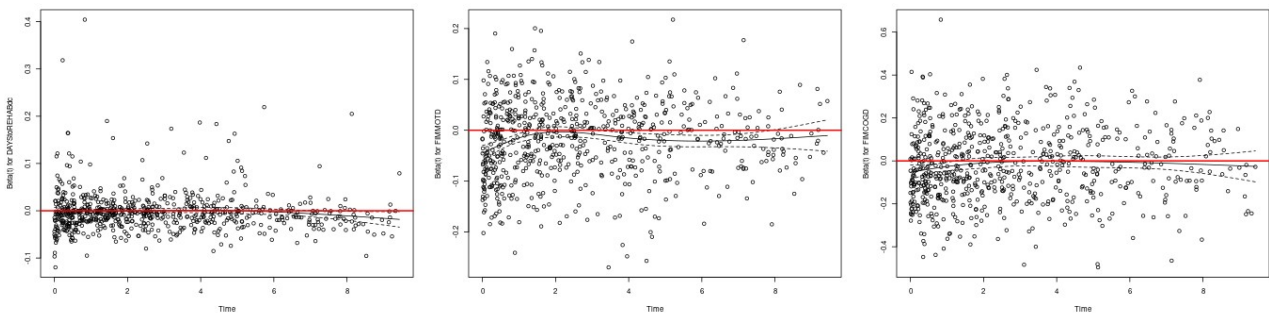


Figure A8 caption

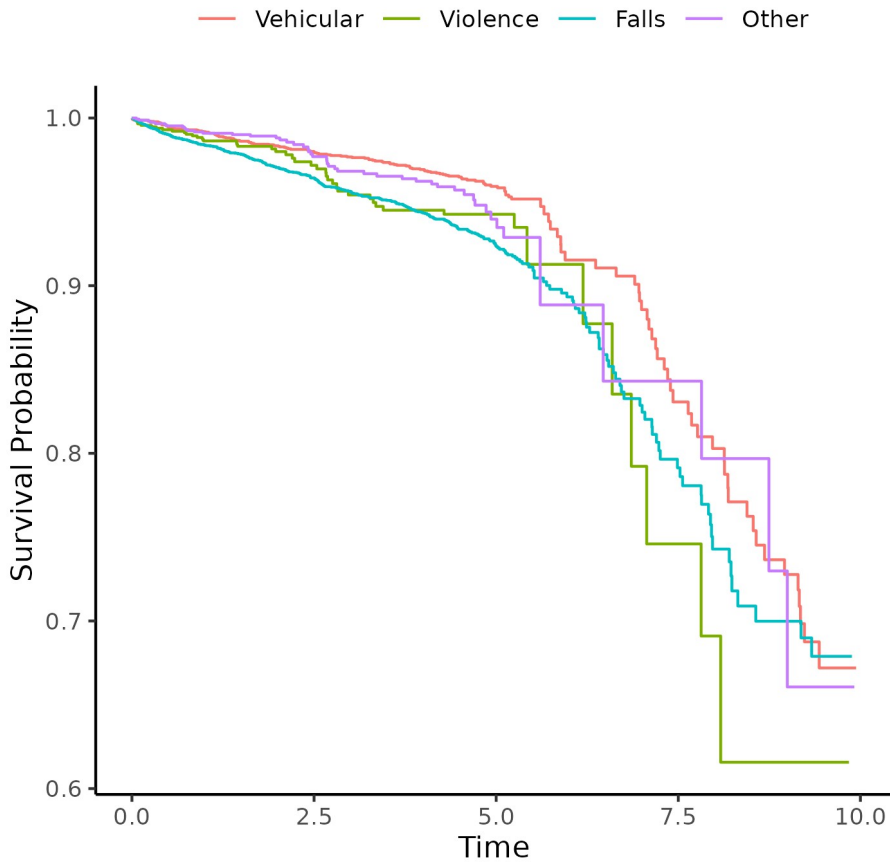


Figure A9 caption

Notes:

- stratifying by cause appears to help with non-PH of the 3 vars (A8)
- cause violates the PH assumption (A9)

