Liposome Flux Assays in the Context of NavAb meet R

Motivation

- The difficulty of using the FLUOstar plate reader is analysis of data.
- The lab involved utilized MATLAB for conversion of a .DAT file into a csv file with normalized data for further analysis.
- The main issue is clearance for the MATLAB program resided with the post-doc (not important to me anymore) and the professor (also in my mental black hole), leaving me with the task of analyzing the data.
- Moreover, any differences in the lab procedure entailed recycling the code to accommodate for example loading samples vertically vs horizontally.
- Finally, importing .DBF files into Excel was not possible as data was imported in a distorted manner.
- The only solution was to develop R code to implement analysis of data using the .DBF output as opposed to the .DAT output.
- While the concern of recycling code wasn't really mine, I was also ambitious to see if I could achieve recursive code without needing to rewrite code if lab personnel performed the same task differently.
- As will be seen recursion was not achieved although still a work in progress but so far it seems my solution might lie within shiny apps after some clean up of the transformed .DBF file.

Importing Cleaned Data Sets into R

• The procedure for cleaning up the data sets will be provided in jupyter notebook as Rmarkdown seems to force organization and as said earlier, this is not my most sophisticated work.

```
#import my principal data set
navab227_norm2 <- read.csv(file = 'navab227_norm3.csv', header = T)
navab221_avgnorm <- read.csv(file = 'navab221_norm3.csv', header = T)
head(navab227_norm2)</pre>
```

```
##
     WELLNUM Timeadj Time E01 E02 E03
                                       E04
                                            E05
                                                  E06
                                                        E07
                                                              E08
                                                                    E09 F01 F02 F03
## 1
                   0
                       30 273 299 259 2155 2090 2024 10533 10170 10243 352 279 187
## 2
           2
                  30
                       60 266 294 253 2132 2082 1992 10429 10159 10166 344
## 3
           3
                  60
                       90 266 295 255 2121 2080 1994 10389 10098 10116 338 265 175
## 4
                  90
                      120 270 291 257 2123 2088 1971 10302 10130 10080 345
           5
## 5
                 120
                          263 284
                                  255 2113 2097 1971 10312 10081 10106 343
##
           6
                 150
                      180
                          268 289
                                  249 2112 2089 1967 10239
                                                             9953 10007 346
                                                                            269
           F05
                                                              G06
##
      F04
                F06
                      F07
                            F08
                                  F09 G01 G02 G03
                                                   G04
                                                         G05
                                                                   G07
## 1 1821 1813 1805 11077 11079 10672 187 163 168 1608 1760 1601 9280 9236 8882
  2 1806 1783 1789 10980 10916 10571 182 171 168 1613 1760 1587 9232 9111 8761
  3 1792 1777 1780 10939 10928 10544 180 157 159 1606 1765 1589 9209 9110 8772
  4 1812 1798 1779 10974 11011 10545 179 156 158 1603 1752 1591 9180 9104 8746
## 5 1802 1790 1789 10946 10891 10499 178 165 161 1606 1753 1583 9085 9074 8742
     1812 1779 1799 11003 10989 10597 179
                                          159 163 1622 1758 1598 9102 9062 8754
##
         E2uA
                  F2uA
                           G2uA
                                    E2norm
                                              F2norm
                                                        G2norm
                                                                  E20uA
                                                                           F20uA
## 1 2089.667 1813.000 1656.333 1.0000000 1.0000000 0.9861751 10315.33 10942.67
## 2 2068.667 1792.667 1653.333 0.8917526 0.8880734 0.9723502 10251.33 10822.33
## 3 2065.000 1783.000 1653.333 0.8728522 0.8348624 0.9723502 10201.00 10803.67
## 4 2060.667 1796.333 1648.667 0.8505155 0.9082569 0.9508449 10170.67 10843.33
## 5 2060.333 1793.667 1647.333 0.8487973 0.8935780 0.9447005 10166.33 10778.67
```

```
## 6 2056.000 1796.667 1659.333 0.8264605 0.9100917 1.0000000 10066.33 10863.00
       G2011A
               E20norm F20norm
                                  G20norm
                                               EO11A FO11A GO11A
## 1 9132.667 0.45405112 1.0000000 0.39800285 277.0000 272.6667 172.6667 1.0000000
## 2 9034.667 0.34964655 0.9078376 0.18830242 271.0000 267.0000 173.6667 0.7500000
## 3 9030.333 0.26753670 0.8935410 0.17902996 272.0000 259.3333 165.3333 0.7916667
## 4 9010.000 0.21805329 0.9239214 0.13552069 272.6667 268.0000 164.3333 0.8194444
## 5 8967.000 0.21098423 0.8743937 0.04350927 267.3333 267.0000 168.0000 0.5972222
## 6 8972.667 0.04785209 0.9389839 0.05563481 268.6667 266.3333 167.0000 0.6527778
       FOnorm
                GOnorm X
                                       X.1
                                                   X.2
## 1 1.0000000 0.953125 NA
## 2 0.8731343 1.000000 NA
## 3 0.7014925 0.609375 NA standard error 2uM
                                             Neg
## 4 0.8955224 0.562500 NA Exp
                           0.047957719 0.050837673 0.051479985
## 5 0.8731343 0.734375 NA
## 6 0.8582090 0.687500 NA
```

