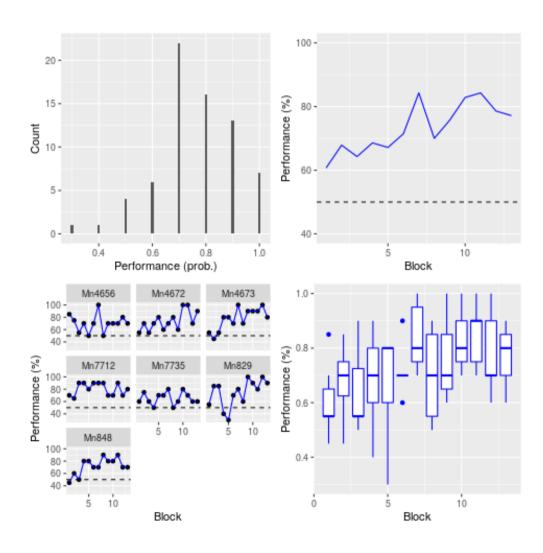
Data science and analysis in Neuroscience

Kevin Allen November 28, 2019

Today's plan

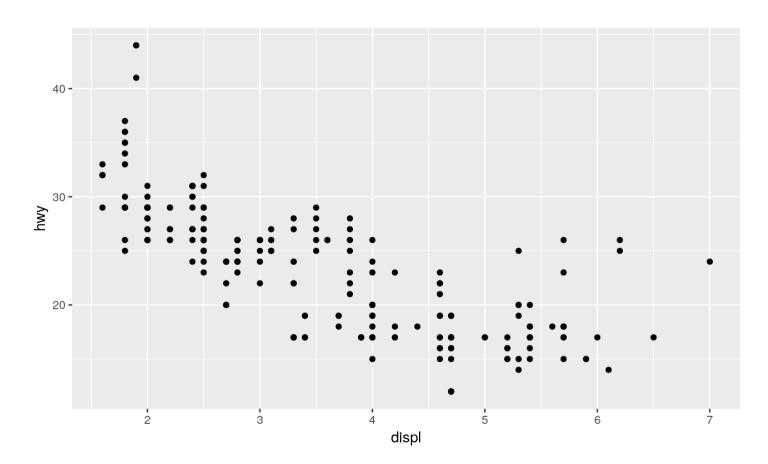
- 1. Review of last week
- 2. More exercises on dplyr and ggplot
- 3. Saving a graph
- 4. Plot with several graphs
- 5. git: create your git repository on github

Today's objective



Review: ggplot

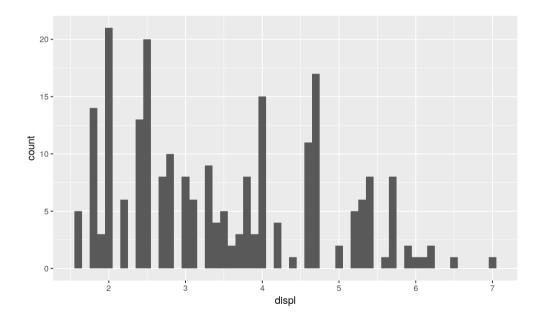
```
ggplot(data=mpg) +
  geom_point(mapping = aes(x = displ, y = hwy))
```



Count and distribution

Continuous variable

```
ggplot(data = mpg) +
  geom_histogram(mapping = aes(x=displ),binwidth = 0.1)
```



Review: dplyr

- 1. Pick observations (rows) by their values: filter()
- 2. Reorder the rows: arrange()
- 3. Pick variable (columns) by names: select()
- 4. Create new variables from existing variable: mutate()
- 5. Collapse many values down to a single summary: summarize()

Review: load data from a file

```
myFile="~/repo/dataNeuroCourse/dataSets/tmaze.csv"
df<-read csv(myFile)</pre>
## Parsed with column specification:
## cols(
    mouse = col character(),
     date = col_date(format = ""),
     injection = col character(),
##
    block = col double(),
    trialNo = col_double(),
##
     sample = col character(),
##
     choice = col character()
##
## )
df<-mutate(df, correct = sample != choice)</pre>
```

