# FlipTheFleet Test Black Box Data: Testing Time of Charging

# Exploration of test data

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# Contents

1	Citation	2
2	About         2.1 Circulation          2.2 Purpose          2.3 Requirements:          2.4 History          2.5 Support	4
3	Load data files 3.1 EV test data	4
4	Timing of charging	8
5	Questions to ask	g
6	Runtime	10
7	R environment	10
$\mathbf{R}$	eferences	11

# 1 Citation

If you wish to use any of the material from this report please cite as:

• Anderson, B. (2018) FlipTheFleet Test Black Box Data: Testing Time of Charging: Exploration of test data, Centre for Sustainability, University of Otago: Dunedin.

This work is (c) 2018 the University of Southampton.



Figure 1: The Black Box (Source: FlipTheFleet)

# 2 About

## 2.1 Circulation

Report circulation:

• Restricted to: NZ GREEN Grid project partners and contractors.

## 2.2 Purpose

This report is intended to:

- $\bullet\,$  load and test preliminary 'black box' EV monitoring data provided for assessment purposes by FlipThe-Fleet
- preliminary analysis of time of charging to understand impact on 'peak' electricity demand

## 2.3 Requirements:

• test dataset stored at /Volumes/hum-csafe/Research Projects/GREEN Grid/\_RAW DATA/flipTheFleet/

#### 2.4 History

Generally tracked via our git.soton repo:

- issues

Specific history of this code:

• https://git.soton.ac.uk/ba1e12/nzGREENGrid/tree/master/analysis/ev

#### 2.5Support

This work was supported by:

- The University of Otago;
- The University of Southampton;
- The New Zealand Ministry of Business, Innovation and Employment (MBIE) through the NZ GREEN Grid project;
- SPATIALEC a Marie Skłodowska-Curie Global Fellowship based at the University of Otago's Centre for Sustainability (2017-2019) & the University of Southampton's Sustainable Energy Research Group (2019-202).

We do not 'support' the code but if you have a problem check the issues on our repo and if it doesn't already exist, open one. We might be able to fix it:-)

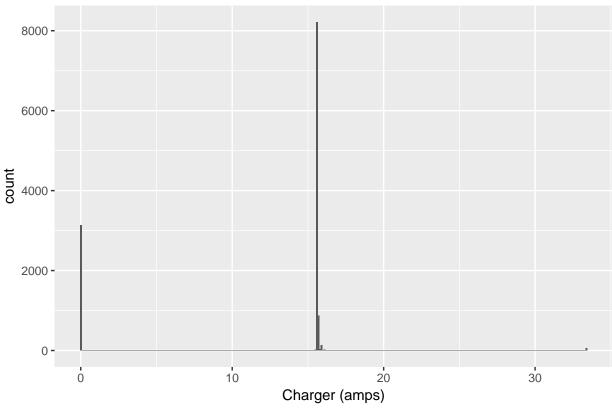
#### Load data files 3

### EV test data

In this section we load and describe the data from /Volumes/hum-csafe/Research Projects/GREEN Grid/ RAW DATA/flipTheFleet/EVBlackBox export 2018-06-10-233146.csv. Note that we remove the following variables before we do so as they are potentially disclosive:

- Reg No
- Latitude
- Longitude

```
• Course (deg)
## Parsed with column specification:
## cols(
##
     .default = col_integer(),
     `Reg No` = col_character(),
##
##
     `Date (GPS)` = col_character(),
     `Time (GPS)` = col time(format = ""),
##
     Latitude = col double(),
##
##
     Longitude = col_double(),
##
     Altitude = col_double(),
     `Speed (GPS)` = col_double(),
##
     `Speed (Speedometer)` = col_double(),
##
##
     `Course (deg)` = col_double(),
     SOC = col_double(),
##
##
     AHr = col_double(),
##
     `Pack volts` = col_double(),
     `Pack amps` = col_double(),
##
```



FlipTheFleet 'Black Box' test data for 1 car for 40 days from 2018-05-01 to 2018-06-11

Figure 2: Distribution of charger amp readings

```
`Pack 1 temp (C)` = col_double(),
##
     `Pack 2 temp (C)` = col_double(),
##
##
     `Pack 3 temp (C)` = col_double(),
##
     `Pack 4 temp (C)` = col_double(),
     `12V battery (amps)` = col_double(),
##
##
     Hx = col_double(),
     VIN = col_character()
##
##
     # ... with 16 more columns
## )
## See spec(...) for full column specifications.
```

Create some useful derived variables.

```
# create derived variables
ftfSafeDT <- createDerivedFtF(ftfSafeDT)</pre>
```

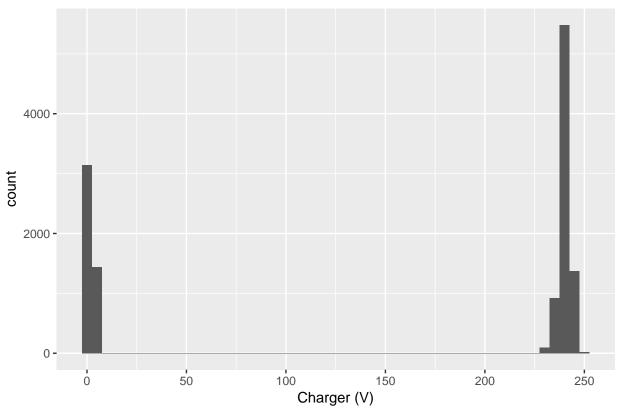
## Warning: 1160 failed to parse.