head(navab221_avgnorm)

```
WELLNUM Time A01 A02 A03 A04 A05 A06 A07 A08 A09 A10 A11 A12 B01
          1 0 4532 4977 4675 6757 6859 6556 7783 7957 7912 9212 9056 9312 4365
              33 4447 4885 4618 6673 6739 6506 7639 7827 7770 8996 8898 8984 4312
              66 4391 4842 4544 6634 6655 6473 7586 7769 7714 8848 8758 8979 4281
## 3
              99 4342 4768 4512 6501 6624 6435 7511 7717 7633 8776 8731 8933 4265
            132 4353 4791 4496 6566 6552 6481 7528 7666 7658 8818 8647 8884 4280
          6 165 4338 4741 4489 6505 6559 6415 7482 7692 7636 8768 8641 8884 4270
     B02 B03 B04 B05 B06 B07 B08 B09 B10 B11 B12 C01 C02 C03 C04
## 1 4396 4651 6986 6784 6480 8275 7828 7695 9124 8960 8775 3817 3694 3753 5760
## 2 4310 4576 6880 6727 6370 7949 7665 7593 8935 8803 8630 3758 3635 3713 5645
## 3 4262 4507 6804 6677 6343 7898 7623 7508 8879 8759 8470 3710 3576 3663 5561
## 4 4248 4466 6749 6593 6294 7883 7571 7496 8738 8732 8405 3693 3557 3654 5564
## 5 4237 4471 6791 6648 6289 7877 7541 7460 8773 8709 8430 3683 3572 3610 5510
## 6 4222 4446 6810 6534 6247 7850 7461 7420 8661 8617 8389 3698 3562 3609 5530
      CO5 CO6 CO7 CO8 CO9 C10 C11 C12
                                             P5um
                                                       N5um
                                                                 E5um
## 1 5807 5381 6751 6671 145 7889 7778 7267 7644.667 8953.000 9193.333 1.0000000
## 2 5710 5344 6618 6502 145 7786 7654 7133 7524.333 8789.333 8959.333 0.9320918
## 3 5644 5271 6579 6450 139 7769 7568 7051 7462.667 8702.667 8861.667 0.8972912
## 4 5661 5300 6562 6405 143 7761 7552 7038 7450.333 8625.000 8813.333 0.8903311
## 5 5567 5190 6536 6358 162 7728 7521 6986 7411.667 8637.333 8783.000 0.8685102
## 6 5575 5232 6531 6333 187 7705 7434 6975 7371.333 8555.667 8764.333 0.8457487
       Nnorm5
                 Enorm5
                             T2a
                                      T3a
                                              T4a
                                                       T5a
                                                               T2norm
## 1 1.0000000 1.0000000 4728.000 6724.000 7884.000 9193.333 1.0000000 1.0000000
## 2 0.9124777 0.8923478 4650.000 6639.333 7745.333 8959.333 0.9008895 0.9129242
## 3 0.8661319 0.8474160 4592.333 6587.333 7689.667 8861.667 0.8276154 0.8594446
## 4 0.8245989 0.8251802 4540.667 6520.000 7620.333 8813.333 0.7619653 0.7901954
## 5 0.8311943 0.8112253 4546.667 6533.000 7617.333 8783.000 0.7695892 0.8035653
## 6 0.7875223 0.8026376 4522.667 6493.000 7603.333 8764.333 0.7390936 0.7624272
                 T5norm
                            E3um
                                     N3um
                                              P3um
                                                      Enorm3
## 1 1.0000000 1.0000000 6724.000 6750.000 5649.333 1.0000000 1.0000000 1.0000000
## 2 0.8624793 0.8923478 6639.333 6659.000 5566.333 0.9129242 0.9327917 0.9365605
## 3 0.8072727 0.8474160 6587.333 6608.000 5492.000 0.8594446 0.8951256 0.8797452
## 4 0.7385124 0.8251802 6520.000 6545.333 5508.333 0.7901954 0.8488429 0.8922293
## 5 0.7355372 0.8112253 6533.000 6576.000 5422.333 0.8035653 0.8714919 0.8264968
## 6 0.7216529 0.8026376 6493.000 6530.333 5445.667 0.7624272 0.8377646 0.8443312
        E2um
                 N2um
                          P2um
                                  Enorm2 Nnorm2
                                                      Pnorm2 X
## 1 4728.000 4470.667 3754.667 1.0000000 1.0000000 1.0000000 NA
```

```
## 2 4650.000 4399.333 3702.000 0.9008895 0.9229107 0.8965291 NA
## 3 4592.333 4350.000 3649.667 0.8276154 0.8695965 0.7937132 NA
## 4 4540.667 4326.333 3634.667 0.7619653 0.8440202 0.7642436 NA
## 5 4546.667 4329.333 3621.667 0.7695892 0.8472622 0.7387033 NA
## 6 4522.667 4312.667 3623.000 0.7390936 0.8292507 0.7413229 NA
##
                    X.1
                           Enorm2.1
                                       Nnorm2.1 Pnorm2.1
## 1
## 2
## 3
## 4 standard error 3uM
                                            Pos
                    Exp
                                Neg
            0.047957719 0.050837673 0.051479985
## 6
```