8.2.1.1.4 Time split

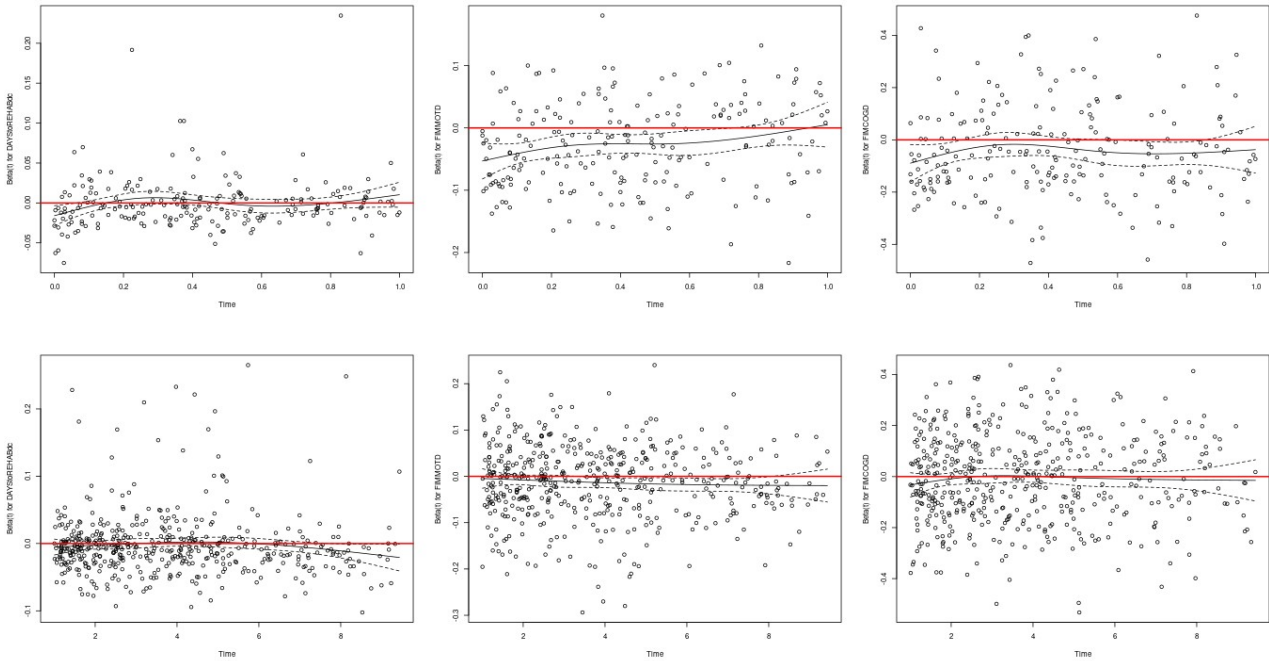


Figure A10 caption

Notes:

- time split at 1yr doesn't help further (A10)

