FOG time to events analysis

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Executive summary

In this project, we will be using data from kaggle. We aim to analysis time to freezing of gait (FOG). FOG is a pattern occurring in patient with Parkinson disease. It indicates kinetic inability and impairment during gait for instance. Some indicative events like walking hesitation, turning body could be observed and help to detect FOG occurrence.

Introduction

We aim at analyzing the time to event in Parkinsonian patients. Here FOG is the event of interest and it is expected within the execution of a given task, or during daily life activity. Here we will analyse data from lab tasks. Our main goal is to analyse and explain overall FOG time to event model, the influence/importance of some features to the occurrence of freezing of gait(FOG) from the beginning to the end of the task. To achieve this, we model our data under kaplan-Meier model.

Data preparation, inspection and preprocessing.

let's join all metadata tables before diving into analysis.

- defog_metadata.csv Identifies each series in the tdcsfog dataset by a unique Subject, Visit, Test,
 Medication condition.
 - Visit Lab visits consist of a baseline assessment, two post-treatment assessments for different treatment stages, and one follow-up assessment.
 - Test Which of three test types was performed, with 3 the most challenging.
 - Medication Subjects may have been either off or on anti-parkinsonian medication during the recording.
- subjects.csv Metadata for each Subject in the study, including their Age and Sex as well as:
 - Visit Only available for subjects in the daily and defog datasets.
 - YearsSinceDx Years since Parkinson's diagnosis.
 - UPDRSIIIOn/UPDRSIIIOff Unified Parkinson's Disease Rating Scale score during on/off medication respectively. NFOGQ Self-report FoG questionnaire score. See: https://pubmed.ncbi.nlm.nih.gov/19660949/
- events.csv Metadata for each FoG event in all data series. The event times agree with the labels in the data series.
 - Id The data series the event occured in.
 - Init Time (s) the event began.
 - Completion Time (s) the event ended.
 - Type Whether StartHesitation, Turn, or Walking.
 - Kinetic Whether the event was kinetic (1) and involved movement, or akinetic (0) and static.
- tasks.csv Task metadata for series in the defog dataset. (Not relevant for the series in the tdcsfog or daily datasets.)
 - Id The data series where the task was measured.
 - Begin Time (s) the task began.
 - End Time (s) the task ended.

Task One of seven tasks types in the DeFOG protocol, described on this page.

Remove Visit from subjects table, as we do not use it

Note: we are going to consider only defog condition subjects.

Data structure

Here we will refer to Kinetic as status (will change it later) and init as Time, then we will compute duration

.

Ad event and tasks duration columns features:

- eventsDuration <- Completion Init
- tasksDuration <- Begin end

Data analysis

1D EDA

Subjects

How many unique subjects are in this dataset?

There are 44 distinct subjects in this study.

Kinetic / Events

How many trials has missing kinetic/status?

```
## [1] 0.48
```

48% of trials has missing Kinetic(status).

filter for missing kinetic entries/cases.

```
## ## new table dimension
## [1] 2232 19
## # A tibble: 3 x 19
```

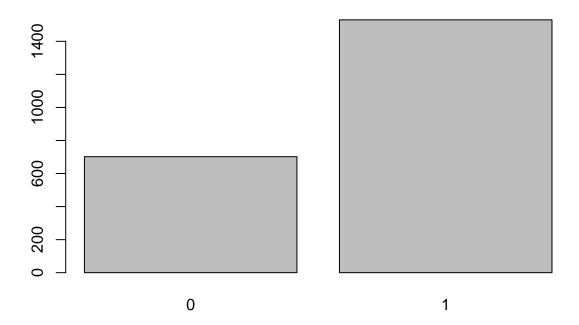
```
##
     Id
                 Init Compl~1 Type Kinetic Begin
                                                    End Task Subject Visit Medic~2
##
     <chr>>
                <dbl>
                        <dbl> <chr>
                                      <dbl> <dbl> <dr> <chr> <chr>
## 1 02ea782681 1377.
                        1378. Turn
                                          1 1371. 1393. Turn~ ae2d35
                                                                           2 on
## 2 02ea782681 1377.
                        1378. Turn
                                          1 1371. 1393. Turn~ ae2d35
                                                                           2 on
## 3 02ea782681 1466.
                        1467. Turn
                                          1 1461. 1472. Hots~ ae2d35
## # ... with 8 more variables: Age <dbl>, Sex <chr>, YearsSinceDx <dbl>,
       UPDRSIII_On <dbl>, UPDRSIII_Off <dbl>, NFOGQ <dbl>, eventsDuration <dbl>,
## #
       tasksDuration <dbl>, and abbreviated variable names 1: Completion,
## #
       2: Medication
```