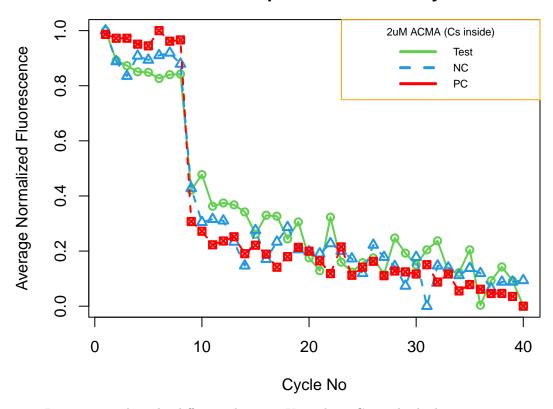
Visualization of Fluorescence

- A plot of average normalized fluorescence (y) vs Cycle No (a proxy for time) in normal or signal conditions.
- There is some biology behind this plot and this can only be understood by comparing conditions were potassium NOT Cesium is placed within the liposome.
- The biophysics might be a lot to take in but basically, we cant make sense of the data without comparisons.

Plot Fluorescence vs Time proxy using base R

```
## Create an R Graphics Device or container for plots
windows(width = 4.5, height = 4)
opar <- par(no.readonly = TRUE)
\#par(mar = c(5, 5, 4, 6))
par(mar = c(4, 4, 3, 5))
plot.signal1 <- function(x){</pre>
  plot(E2norm ~ WELLNUM, data = navab227_norm2, type = "o", frame = T,
       pch = 1, col = 3, lwd = 2, xlim = c(1,40), main = "NavAb Liposome Flux Assay",
       xlab = "Cycle No", ylab = "Average Normalized Fluorescence")
  # Add a second line
  lines(F2norm ~ WELLNUM, data = navab227_norm2, pch = 2, col = 4,
        type = "o", 1ty = 2, 1wd = 2)
  #lines(f6smooth ~ Time, data = navablfa_norm, pch = 2, col = 4, type = "o", lty = 2, lwd = 2)
  # Add a third line
  lines(G2norm ~ WELLNUM, data = navab227_norm2, pch = 7, col = "red",
        type = "o", 1ty = 2, 1wd = 2)
  \#lines(g6smooth \sim Time, data = navablfa\_norm, pch = 7, col = "red", type = "o", lty = 2, lwd = 2)
  legend("topright", inset = c(0.0, 0), legend=c("Test", "NC", "PC"),
         title = "2uM ACMA (Cs inside)", title.col = "black", box.lwd = 1,
         box.col = "orange", col=c(3,4,"red"), lty = 1:2, lwd = 3,
         cex=0.7, xpd = T)
}
# call function (it works but output is on an external window)
#images are attached to show the comparison explained
plot.signal1()
```