Review: load data from a file

df

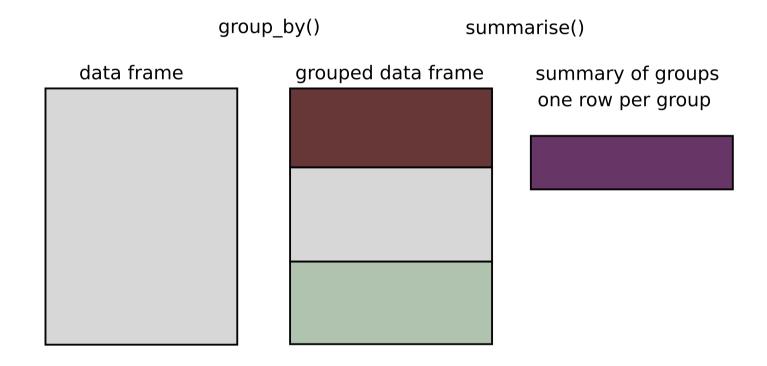
```
# A tibble: 1,120 x 8
##
      mouse date
                        injection block trialNo sample choice correct
                                  <dbl>
                                           <dbl> <chr> <chr> <lql>
      <chr> <date>
                        <chr>
##
    1 Mn4656 2019-10-09 Saline
                                               1 L
                                                        R
                                                               TRUE
    2 Mn4656 2019-10-09 Saline
                                                               FALSE
##
                                               2 1
    3 Mn4656 2019-10-09 Saline
                                               3 R
                                                               FALSE
##
    4 Mn4656 2019-10-09 Saline
                                                               TRUE
                                               4 L
##
    5 Mn4656 2019-10-09 Saline
                                               5 R
                                                               TRUE
    6 Mn4656 2019-10-09 Saline
                                                               FALSE
                                               6 R
##
    7 Mn4656 2019-10-09 Saline
                                                               TRUE
                                               7 L
##
    8 Mn4656 2019-10-09 Saline
                                                               TRUE
                                               8 L
    9 Mn4656 2019-10-09 Saline
                                                               TRUE
                                               9 R
##
   10 Mn4656 2019-10-09 Saline
                                              10 L
                                                        R
                                                               TRUE
## # ... with 1,110 more rows
```

Review: summarise

```
summarise(df, performance = mean(correct))
## # A tibble: 1 x 1
## performance
## <dbl>
## 1 0.716
```

Review: group_by and summarise

Collapse according to some groups.



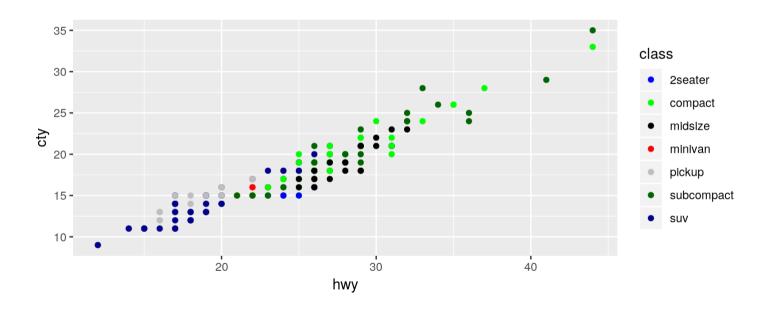
Review: group_by and summarise

```
by df<-group by(df,mouse)</pre>
summarise(by df,performance= mean(correct))
## # A tibble: 7 x 2
    mouse performance
    <chr>
                 <dbl>
## 1 Mn4656
           0.706
            0.712
## 2 Mn4672
## 3 Mn4673
            0.725
            0.794
## 4 Mn7712
## 5 Mn7735
                0.65
## 6 Mn829
                0.744
                 0.681
## 7 Mn848
```