8.2.1.1.5 Non-linear fitting

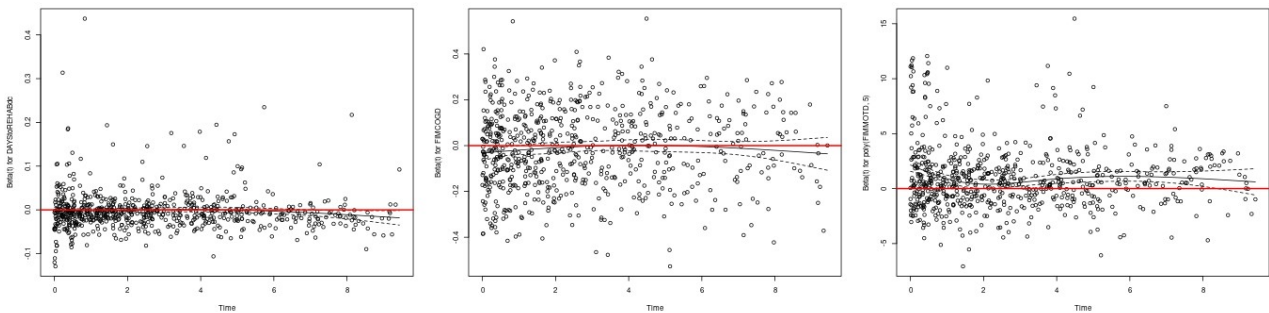


Figure A11 caption

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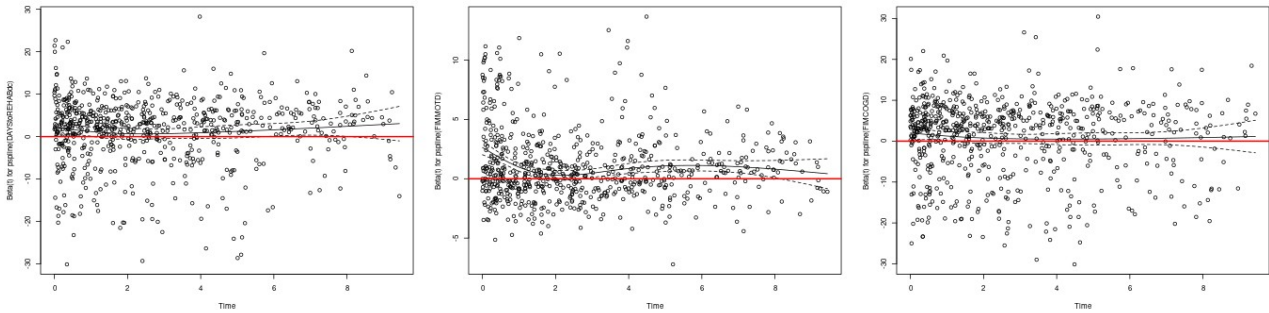


Figure A12 caption

Notes:

- polynomials (A11) and splines (A12) appear to help stabilize residuals, but not enough

8.2.1.1.6 Interaction with time

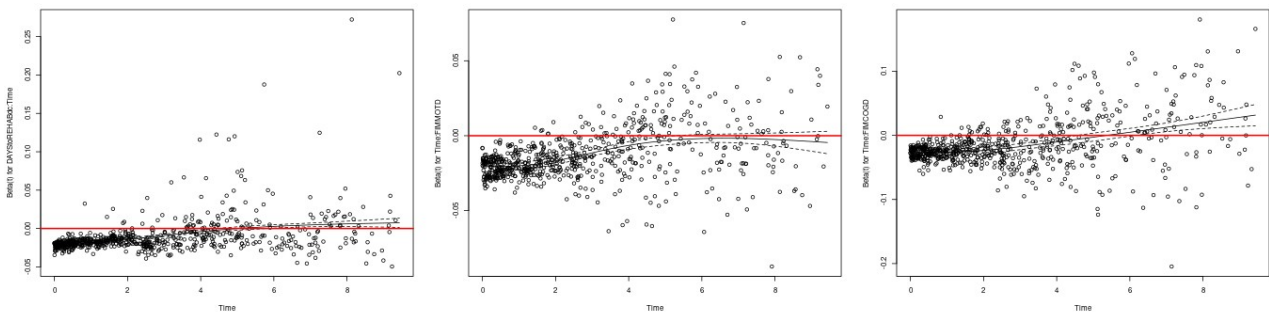


Figure A13 caption

Notes:

- makes non-PH worse, not helpful at all (A13)