[1] 2232 19

[1] 38 14

Among remaining 52% of trials. What is the proportion of observed Kinetic events ? Kinetic graphical summary

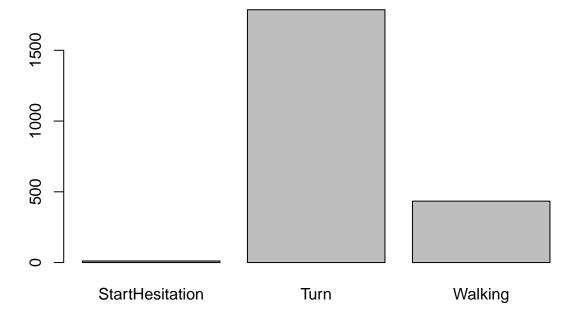
barplot kinetic



Kinetic numerical summary

69~% of events has been observed.

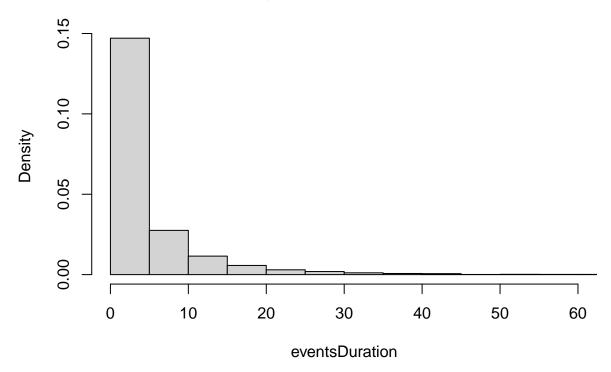
Note: Given that each event is indicative of FOG, we will just gather them and consider that they form one class (Kinetic / events).



events type numerical summary

events Duration graphical summary.

Histogram of eventsDuration



Events duration is asymetric and right skewed. Many events duration are of high values.

EventsDuration Numerical summary

```
## Min. 1st Qu. Median Mean 3rd Qu. Max.
## 0.1190 0.9732 2.2300 4.7992 5.4370 144.5650
```

At least 50% of cases has 2.23s events duration, and events duration ranges between 0 .11 and 581 seconds.

Duration

What is the mean duration of events, tasks and Time?

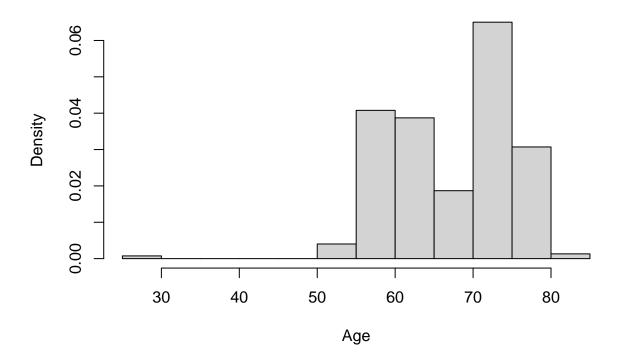
events mean duration : 4.799225 s

tasks mean duration : 101.1519 s

Age

What is the median age? Age graphical summary.

Histogram of Age



Age is not normally distributed, bimodal with some outliers. Age numerical summary.

At least half of subjects are 69 years old.

Sex

Sex graphical summary.

Sex numerical summary

```
## Sex
## F M
## 0.45 0.55
```

There is almost 55.1498127% of men in this cohort.

Tasks

What kind of tasks has been performed?

```
## [1] "TUG-DT" "TUG-C" "Turning-DT" "Hotspot2" "Hotspot2-C" 
## [6] "Hotspot1" "Turning-ST" "4MW" "4MW-C" "TUG-ST" 
## [11] "Turning-C" "Hotspot1-C" "MB10" "MB11" "MB13" 
## [16] "MB12"
```

how many tasks had been performed?

There had been 16 task performed.

Visit

How many rounds of visit did the patient had?

```
## [1] 2
```

What is the proportion of patient within each number of visit round?

```
## Visit
## 1 2
## 0.37 0.63
```

37% of patients had one Visit, while the remaining had 2.

Medication

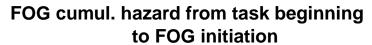
How many subjects are under parkinson-medication?

