## Brendon EDA

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#### Exec Summary

- Centroid of "types" (triangles, big cirlces, and red circles) appear to relate to ability to predict correct centroid quadrant.
- More "types" in the correct quadrant helps to predict correct quadrant.
- Decent amount of per-person variability. Mixed model would be good.
- $\bullet\,$  Appears on average, as  ${\tt howManyCorr}$  increases so does odds of correct prediction
- The further the true centroid is from the center, the easier to predict the corect quadrent
- Visual inspection for longitudinal effect . . . inconclusive. Prob good to check though.

```
library(ggplot2)
library(dplyr)
## Attaching package: 'dplyr'
## The following objects are masked from 'package:stats':
##
       filter, lag
## The following objects are masked from 'package:base':
##
##
       intersect, setdiff, setequal, union
library(reshape2)
library(dplyr)
library(tidyr)
##
## Attaching package: 'tidyr'
## The following object is masked from 'package:reshape2':
##
##
       smiths
library(knitr)
library(kableExtra)
##
## Attaching package: 'kableExtra'
## The following object is masked from 'package:dplyr':
##
##
       group_rows
df = read.csv("/Users/brendo/repos/CSU/Visual-Inference/src/data/WittData.csv", header=TRUE, sep=",")
df$isCorrect = df$resp == df$corrQuad
```

```
df$subj = as.factor(df$subj)
df$currImg = as.factor(df$currImg)
df$resp = as.factor(df$resp)
df$corrQuad = as.factor(df$resp)
df$isColSame = as.logical(df$isColSame)
df$isPulseSame = as.logical(df$isPulseSame)
df$isSizeSame = as.logical(df$isSizeSame)
```

#### **Check Total Correct**

```
sum(df$isCorrect) / length(df$isCorrect)
## [1] 0.4095192
```

#### Check Total Correct when isColSame is TRUE

```
sum(df[df$isColSame == TRUE, ]$isCorrect) / length(df[df$isColSame == TRUE, ]$isCorrect)
## [1] 0.4492591
```

#### Check Total Correct when isPulseSame is TRUE

```
sum(df[df$isColSame == TRUE, ]$isPulseSame) / length(df[df$isColSame == TRUE, ]$isPulseSame)
## [1] 0.3879197
```

#### Check Total Correct when isSizeSame is TRUE

```
sum(df[df$isColSame == TRUE, ]$isSizeSame) / length(df[df$isColSame == TRUE, ]$isSizeSame)
## [1] 0.4033014
```

# How many plots did each subject look at?

```
subjs = levels(df$subj)

for (i in 1:length(subjs)){
   subject_num = subjs[i]
   subject_df = df[df$subj == subject_num, ]
   print(paste(subject_num, nrow(subject_df)))
}

## [1] "1 200"
## [1] "2 200"
## [1] "3 200"
## [1] "4 200"
## [1] "5 200"
## [1] "6 200"
## [1] "7 200"
```

```
## [1] "8 200"
   [1] "9 200"
  [1] "10 200"
  [1] "11 200"
   [1] "12 200"
##
  [1] "13 200"
## [1] "14 200"
## [1] "15 200"
   [1] "16 200"
##
  [1] "17 200"
  [1] "18 200"
## [1] "19 200"
  [1] "20 200"
## [1] "21 200"
## [1] "22 200"
## [1] "23 200"
##
   [1] "24 200"
   [1] "25 200"
  [1] "26 200"
##
## [1] "27 200"
## [1] "28 200"
## [1] "29 200"
## [1] "30 200"
## [1] "31 200"
## [1] "32 200"
  [1] "33 200"
## [1] "34 200"
  [1] "35 200"
## [1] "36 200"
## [1] "37 200"
## [1] "38 200"
  [1] "39 200"
##
## [1] "40 200"
## [1] "41 200"
## [1] "42 200"
## [1] "43 200"
## [1] "44 200"
## [1] "45 200"
## [1] "46 200"
## [1] "47 200"
## [1] "48 200"
## [1] "49 200"
## [1] "50 200"
## [1] "51 200"
## [1] "52 200"
... I just can't do 52*200 in my head ... duch this is correct.
```