8.2.1.1.7 FIM scores quartiles

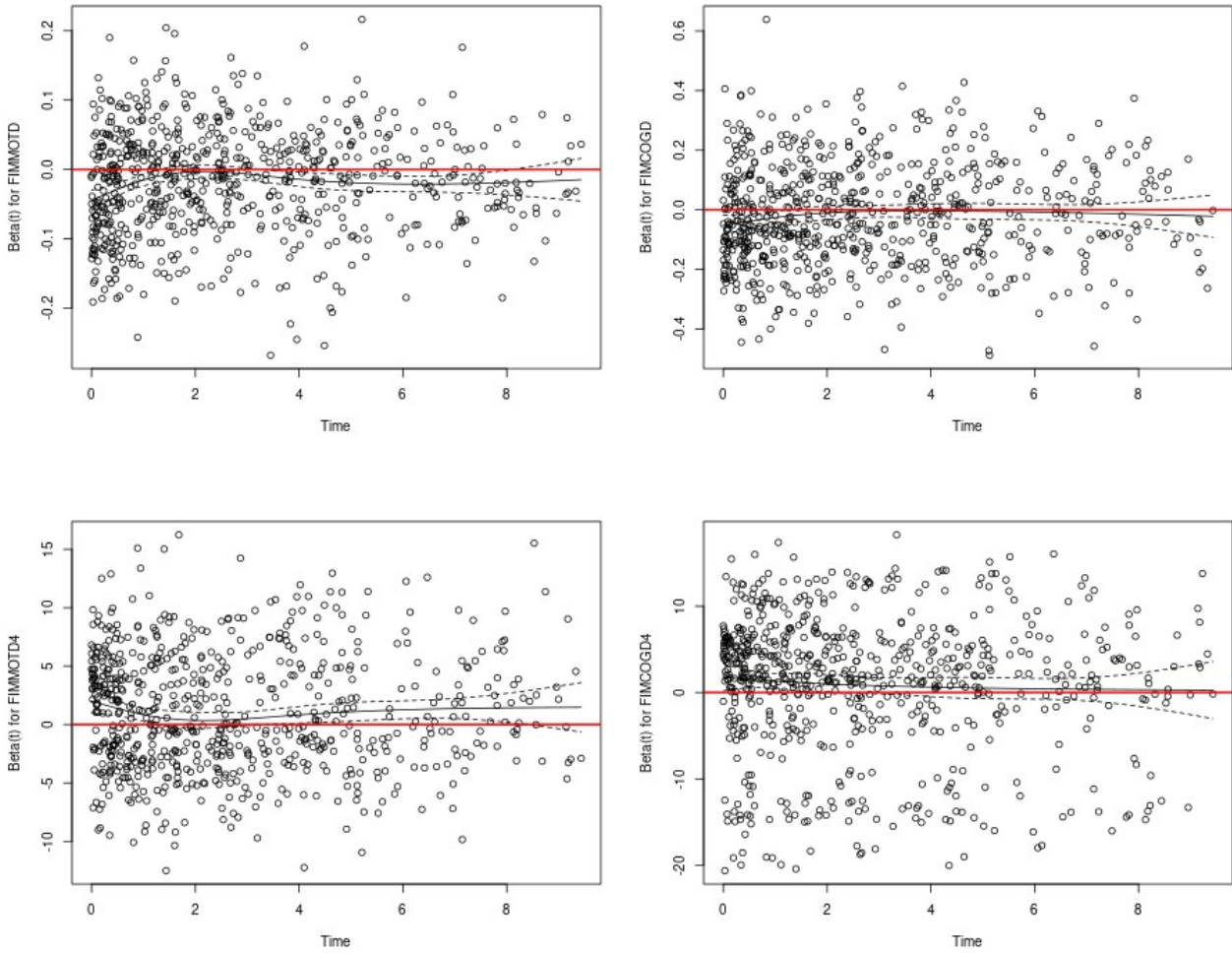


Figure A14 caption

Notes:

- days still non-PH (A14)
- FIM scores seem PH enough (A14)