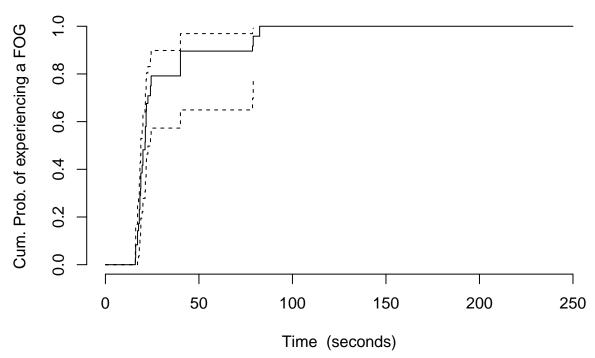
```
## Medication
## off on
## 68.89 31.11
```

31.11% are under medication. ##

2D EDA

Modelling and Analysis: overall time to FOG.



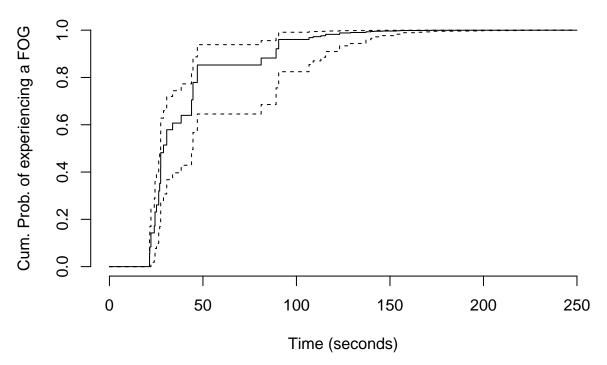


```
## Call: survfit(formula = Surv(Begin, Init, Kinetic) ~ 1, data = fog)
##

## records n.max n.start events median 0.95LCL 0.95UCL
## [1,] 2232 130 36 1530 21.2 18.9 24.1
```

When considering time to FOG initiation , half of patients experiment FOG within $21.183~\mathrm{s}.$

FOG cum. hazard from task start to the end



```
## Call: survfit(formula = Surv(Begin, End, Kinetic) ~ 1, data = fog)
##
## records n.max n.start events median 0.95LCL 0.95UCL
## [1,] 2232 190 36 1530 28.9 27.4 44.7
```

When considering time to the end of the task, half of patients experiment FOG within 28.911 s.

group effect: coxph analysis.

sex

p-value is 0.15 . There is no effect of sex on time to FOG.

Medication

P-value is 0 \in 0.05. there is huge effect of Medication in experiencing FOG holding other variables fixed.

effect of task type

```
## Warning in agreg.fit(X, Y, istrat, offset, init, control, weights = weights, :
## Loglik converged before variable 6 ; beta may be infinite.
```

p-value 0.52, 0.01, 0.14, 0.12, 0.14, 0.98, 0.06, 0.02, 0.75, 0.24, 0, 0.07 is « to 0.05, there is strong effect of task type in FOG occurence holding other variables fixed.

effect of event type

```
## Warning in agreg.fit(X, Y, istrat, offset, init, control, weights = weights, :
## Loglik converged before variable 6 ; beta may be infinite.
```

```
## # A tibble: 12 x 5
##
                    estimate std.error statistic p.value
     term
##
      <chr>
                       <dbl>
                                  <dbl>
                                            <dbl>
                                                    <dbl>
                                           0.638 0.523
## 1 Task4MW-C
                        0.377
                                  0.591
## 2 TaskHotspot1
                       1.03
                                  0.411
                                           2.49
                                                  0.0127
  3 TaskHotspot1-C
                                  0.499
                                                  0.139
                        0.738
                                           1.48
## 4 TaskHotspot2
                       -0.628
                                  0.399
                                          -1.57
                                                  0.116
## 5 TaskHotspot2-C
                        0.650
                                  0.436
                                           1.49
                                                  0.136
## 6 TaskMB10
                       18.2
                                884.
                                           0.0206 0.984
## 7 TaskMB12
                       1.14
                                  0.614
                                           1.86
                                                  0.0626
## 8 TaskTUG-C
                        1.08
                                  0.460
                                           2.35
                                                  0.0186
## 9 TaskTUG-DT
                       -0.123
                                  0.392
                                         -0.314 0.753
## 10 TaskTUG-ST
                                  0.395
                       0.464
                                           1.17
                                                  0.240
## 11 TaskTurning-DT
                       -1.24
                                  0.394
                                          -3.15
                                                  0.00165
## 12 TaskTurning-ST
                       -0.700
                                  0.393
                                          -1.78
                                                  0.0746
```

p-value is 0.52, 0.01, 0.14, 0.12, 0.14, 0.98, 0.06, 0.02, 0.75, 0.24, 0, 0.07 is « to 0.05. There an effect of task type in the risk of experiencing FOG.

effect of visit

P-value is 0 and is « to 0.05, there is an effect of visit number in FOG occurrence.

Discussion and Conclusion

References

To be continued !!!!