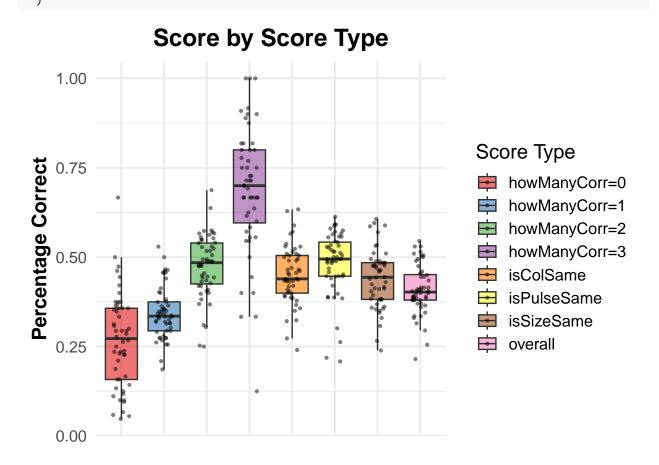
# Now lets look at scores for each subject

```
subjs = levels(df$subj)
score_vector = c()
```

```
for (i in 1:length(subjs)){
  subject_num = subjs[i]
  subject_df = df[df$subj == subject_num, ]
  overall_score = sum(subject_df$isCorrect) / length(subject_df$isCorrect)
  score_is_col = sum(subject_df[subject_df$isColSame == TRUE, ]$isCorrect) / length(subject_df[subject_
  score_is_pulse = sum(subject_df[subject_df$isPulseSame == TRUE, ]$isCorrect) / length(subject_df[subj
  score_is_size = sum(subject_df[subject_df$isSizeSame == TRUE, ]$isCorrect) / length(subject_df[subject_df]
  score_zero_correct = sum(subject_df[subject_df$howManyCorr == 0, ]$isCorrect) / length(subject_df[sub
  score_one_correct = sum(subject_df[subject_df$howManyCorr == 1, ]$isCorrect) / length(subject_df[subject_df]
  score_two_correct = sum(subject_df[subject_df$howManyCorr == 2, ]$isCorrect) / length(subject_df[subj
  score_three_correct = sum(subject_df[subject_df$howManyCorr == 3, ]$isCorrect) / length(subject_df[su
  score_vector = c(score_vector, overall_score, score_is_col, score_is_pulse, score_is_size, score_zero
}
score_df = data.frame(
 score = score_vector,
  score_type = rep(c("overall", "isColSame", "isSizeSame", "isPulseSame", "howManyCorr=0", "howManyCorr
  subject = rep(1:length(subjs), each = 8)
score_df$score_type = as.factor(score_df$score_type)
score_df$subject = as.factor(score_df$subject)
```

#### Score by Score Type

```
ggplot(score_df, aes(x = score_type, y = score, fill = score_type)) +
  geom_boxplot(outlier.shape = NA, alpha = 0.6) +
  geom_jitter(width = 0.2, size = 0.8, alpha = 0.5) +
  scale_fill_brewer(palette = "Set1") +
  labs(
   x = NULL,
   y = "Percentage Correct",
   title = "Score by Score Type",
   fill = "Score Type"
  theme minimal(base size = 15) +
 theme(
   plot.title = element_text(hjust = 0.5, face = "bold"),
   axis.title.x = element_blank(), # Remove x-axis title
   axis.text.x = element_blank(), # Remove x-axis text
   axis.ticks.x = element_blank(), # Remove x-axis ticks
   axis.title.y = element_text(face = "bold")
```