8.2.1.2 *Best model specification*

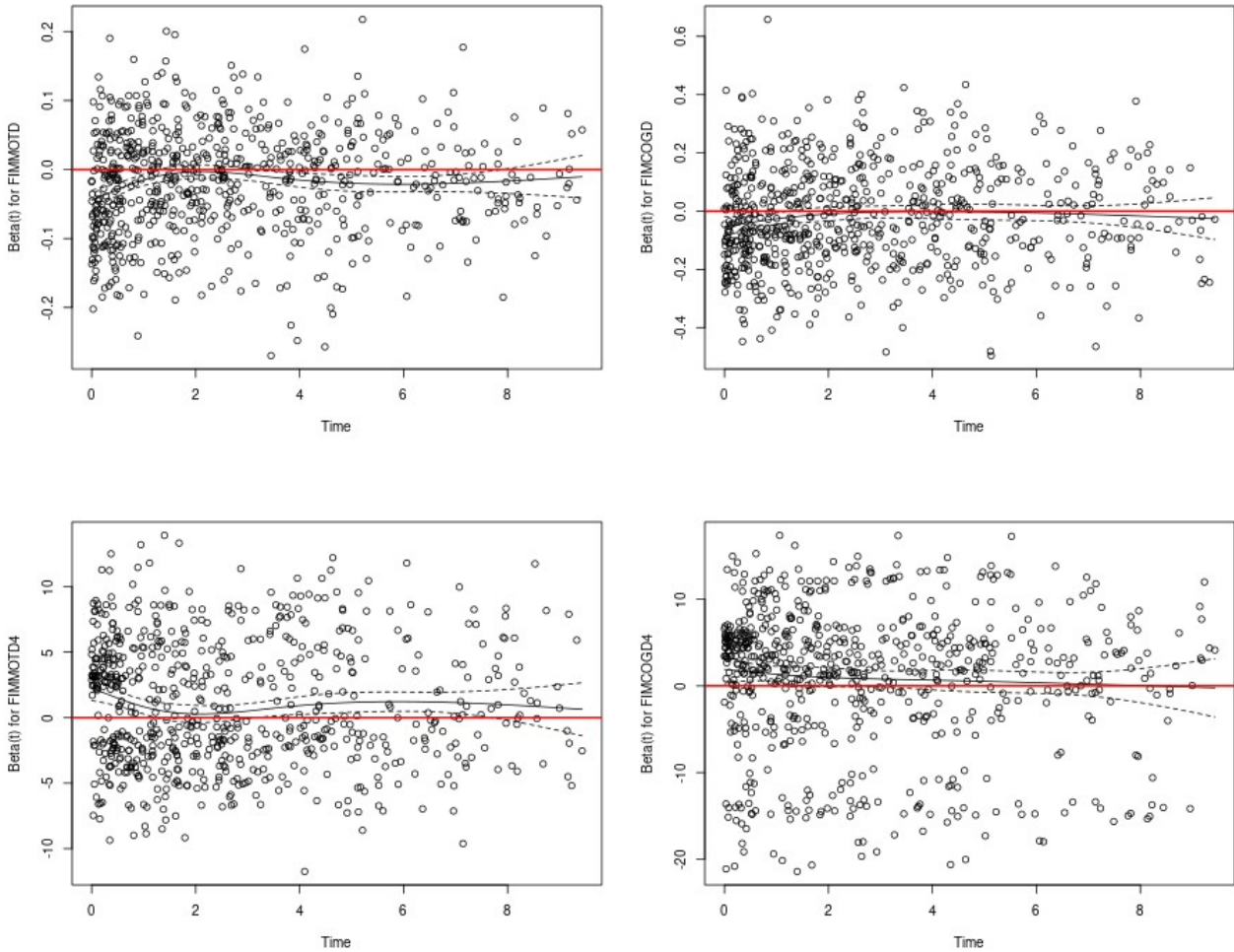


Figure A15 caption

Notes:

- removing days makes residuals appear PH (A15)
- passes schoenfeld test
- final model: strat by cause + FIM quartiles + drop days

8.2.1.3 *After location/SES imputation*

8.2.2 Schoenfeld test

Table A1 P-values of the Schoenfeld test for all 6 models.

term	model1	model2	model3	model4	model5	model6
exposure	0.069	0.7	0.7	0.6	0.5	0.6
GLOBAL	0.069	0.3	0.4	0.7	0.3	0.3
SexF	NA	0.048	0.11	0.2	0.2	0.12
Race	NA	0.12	0.13	0.2	0.3	0.3
AGE	NA	0.14	0.3	0.5	0.8	0.9
EDUCATION	NA	>0.9	>0.9	0.9	>0.9	>0.9
EMPLOYMENT	NA	0.067	0.095	0.2	0.3	0.3
ResDis	NA	NA	0.2	0.3	0.4	0.5
RURALdc	NA	NA	0.2	0.3	0.4	0.3
RehabPay1	NA	NA	NA	0.5	0.6	0.6
SCI	NA	NA	NA	0.4	0.2	0.14
PROBLEMUse	NA	NA	NA	0.4	0.4	0.4
DAYStoREHABdc	NA	NA	NA	0.2	0.055	0.077
FIMMOTD4	NA	NA	NA	NA	0.047	0.12
FIMCOGD4	NA	NA	NA	NA	0.2	0.2
exposure:FIMMOTD4	NA	NA	NA	NA	NA	0.091
exposure:FIMCOGD4	NA	NA	NA	NA	NA	0.3

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8.2.3 Final model specification

Table A2 Alternative version of Table 2, showing the coefficients from all covariates included in all 6 models.