See ftFBlackBoxTestDataCodebook.docx for a full description of the data.

Check charger related variables. We think these are:

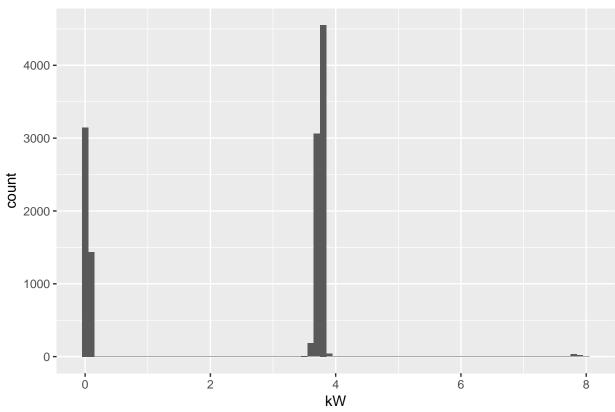
- Charger (amps)
- Charger (V)

Multiplying these two will give power in W. Figures 2 to 4 examine the distribution of amps, volts and the derived W.



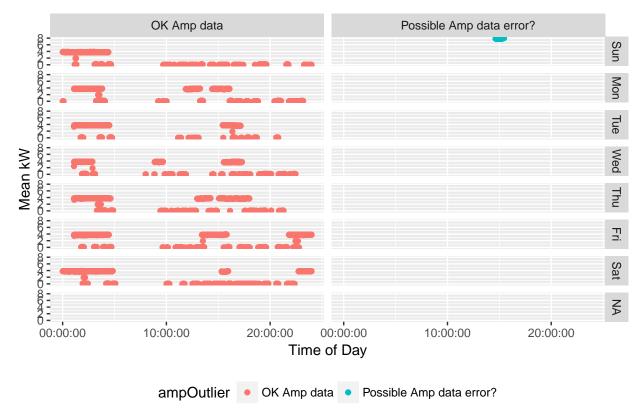
FlipTheFleet 'Black Box' test data for 1 car for 40 days from 2018-05-01 to 2018-06-11

Figure 3: Distribution of charger volt readings



FlipTheFleet 'Black Box' test data for 1 car for 40 days from 2018-05-01 to 2018-06-11

Figure 4: Distribution of derived power demand



FlipTheFleet 'Black Box' test data for 1 car for 40 days from 2018-05-01 to 2018-06-11

Figure 5: Inferred charging times and power draw (all data)

The following table sumarises these distributions.

Charger (amps)	Charger (V)	powerW
Min.: 0.00	Min.: 0.000	Min.: 0
1st Qu.: 0.00	1st Qu.: 1.055	1st Qu.: 0
Median $:15.62$	Median: 238.742	Median:3728
Mean : $11.77$	Mean $:153.032$	Mean:2404
3rd Qu.:15.62	3rd Qu.:241.164	3rd Qu.:3765
Max. $:33.44$	Max. $:249.445$	Max. :7977

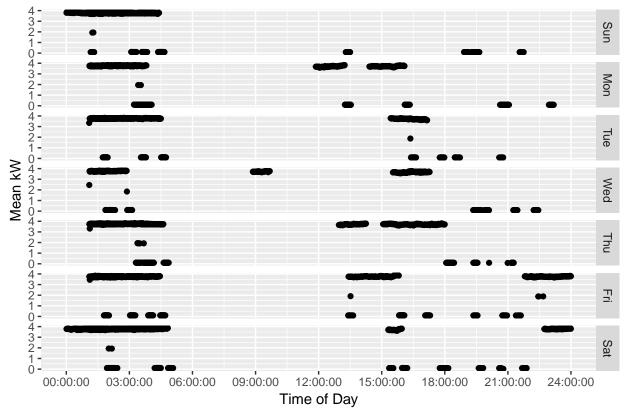
XX Is the Amp reading of 33 an outlier? If so should we ignore the  $\sim = 8kW$  values? XX

# 4 Timing of charging

We assume powerW is a good indicator of charging. For now we do not exclude the apparent outlier caused by the few very high Amp values (Charger (amps) > 30) but we flag them as potential problems.

The following plot shows mean kW by time of day over the entire test datset of 40 days from 2018-05-01 to 2018-06-11.

## Warning: Removed 1 rows containing missing values (geom\_point).



FlipTheFleet 'Black Box' test data for 1 car for 40 days from 2018-05-01 to 2018-06-11

Figure 6: Inferred charging times and power draw (outliers and exactly zero values excluded)

Figure 5 seems to show that the very high Amp values occurred on one Sunday. We re-draw this plot (Figure 6) excluding these outliers and also excluding values of exactly 0 for clarity.