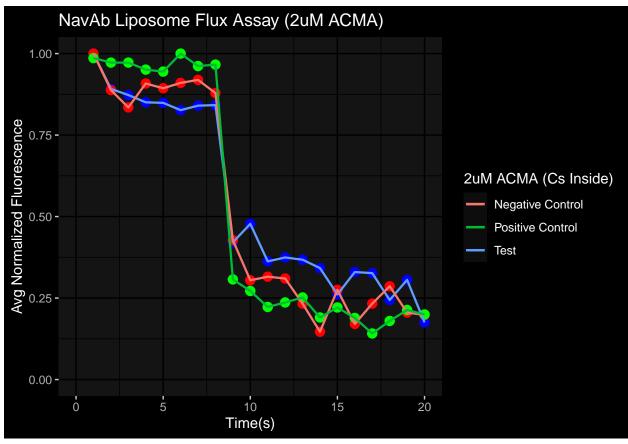
NavAb Liposome Flux Assay



• Images to explain the difference between K inside vs Cs inside the liposome

```
# Plot in signal zone for Cs inside
library(ggplot2)
library(ggdark)
library(ggthemes)
p1 = ggplot(navab227_norm2, aes(x=WELLNUM)) +
  geom_point(aes(y=E2norm), size=3, color="blue") +
  geom_point(aes(y=F2norm), size=3, color="red") +
  geom_point(aes(y=G2norm), size=3, color="green") +
  geom_line(aes(y=E2norm, color='Test'), size=0.8) +
  geom_line(aes(y=F2norm, color='Negative Control'), size =0.8) +
  geom_line(aes(y=G2norm, color='Positive Control'), size =0.8) +
  dark mode()+
  xlim(0,20) +
  ylim(0,1) +
  labs(title = 'NavAb Liposome Flux Assay (2uM ACMA)',
       x = 'Time(s)', y='Avg Normalized Fluorescence', color='2uM ACMA (Cs Inside)')
## Inverted geom defaults of fill and color/colour.
## To change them back, use invert_geom_defaults().
# call plot
p1 #or print(p1)
## Warning: Removed 20 rows containing missing values (geom_point).
## Removed 20 rows containing missing values (geom_point).
## Removed 20 rows containing missing values (geom_point).
```

```
## Warning: Removed 20 row(s) containing missing values (geom_path).
## Removed 20 row(s) containing missing values (geom_path).
## Removed 20 row(s) containing missing values (geom_path).
```

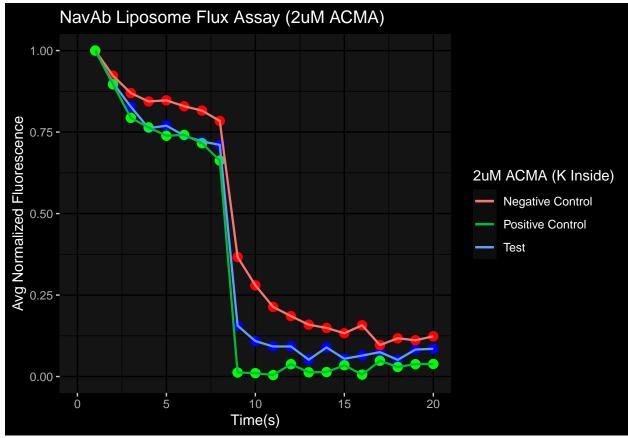


```
#Plot in signal zone for K inside
\#E, N, P = exp, neg and pos respectively
#Ensure to take notes, i was working for hours and had no idea
#why i called them this
p2 = ggplot(navab221_avgnorm, aes(x=WELLNUM)) +
  geom_point(aes(y=Enorm2), size=3, color="blue") +
  geom_point(aes(y=Nnorm2), size=3, color="red") +
  geom_point(aes(y=Pnorm2), size=3, color="green") +
  geom_line(aes(y=Enorm2, color='Test'), size=0.8) +
  geom_line(aes(y=Nnorm2, color='Negative Control'), size =0.8) +
  geom_line(aes(y=Pnorm2, color='Positive Control'), size =0.8) +
  dark_mode()+
  xlim(0,20) +
  ylim(0,1) +
  labs(title = 'NavAb Liposome Flux Assay (2uM ACMA)',
       x = 'Time(s)', y='Avg Normalized Fluorescence', color='2uM ACMA (K Inside)')
# call plot
p2 #or print(p1)
```

Warning: Removed 20 rows containing missing values (geom_point).