	Model 1	Model 2	Model 3	Model 4	Model 5	Model 6
Characteristic	HR (SE) ¹²	HR (SE) ¹²	HR (SE) ¹²	HR (SE) ¹²	HR (SE) ¹²	HR (SE) ¹²
SES quintiles						
Prosperous	—	—	—	—	—	—
Comfortable	1.18 (0.118)	1.07 (0.118)	0.98 (0.121)	0.98 (0.121)	0.98 (0.121)	0.81 (0.218)
Mid-Tier	1.00 (0.125)	1.17 (0.127)	1.14 (0.130)	1.13 (0.130)	1.09 (0.130)	0.69 (0.244)
At-Risk	1.29* (0.120)	1.31* (0.122)	1.20 (0.125)	1.18 (0.126)	1.12 (0.126)	0.84 (0.226)
Distressed	1.35** (0.116)	1.38** (0.124)	1.33* (0.127)	1.31* (0.127)	1.21 (0.128)	1.07 (0.211)
Sex:						
Male		—	—	—	—	—
Female		0.64*** (0.088)	0.65*** (0.088)	0.68*** (0.089)	0.70*** (0.089)	0.70*** (0.090)
What is your race?						
White		—	—	—	—	—
Black		0.83 (0.117)	0.81 (0.119)	0.81 (0.119)	0.81 (0.120)	0.81 (0.120)
Hispanic		0.64*** (0.162)	0.61** (0.167)	0.61** (0.168)	0.59** (0.168)	0.56*** (0.169)
Other		0.73 (0.206)	0.73 (0.207)	0.72 (0.207)	0.71 (0.208)	0.68 (0.210)
Age at Injury		1.04*** (0.002)	1.04*** (0.002)	1.04*** (0.003)	1.04*** (0.003)	1.04*** (0.003)
Education						

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	Model 1	Model 2	Model 3	Model 4	Model 5	Model 6
Characteristic	HR (SE) ¹²	HR (SE) ¹²	HR (SE) ¹²	HR (SE) ¹²	HR (SE) ¹²	HR (SE) ¹²
Greater Than High School		—	—	—	—	—
Less Than High School		1.21 (0.114)	1.25 (0.114)	1.23 (0.115)	1.17 (0.116)	1.21 (0.117)
High School/GED		1.39*** (0.087)	1.39*** (0.088)	1.36*** (0.088)	1.36*** (0.088)	1.34*** (0.089)
At time of injury, what was your employment status?						
Employed		—	—	—	—	—
Unemployed		2.23*** (0.136)	2.13*** (0.137)	1.82*** (0.142)	1.76*** (0.142)	1.79*** (0.143)
Other		2.22*** (0.100)	2.18*** (0.100)	2.03*** (0.105)	1.83*** (0.106)	1.85*** (0.107)
Residence after rehab discharge:						
Private Residence			—	—	—	—
Other			1.77*** (0.083)	1.70*** (0.085)	1.44*** (0.089)	1.41*** (0.089)
Urbanization based on zip code of address at discharge.						
Suburban			—	—	—	—
Rural			1.00 (0.115)	1.01 (0.116)	1.04 (0.116)	1.02 (0.117)
Urban			1.14 (0.096)	1.09 (0.096)	1.14 (0.096)	1.16 (0.097)
Primary rehabilitation payor:						
Private Insurance				—	—	—
Public Insurance				1.40*** (0.095)	1.37*** (0.095)	1.38*** (0.095)