## Per Person Effect of howManycorr

```
subjs = levels(df$subj)
store = c()

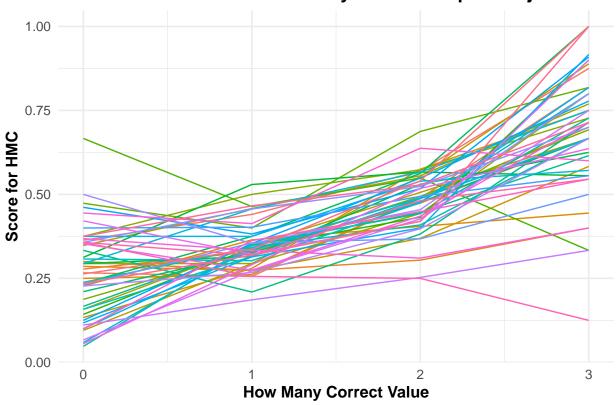
for (i in 1:length(subjs)){
    subject_num = subjs[i]
    subject_df = df[df$subj == subject_num, ]

    s_df_hmc0 = subject_df[subject_df$howManyCorr == 0, ]$isCorrect
    s_df_hmc1 = subject_df[subject_df$howManyCorr == 1, ]$isCorrect
    s_df_hmc2 = subject_df[subject_df$howManyCorr == 2, ]$isCorrect
    s_df_hmc3 = subject_df[subject_df$howManyCorr == 3, ]$isCorrect
    hmc0 = sum(s_df_hmc0) / length(s_df_hmc0)
    hmc1 = sum(s_df_hmc1) / length(s_df_hmc1)
    hmc2 = sum(s_df_hmc2) / length(s_df_hmc2)
    hmc3 = sum(s_df_hmc3) / length(s_df_hmc3)

    store = c(store, hmc0, hmc1, hmc2, hmc3)
}
```

```
hmc_df = data.frame(
 score = store,
 hmc = rep(0:3, length(subjs)),
 subject = rep(1:length(subjs), each = 4)
hmc_df$subject = as.factor(hmc_df$subject)
ggplot(hmc_df, aes(x=hmc, y=score, color=subject)) +
  geom_line(size=0.5) +
  # scale_color_brewer(palette = "Set1") +
 theme minimal(base size = 12) +
   labs(
   x = "How Many Correct Value",
   y = "Score for HMC",
   title = "Correct Quadrent Score by HMC Value per Subject",
  ) +
  theme(
  legend.position = "none", # Remove legend if it becomes too cluttered
  plot.title = element_text(hjust = 0.5, face = "bold"),
  axis.title.x = element_text(face = "bold"),
  axis.title.y = element_text(face = "bold")
## Warning: Using `size` aesthetic for lines was deprecated in ggplot2 3.4.0.
## i Please use `linewidth` instead.
## This warning is displayed once every 8 hours.
## Call `lifecycle::last_lifecycle_warnings()` to see where this warning was
## generated.
```

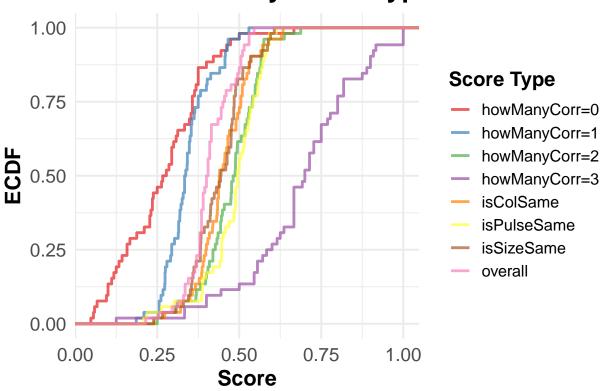
## **Correct Quadrent Score by HMC Value per Subject**



## eCDF of Score by Type

```
ggplot(score_df, aes(x = score, color = score_type, fill = score_type)) +
  stat_ecdf(geom = "step", size = 1, alpha = 0.7) +
 labs(
   x = "Score",
   y = "ECDF",
   title = "eCDF of Score by Score Type",
   fill = "Score Type",
   color = "Score Type"
  scale_fill_brewer(palette = "Set1") +
  scale_color_brewer(palette = "Set1") +
  theme_minimal(base_size = 15) +
  theme(
   legend.position = "right",
   legend.title = element_text(face = "bold"),
   legend.text = element_text(size = 12),
   plot.title = element_text(hjust = 0.5, face = "bold", size = 20),
   axis.title.x = element_text(face = "bold", size = 16),
   axis.title.y = element_text(face = "bold", size = 16),
    axis.text = element_text(size = 14) # Increase axis text size
```

# eCDF of Score by Score Type



#### Effects of distToMiddle on Overall Score

```
q = quantile(df$distToMiddle, c(0, 0.1, .2, .3, .4, .5, .6, .7, .8, .9, 1))
index = c()
score = c()
for (i in 2:length(q)-1){
  lower = q[i]
  upper = q[i+1]
  temp = df[df$distToMiddle > lower & df$distToMiddle <= upper, ]$isCorrect</pre>
  t_score = sum(temp) / length(temp)
  index = c(index, i)
  score = c(score, t_score)
dtm_score_df = data.frame(
  score = score,
  index = index
)
q
            0%
##
                        10%
                                    20%
                                                 30%
                                                             40%
                                                                          50%
```

## 0.004419553 0.038019707 0.060839468 0.077533188 0.091055108 0.106303687

```
##
           60%
                         70%
                                     80%
                                                  90%
                                                               100%
## 0.124544064 0.143062520 0.162151914 0.190197830 0.287484807
ggplot(dtm_score_df, aes(x=index, y=score)) +
  geom_line() +
  theme_minimal()
   0.7
   0.6
   0.5
 score
   0.4
   0.3
                       2.5
                                              5.0
                                                                    7.5
                                                                                          10.0
                                                 index
```