Review: using the pipe symbole (%>%)

```
blockdf <- df %>%
  select(mouse,block,correct) %>%
  group by(block) %>%
  summarize(performance=mean(correct))
# print the first few lines
head(blockdf)
## # A tibble: 6 x 2
     block performance
     <dbl>
                 <dbl>
##
                 0.607
## 1
## 2
                 0.679
## 3
                 0.643
                 0.686
## 4
## 5
                 0.671
                 0.714
## 6
```

Question from last week



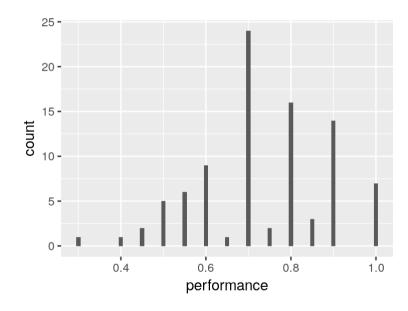
- · Create a data frame in which you have the performance of single mice on single blocks. Use the Pipe!
- Use the RStudio editor and save your code for later.

```
df %>%
  group_by(mouse,block) %>%
  summarise(performance = mean(correct))
## # A tibble: 91 x 3
## # Groups: mouse [7]
##
     mouse block performance
     <chr> <dbl>
                         <dbl>
##
    1 Mn4656
                          0.85
    2 Mn4656
                          0.75
                          0.55
    3 Mn4656
##
    4 Mn4656
                          0.7
##
    5 Mn4656
                          0.5
##
    6 Mn4656
                          0.7
##
##
    7 Mn4656
   8 Mn4656
                          0.5
##
    9 Mn4656
                          0.7
## 10 Mn4656
                10
                          0.7
## # ... with 81 more rows
```

• Plot a histogram showing the distribution of performance on every block and mouse (mouse1-block1, mouse1-block2, mouseN-blockN).

```
new_df<-df %>%
  group_by(mouse,block) %>%
  summarise(performance = mean(correct))

ggplot (data=new_df) +
  geom_histogram(mapping = aes(x = performance),binwidth=0.01)
```

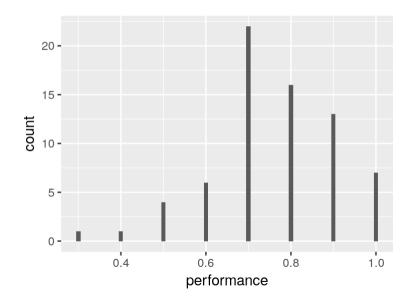


• The first 3 days of training (e.g, blocks) had 20 trials instead of 10. Plot the distribution of performance on every block and mouse, but only for blocks with 10 trials.

Solution 1

```
new_df <- df %>%
  group_by(mouse, block) %>%
  summarise(nTrials = n(), performance = mean(correct)) %>%
  filter(nTrials == 10) ## filter after summarise

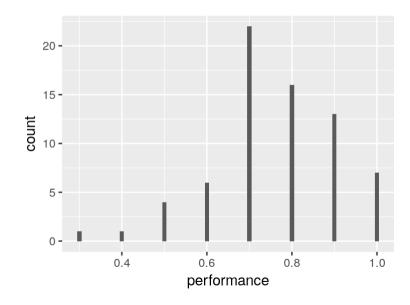
ggplot (data = new_df) +
  geom_histogram(mapping = aes(x = performance), binwidth = 0.01)
```



Solution 2

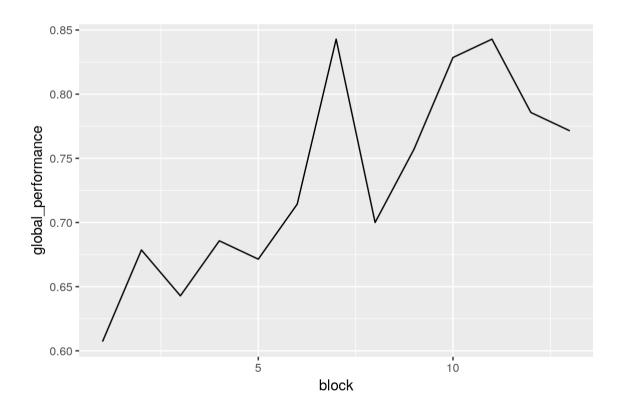
```
new_df <- df %>%
  filter(block > 3) %>% ## filter before summarise
  group_by(mouse, block) %>%
  summarise(performance = mean(correct))

ggplot (data = new_df) +
  geom_histogram(mapping = aes(x = performance), binwidth = 0.01)
```