Removed 20 rows containing missing values (geom_point).

```
## Warning: Removed 20 row(s) containing missing values (geom_path).
## Removed 20 row(s) containing missing values (geom_path).
## Removed 20 row(s) containing missing values (geom path).
```

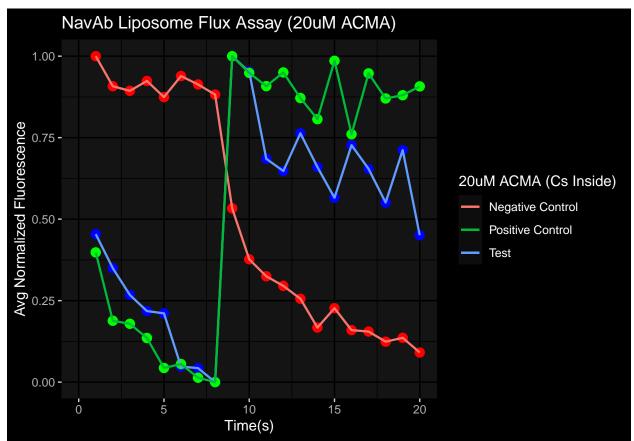


- The spoiler is when you look at the plots, you can tell the increased volatility in signal when Cs is inside relative to K inside and this is likely because Navab-Cs interactions are likely more non-specific making the result with Cs inside less predictable. - Another spoiler, within the signal zone (2uM, 3uM, 5uM are currently tested values) the results above are more predictable than not. I will reveal the signal zone at the end which is my opinion because the lower boundary is not well determined. - More in Beamer.

Enough about the signal zone (Let's talk about noise)

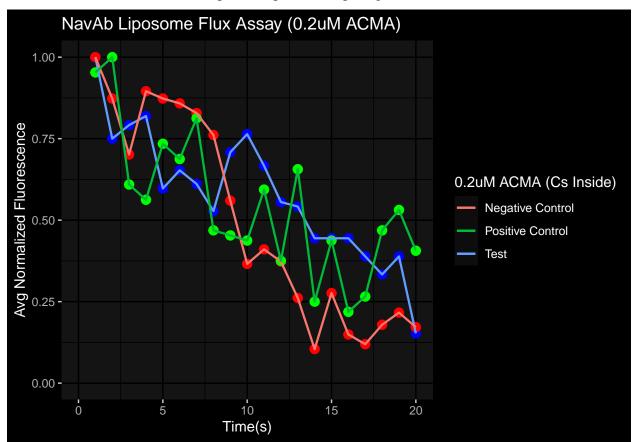
- Out of the signal zone or at least at the boundary of the signal zone (>=) I notice an inversion of some parts of our results from the signal zone and in other cases, extreme unpredictability (especially the lower boundary).
- Upper boundary of signal zone towards the noise zone

```
#plotting in the noise zone at >=(20uM-inf) with Cs inside
p3 = ggplot(navab227_norm2, aes(x=WELLNUM)) +
geom_point(aes(y=E20norm), size=3, color="blue") +
geom_point(aes(y=F20norm), size=3, color="red") +
geom_point(aes(y=G20norm), size=3, color="green") +
geom_line(aes(y=E20norm, color='Test'), size=0.8) +
geom_line(aes(y=F20norm, color='Negative Control'), size =0.8) +
geom_line(aes(y=G20norm, color='Positive Control'), size =0.8) +
dark_mode()+
xlim(0,20) +
```



• Lower boundary of signal zone towards the noise zone

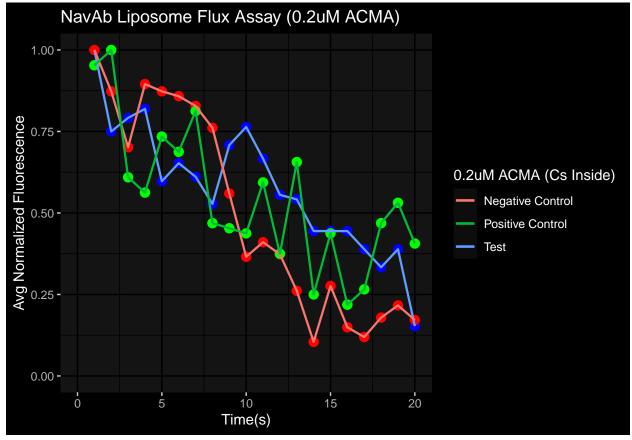
```
#plotting in the noise zone at <=(1-2) with Cs inside
p4 = ggplot(navab227_norm2, aes(x=WELLNUM)) +
    geom_point(aes(y=E0norm), size=3, color="blue") +
    geom_point(aes(y=F0norm), size=3, color="red") +
    geom_point(aes(y=G0norm), size=3, color="green") +
    geom_line(aes(y=E0norm, color='Test'), size=0.8) +
    geom_line(aes(y=F0norm, color='Negative Control'), size =0.8) +
    geom_line(aes(y=G0norm, color='Positive Control'), size =0.8) +
    dark_mode()+
    xlim(0,20) +</pre>
```