We can see that this car appears to be on an overnight charging timer, although we do still see charging scattered through the rest of the day. So where is this charging happening? We need a way to infer when the car is 'at home' without being disclosive. Perhaps we could use the modal overnight Latitude <-> Longtidude as 'home'?

# 5 Questions to ask

- Data:
  - Do the Amp & Volt distributions look right?
  - Cause of Amp outliers?
- Research:
  - Do all FlipTheFleet EV owners charge like this?
  - Where are the EVs being charged and how can we tell?
  - Does it vary by car/tariff/commute pattern/main use?
  - What other patterns exist and how much within-vehicle and between-vehicle variation is there?

## 6 Runtime

Analysis completed in 10.53 seconds (0.18 minutes) using knitr in RStudio with R version 3.5.0 (2018-04-23) running on x86 64-apple-darwin15.6.0.

## 7 R. environment

R packages used:

- base R for the basics (R Core Team 2016)
- data.table for fast (big) data handling (Dowle et al. 2015)
- lubridate date manipulation (Grolemund and Wickham 2011)
- ggplot2 for slick graphics (Wickham 2009)
- readr for csv reading/writing (Wickham, Hester, and Francois 2016)
- dplyr for select and contains (Wickham and Francois 2016)
- knitr to create this document & neat tables (Xie 2016)
- nzGREENGrid for local NZ GREEN Grid project utilities

Session info:

```
## R version 3.5.0 (2018-04-23)
## Platform: x86_64-apple-darwin15.6.0 (64-bit)
## Running under: macOS High Sierra 10.13.5
## Matrix products: default
## BLAS: /Library/Frameworks/R.framework/Versions/3.5/Resources/lib/libRblas.0.dylib
## LAPACK: /Library/Frameworks/R.framework/Versions/3.5/Resources/lib/libRlapack.dylib
##
## locale:
## [1] en GB.UTF-8/en GB.UTF-8/en GB.UTF-8/C/en GB.UTF-8/en GB.UTF-8
##
## attached base packages:
## [1] stats
                 graphics grDevices utils
                                                datasets methods
                                                                    base
##
## other attached packages:
## [1] knitr_1.20
                         readr 1.1.1
                                            lubridate_1.7.4
                                                              ggplot2_2.2.1
## [5] dplyr_0.7.5
                         data.table_1.11.4 nzGREENGrid_0.1.0
##
## loaded via a namespace (and not attached):
  [1] Rcpp_0.12.17
##
                          highr_0.7
                                             pillar_1.2.3
   [4] compiler_3.5.0
                          plyr_1.8.4
                                             bindr_0.1.1
## [7] prettyunits_1.0.2 tools_3.5.0
                                             progress_1.2.0
## [10] digest_0.6.15
                          gtable_0.2.0
                                             evaluate 0.10.1
## [13] tibble_1.4.2
                          pkgconfig_2.0.1
                                             rlang_0.2.1
## [16] rstudioapi_0.7
                          yaml_2.1.19
                                             xfun 0.1
## [19] bindrcpp_0.2.2
                          stringr_1.3.1
                                             hms_0.4.2
## [22] rprojroot 1.3-2
                          grid_3.5.0
                                             tidyselect 0.2.4
## [25] glue_1.2.0
                          R6 2.2.2
                                             rmarkdown 1.10
## [28] bookdown 0.7
                          purrr_0.2.5
                                             reshape2 1.4.3
## [31] magrittr_1.5
                          scales_0.5.0
                                             backports_1.1.2
## [34] htmltools_0.3.6
                          assertthat_0.2.0
                                             colorspace_1.3-2
                                             lazyeval_0.2.1
## [37] labeling_0.3
                          stringi_1.2.3
## [40] munsell_0.5.0
                          crayon_1.3.4
```

## References

Dowle, M, A Srinivasan, T Short, S Lianoglou with contributions from R Saporta, and E Antonyan. 2015. *Data.table: Extension of Data.frame.* https://CRAN.R-project.org/package=data.table.

Grolemund, Garrett, and Hadley Wickham. 2011. "Dates and Times Made Easy with lubridate." *Journal of Statistical Software* 40 (3): 1–25. http://www.jstatsoft.org/v40/i03/.

R Core Team. 2016. R: A Language and Environment for Statistical Computing. Vienna, Austria: R Foundation for Statistical Computing. https://www.R-project.org/.

Wickham, Hadley. 2009. *Ggplot2: Elegant Graphics for Data Analysis*. Springer-Verlag New York. http://ggplot2.org.

Wickham, Hadley, and Romain Francois. 2016. Dplyr: A Grammar of Data Manipulation. https://CRAN. R-project.org/package=dplyr.

Wickham, Hadley, Jim Hester, and Romain Francois. 2016. Readr: Read Tabular Data. https://CRAN. R-project.org/package=readr.

Xie, Yihui. 2016. Knitr: A General-Purpose Package for Dynamic Report Generation in R. https://CRAN. R-project.org/package=knitr.