 Make a plot showing the mean performance of mice on each block. Use geom_line or geom_point.

```
df %>% group_by(mouse,block) %>%
  summarise(performance = mean(correct)) %>% # mean per mouse per block
  group_by(block) %>%
  summarise(global_performance = mean(performance)) %>% # mean per block
  ggplot() +
  geom_line(mapping=aes(x=block,y=global_performance))
```

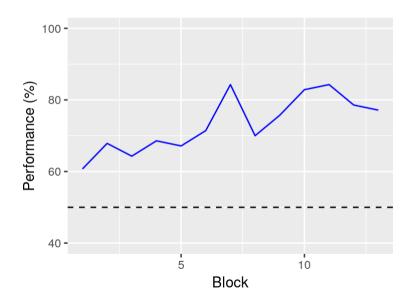


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Your supervisor is very picky. They want the following changes made to the last graph.

- 1. The performance should be in percentages instead of probability.
- 2. The line should be blue.
- 3. The x and y labels should be called "Performance (%)" and "Block", respectively
- 4. The range of the y axis to go from 40 to 100.
- 5. A horizontal line should be added at 50 % to indicate chance level.

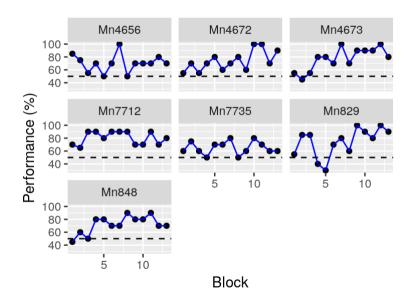
```
df %>% group_by(mouse,block) %>%
   summarise(performance = mean(correct)*100) %>%
   group_by(block) %>%
   summarise(global_performance = mean(performance)) %>%
   ggplot() +
   geom_line(mapping=aes(x=block,y=global_performance),color="blue")+
   ylim(40,100) +
   xlab("Block") +
   ylab("Performance (%)")+
   geom_hline(mapping = aes(yintercept=50),linetype="dashed")
```



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 Do you think all mice learned equally? It would be great to have a plot for each mouse. Use the facet_wrap function to plot several graphs into the same plot.

```
df1 <- df %>% group_by(mouse,block) %>%
    summarise(performance = mean(correct)*100)
ggplot(data=df1) +
    geom_point(mapping=aes(x=block,y=performance)) +
    geom_line(mapping=aes(x=block,y=performance),color = "blue") +
    ylab("Performance (%)") +
    xlab("Block") +
    geom_hline(mapping = aes(yintercept=50),linetype="dashed") +
    facet_wrap(~mouse)
```



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 It would be great to have a graph that displays this variability in performance without having to show the 7 mice separately. How could we do this?

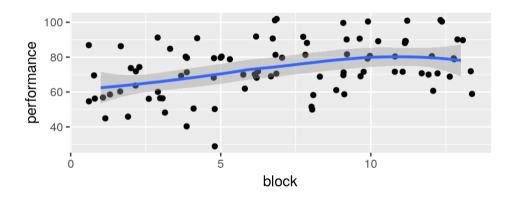
```
#dfl is the data frame we just created
df1 %>%
  ggplot() +
  geom_point(mapping=aes(x=block,y=performance))+
  geom_smooth(mapping=aes(x=block,y=performance))
## geom_smooth() using method = 'loess' and formula 'y ~ x'
  100 -
performance
                                  10
                        block
```

Do you see any problems with this plot?