# Rolling Mean

```
subjs = levels(df$subj)
smoothing_chunck = 50
samples_per_subj = 200
smoothing_samples = (samples_per_subj - smoothing_chunck) + 1

store = c()

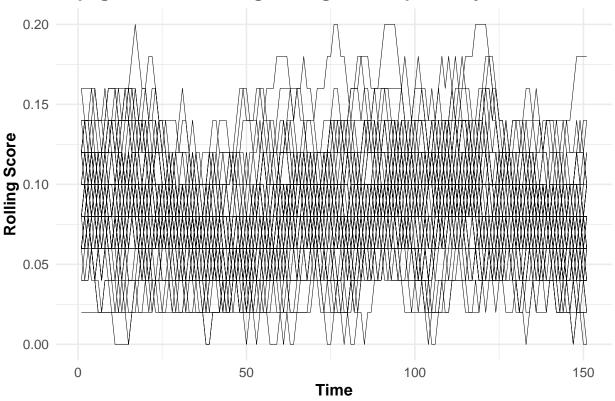
for (i in 1:length(subjs)){
    subject_num = subjs[i]
    sorted_df = df[df$subj == subject_num, ] %>% arrange(X)
    is_correct = sorted_df$isCorrect

temp_store = c()

for (j in 1:smoothing_samples) {
```

```
roll_chunck = sum(is_correct[j:(j+9)]) / smoothing_chunck
    temp_store = c(temp_store, roll_chunck)
  store = c(store, temp_store)
}
rolling_mean_df = data_frame(
 rolling_mean = store,
  sample = rep(1:smoothing_samples, length(subjs)),
  subject = rep(1:length(subjs), each = smoothing_samples)
## Warning: `data_frame()` was deprecated in tibble 1.1.0.
## i Please use `tibble()` instead.
## This warning is displayed once every 8 hours.
## Call `lifecycle::last_lifecycle_warnings()` to see where this warning was
## generated.
# rolling_mean_df$sample = as.factor(rolling_mean_df$sample)
# rolling_mean_df$subject = as.factor(rolling_mean_df$subject)
df_small = rolling_mean_df
df_small$subject = as.factor(df_small$subject)
ggplot(df_small, aes(x=sample, y=rolling_mean, group=subject)) +
  geom_line(size=0.15) +
  theme minimal(base size = 12) +
   labs(
   x = "Time",
   y = "Rolling Score",
   title = "Spageti Plot of Rolling Average Score per Subject Over Time",
  ) +
  theme(
  legend.position = "none", # Remove legend if it becomes too cluttered
  plot.title = element_text(hjust = 0.5, face = "bold"),
  axis.title.x = element_text(face = "bold"),
  axis.title.y = element_text(face = "bold")
```

## Spageti Plot of Rolling Average Score per Subject Over Time



• This was really not helpful.

Trying again but looking at average for discrete 25 sample chunks. So % right in 1-25, 26-50, etc

```
subjs = levels(df$subj)
smoothing_chunck = 25  # Must be a factor of <samples_per_subj>
samples_per_subj = 200
smoothing_samples = samples_per_subj / smoothing_chunck

store = c()

for (i in 1:length(subjs)){
    subject_num = subjs[i]
    sorted_df = df[df$subj == subject_num, ] %>% arrange(X)
    is_correct = sorted_df$isCorrect

temp_store = c()

for (j in 1:smoothing_samples){
    chunk = is_correct[(1 + ((j-1) * 25)):(j*25)]
    t_score = sum(chunk) / smoothing_chunck
    temp_store = c(temp_store, t_score)
}

store = c(store, temp_store)
```

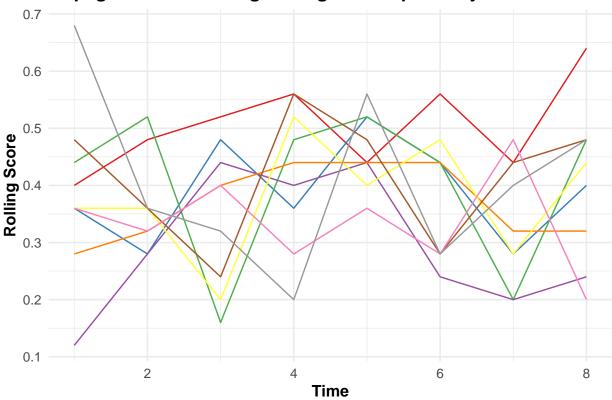
```
rolling_mean_df = data_frame(
  chunk_mean = store,
  sample = rep(1:smoothing_samples, length(subjs)),
  subject = rep(1:length(subjs), each = smoothing_samples)
)
```