ACMA concentration within the signal zone is predictable

- Within the signal zone varying ACMA concentration drives similar behavior in the system.
- We could expect differences but that is not the reality

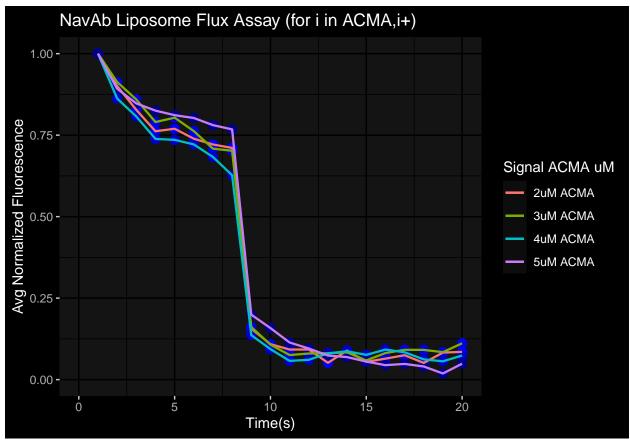
```
#plotting in the noise zone at <=(1-2) with Cs inside
p4 = ggplot(navab227_norm2, aes(x=WELLNUM)) +
  geom_point(aes(y=E0norm), size=3, color="blue") +
  geom_point(aes(y=F0norm), size=3, color="red") +
  geom_point(aes(y=G0norm), size=3, color="green") +
  geom_line(aes(y=E0norm, color='Test'), size=0.8) +
  geom_line(aes(y=F0norm, color='Negative Control'), size =0.8) +</pre>
```



```
# The driver of control point of this signal noise zones (ACMA)
# concentrations of ACMA drive signal-noise zones advocating balance

p5 = ggplot(navab221_avgnorm, aes(x=WELLNUM)) +
    geom_point(aes(y=T2norm), size=3, color="blue1") +
    geom_point(aes(y=T3norm), size=3, color="blue2") +
    geom_point(aes(y=T4norm), size=3, color="blue3") +
    geom_point(aes(y=T5norm), size=3, color="blue4") +
```

```
geom_line(aes(y=T2norm, color='2uM ACMA'), size=0.8) +
  geom_line(aes(y=T3norm, color='3uM ACMA'), size =0.8) +
  geom_line(aes(y=T4norm, color='4uM ACMA'), size =0.8) +
  geom_line(aes(y=T5norm, color='5uM ACMA'), size =0.8) +
  dark_mode()+
  xlim(0,20) +
  ylim(0,1) +
  labs(title = 'NavAb Liposome Flux Assay (for i in ACMA, i+)',
       x = 'Time(s)', y='Avg Normalized Fluorescence', color='Signal ACMA uM')
# call plot
p5 #or print(p1)
## Warning: Removed 20 rows containing missing values (geom_point).
## Warning: Removed 20 rows containing missing values (geom_point).
## Removed 20 rows containing missing values (geom_point).
## Removed 20 rows containing missing values (geom_point).
## Warning: Removed 20 row(s) containing missing values (geom_path).
## Removed 20 row(s) containing missing values (geom_path).
## Removed 20 row(s) containing missing values (geom_path).
## Removed 20 row(s) containing missing values (geom_path).
```



Takebacks

• Very complex and cerebral project

- Signal-Noise ratios are important to know when understanding a system
- A failure to know this prevents good interpretation of results
- Final spoiler, my opinion is the signal ration is 2 <= x >= 20
- I am more certain of the upper boundary than I am of the lower and now that I say that even the upper boundary is not well known.
- This is very rudimentary coding and I am curious to see a more sophisticated approach from anyone
- Also the next step is automation of DBF to CVS conversion using R shiny apps.
- I am very proud of this project and check out my beamer.