Use some jitter to solve overplotting. This solve the overplotting but is less precise!

```
df1 %>%
    ggplot() +
    geom_point(mapping=aes(x=block,y=performance),position="jitter")+
    geom_smooth(mapping=aes(x=block,y=performance))
```

$geom_smooth()$ using method = 'loess' and formula 'y ~ x'

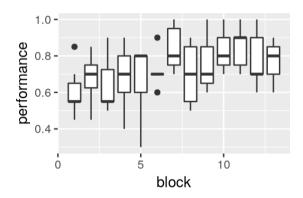


Most people will not like this solution. The block separation is gone.

```
df1 %>%
ggplot(aes(x = factor(block), y = performance)) +
  geom_dotplot(binaxis = "y", stackdir = "center") +
  geom_smooth(mapping=aes(x=block,y=performance))
## `stat bindot()` using `bins = 30`. Pick better value with `binwidth`.
## geom_smooth() using method = 'loess' and formula 'y ~ x'
  100 -
performance
                                  10 11 12 13
                     factor(block)
```

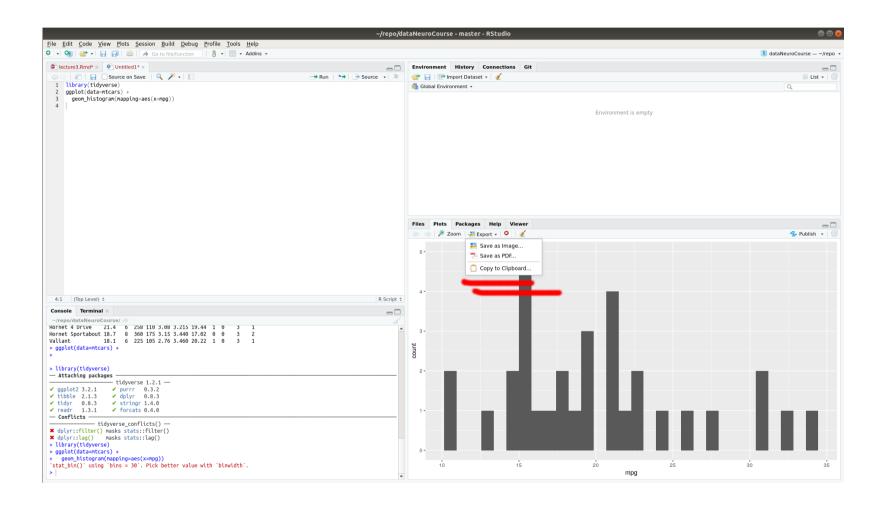
Each point now clearly belongs to a block. This is pretty good.

```
df1 <- df %>% group_by(mouse,block) %>%
   summarise(performance = mean(correct))
df1 %>%
   ggplot() +
   geom_boxplot(mapping=aes(x=block,y=performance,group=block))
```



This is also pretty good.

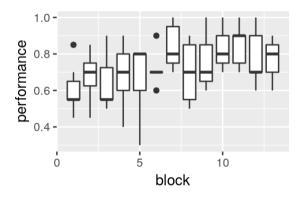
Saving a graph



Saving a graph

ggsave() saves the latest plot that was displayed

```
df1 %>%
   ggplot() +
   geom_boxplot(mapping=aes(x=block,y=performance,group=block))
```



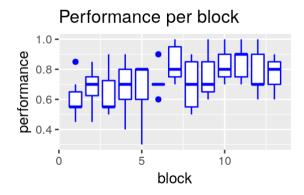
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Plot with several graphs

Store graphs as variables

```
p1<- df1 %>%
    ggplot() +
    geom_boxplot(mapping=aes(x=block,y=performance,group=block),color="blue")+
    ggtitle("Performance per block")
```