## Just looking at the first 9 for easy visual

```
df_small = rolling_mean_df[rolling_mean_df$subject <= 9, ]
df_small$subject = as.factor(df_small$subject)

ggplot(df_small, aes(x=sample, y=chunk_mean, color=subject)) +
    geom_line(size=0.5) +
    scale_color_brewer(palette = "Set1") +
    theme_minimal(base_size = 12) +
    labs(
        x = "Time",
        y = "Rolling Score",
        title = "Spageti Plot of Rolling Average Score per Subject Over Time",
) +
    theme(
    legend.position = "none", # Remove legend if it becomes too cluttered
    plot.title = element_text(hjust = 0.5, face = "bold"),
        axis.title.x = element_text(face = "bold"),
        axis.title.y = element_text(face = "bold")
)</pre>
```

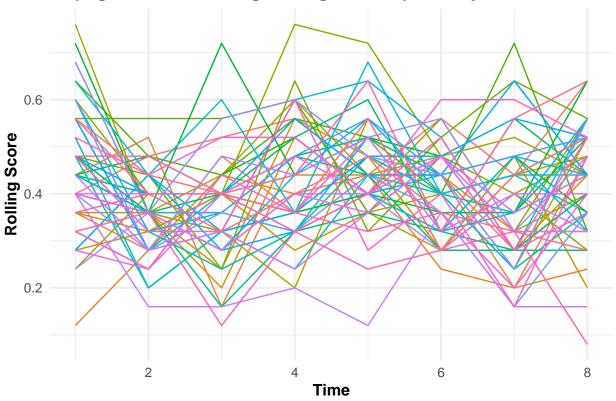
## Spageti Plot of Rolling Average Score per Subject Over Time



## Okay now all subjs

```
df_small = rolling_mean_df
df_small$subject = as.factor(df_small$subject)
ggplot(df_small, aes(x=sample, y=chunk_mean, color=subject)) +
 geom_line(size=0.5) +
  # scale_color_brewer(palette = "Set1") +
 theme_minimal(base_size = 12) +
   labs(
   x = "Time",
   y = "Rolling Score",
   title = "Spageti Plot of Rolling Average Score per Subject Over Time",
 ) +
 theme(
 legend.position = "none", # Remove legend if it becomes too cluttered
  plot.title = element_text(hjust = 0.5, face = "bold"),
  axis.title.x = element_text(face = "bold"),
  axis.title.y = element_text(face = "bold")
```

## Spageti Plot of Rolling Average Score per Subject Over Time



```
df = read.csv("/Users/brendo/repos/CSU/Visual-Inference/src/data/WittData.csv", header=TRUE, sep=",")
a_true = nrow(df[df$corrQuad == "A", ])
b_true = nrow(df[df$corrQuad == "B", ])
c_true = nrow(df[df$corrQuad == "C", ])
d_true = nrow(df[df$corrQuad == "D", ])
a_guessed = nrow(df[df$resp == "A", ])
b_guessed = nrow(df[df$resp == "B", ])
c_guessed = nrow(df[df$resp == "C", ])
d_guessed = nrow(df[df$resp == "D", ])
df_chart = data.frame(
  quad = c("A", "B", "C", "D"),
  true_quad = c(a_true, b_true, c_true, d_true),
  guessed_quad = c(a_guessed, b_guessed, c_guessed, d_guessed)
df_long = df_chart %>%
  pivot_longer(cols = c(true_quad, guessed_quad), names_to = "type", values_to = "value")
summary_df = df_long %>%
  mutate(type = recode(type, true_quad = "True Quad", guessed_quad = "Guessed Quad")) %>%
  pivot_wider(names_from = quad, values_from = value)
kable(summary_df, "latex", caption = "True and Guessed Quad Values", align = 'r', booktabs = TRUE, col.:
```

```
kable_styling(latex_options = c("striped", "hold_position"), font_size = 12) %>%
column_spec(1, bold = TRUE, width = "2cm") %>%
column_spec(2:5, width = "3cm") %>%
row_spec(0, bold = TRUE, color = "white", background = "#666666")
```

Table 1: True and Guessed Quad Values

Type	A	В	С	D
True	1402	6842	362	1794
Quad				
$\mathbf{Guessed}$	2002	2899	2967	2532
Quad				