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	Model 1	Model 2	Model 3	Model 4	Model 5	Model 6
Characteristic	HR (SE) ¹²	HR (SE) ¹²	HR (SE) ¹²	HR (SE) ¹²	HR (SE) ¹²	HR (SE) ¹²
Other				1.16 (0.185)	1.10 (0.185)	1.09 (0.186)
Spinal cord injury:				1.22 (0.175)	1.30 (0.176)	1.27 (0.178)
Substance Problem Use				1.23* (0.093)	1.28** (0.094)	1.30** (0.095)
Days From Injury to Rehab Discharge				1.00* (0.001)	1.00 (0.001)	1.00 (0.001)
FIM Motor at Discharge quartiles						
Q1					—	—
Q2					0.67*** (0.102)	0.55** (0.217)
Q3					0.65*** (0.122)	0.60* (0.248)
Q4					0.55*** (0.144)	0.17*** (0.379)
FIM Cognitive at Discharge quartiles						
Q1					—	—
Q2					0.84 (0.105)	0.92 (0.221)
Q3					0.82 (0.111)	0.73 (0.255)
Q4					0.65*** (0.128)	0.67 (0.275)
SES quintiles * FIM Motor at Discharge quartiles						
Comfortable * Q2						1.56 (0.305)
Mid-Tier * Q2						1.41 (0.332)

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	Model 1	Model 2	Model 3	Model 4	Model 5	Model 6
Characteristic	HR (SE) ¹²	HR (SE) ¹²	HR (SE) ¹²	HR (SE) ¹²	HR (SE) ¹²	HR (SE) ¹²
At-Risk * Q2						1.22 (0.302)
Distressed * Q2						1.00 (0.305)
Comfortable * Q3						1.06 (0.367)
Mid-Tier * Q3						1.15 (0.372)
At-Risk * Q3						1.09 (0.359)
Distressed * Q3						1.05 (0.339)
Comfortable * Q4						5.22*** (0.467)
Mid-Tier * Q4						3.60** (0.491)
At-Risk * Q4						3.43** (0.475)
Distressed * Q4						5.14*** (0.463)
SES quintiles * FIM Cognitive at Discharge quartiles						
Comfortable * Q2						0.93 (0.324)
Mid-Tier * Q2						1.19 (0.344)
At-Risk * Q2						0.82 (0.324)
Distressed * Q2						0.76 (0.315)
Comfortable * Q3						0.78 (0.363)
Mid-Tier * Q3						2.04 (0.374)

Statistical Analysis Report (SAR)

	Model 1	Model 2	Model 3	Model 4	Model 5	Model 6
Characteristic	HR (SE) ¹²	HR (SE) ¹²	HR (SE) ¹²	HR (SE) ¹²	HR (SE) ¹²	HR (SE) ¹²
At-Risk * Q3						1.25 (0.343)
Distressed * Q3						1.01 (0.343)
Comfortable * Q4						0.73 (0.383)
Mid-Tier * Q4						0.87 (0.428)
At-Risk * Q4						1.81 (0.385)
Distressed * Q4						0.89 (0.386)

¹*p<0.05; ²**p<0.01; ³***p<0.001

²HR = Hazard Ratio, SE = Standard Error

8.3 Availability

All documents from this consultation were included in the consultant’s Portfolio.

The portfolio is available at:

<https://philsf-biostat.github.io/SAR-2023-016-BH/>

8.4 Associated analyses

This analysis is part of a larger project and is supported by other analyses, linked below.

Effect of socioeconomic status in mortality rates after brain injury: cohort study

<https://philsf-biostat.github.io/SAR-2023-004-BH/>

Sensitivity of mortality rates to the imputation of missing socioeconomic data: cohort study

<https://philsf-biostat.github.io/SAR-2023-017-BH/>

8.5 Analytical dataset

Table A3 shows the structure of the analytical dataset.

Table A3 Analytical dataset structure

id	exposure	outcome	Time	SexF	Race	Mar	AGE	PROBLEUse	EDUCA TION	EMPLO YMENT	RURAL dc	Prior Seiz	SCI	Cause	Rehab Pay1	ResDi s	DAYSt OREHA Bdc	FIMMO TD	FIMCO GD	Follo wUpPe riod	FIMMO TD4	FIMCO GD4	
1																							
2																							
3																							
...																							
N																							

Due to confidentiality the data-set used in this analysis cannot be shared online in the public version of this report.