p1



Plot with several graphs

Let's store several graphs in variables

```
p1 <- df %>%
  group_by(mouse, block) %>%
  summarise(nTrials = n(), performance = mean(correct)) %>%
  filter(nTrials == 10) %>%
  ggplot () +
   geom_histogram(mapping = aes(x = performance), binwidth = 0.01) +
   xlab("Performance (prob.)") +
   ylab("Count")
```

```
p2 <- df %>% group_by(mouse,block) %>%
   summarise(performance = mean(correct)*100) %>%
   group_by(block) %>%
   summarise(global_performance = mean(performance)) %>%
   ggplot() +
   geom_line(mapping=aes(x=block,y=global_performance),color="blue")+
   ylim(40,100) +
   xlab("Block") +
   ylab("Performance (%)")+
   geom hline(mapping = aes(yintercept=50),linetype="dashed")
```

```
p3 <-df %>% group_by(mouse,block) %>%
  summarise(performance = mean(correct)*100) %>%
  ggplot() +
    geom_point(mapping=aes(x=block,y=performance)) +
    geom_line(mapping=aes(x=block,y=performance),color = "blue") +
    ylab("Performance (%)") +
    xlab("Block") +
    geom_hline(mapping = aes(yintercept=50),linetype="dashed") +
    facet_wrap(~mouse)
```

```
p4 <- df %>% group_by(mouse,block) %>%
   summarise(performance = mean(correct)) %>%
   ggplot() +
   geom_boxplot(mapping=aes(x=block,y=performance*100,group=block),color="blue") +
   ylab("Performance (%)") +
   xlab("Block")
```

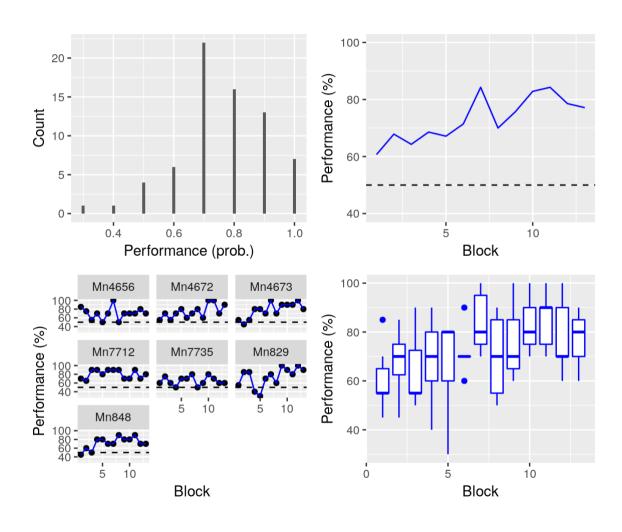
Now put these graphs together.

```
library(grid)
library(gridExtra)

##
## Attaching package: 'gridExtra'

## The following object is masked from 'package:dplyr':
##
## combine
```

grid.arrange(p1, p2, p3, p4, ncol=2)



Use pdf() and dev.off() to save your new creation.

```
myFileName="/home/kevin/Downloads/allMyPlots.pdf"
pdf(file=myFileName,paper = "a4") # open the file
all_ps <- grid.arrange(p1, p2, p3, p4, ncol=2) # write
dev.off() # close the file

## png
## 2</pre>
```

git: install

Install git on your computer

- Windows and Mac: (http://git-scm.com/downloads)
- linux: sudo apt-get install git-core

Example for Windows: Download for Windows, Run executable, license next, default location, will install git bash. Use Git and optional Unix tools from the Windows Command Prompt, 3 x next with default

Set up RStudio

- 1. Go to Global Options (from the Tools menu)
- 2. Click Git/SVN
- 3. Click Enable version control interface for RStudio projects

For more information

Create a repository on GitHub.

- 1. Create an account at GitHub and verify your email
- 2. Log in
- 3. Click New repository
- 4. Set repository name: myNotesDataScience, set to private, check Initialize this repository with a README
- 5. Click Create repository

Create a project with RStudio from your repository

- Copy the urs of your repository from the github web site. It ends with .git
- 2. Open RStudio, New Project..., Version Control, Git,
- 3. Enter the url and set directory.
- 4. Create project.

Your first commit and push

- 1. Click on commit.
- 2. Make sure myNotesDataScience.Rproj is staged.
- 3. Set commit message to my first commit
- 4. Click commit
- 5. Click on the up arrow to push your commit to the online repository.
- 6. Refresh your web browser to see myNotesDataScience.Rproj online.

Next steps...

All you will have to do most of the time.

- 1. Save the file with your R code in your project directory.
- 2. Stage the file
- 3. Commit
- 4. Push