

Rote Memorization Techniques

W241 Summer 2020 (Daniel Hedstrom Wed 6:30 pm) Final Project

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Introduction

Experiment Design

Results

Loading and Preprocessing the Data

```
dataset = load_data()

## Warning in ifelse(as.numeric(as.character(rote_cov$age)) > 100, NA,
## as.numeric(as.character(rote_cov$age))): NAs introduced by coercion

## Warning in ifelse(as.numeric(as.character(rote_cov$age)) > 100, NA,
## as.numeric(as.character(rote_cov$age))): NAs introduced by coercion

dataset_control <- dataset %>% filter(treat == 0)
dataset_treat <- dataset %>% filter(treat == 1)
```

EDA, Regression modeling

Randomization Checks

Effect Calculation

Appendix

Code

```
attrition = function() {  
  # todo: df3 is the dataset before covariates are joined, need to see how to reconstruct that  
  df2 = left_join(df_b, df_e, by='session_id')  
  nrow(df2)  
  df3 = left_join(df_cov, df2, by='session_id')  
  nrow(df3)  
  df3a= inner_join(df_b, df_e, by="session_id")  
  df_completed = inner_join(df_cov, df3a, by="session_id")  
  nrow(df_completed)  
  
  df3$completed = as.factor(ifelse(!is.na(df3$a11.y), "completed",  
                                   ifelse(!is.na(df3$a11.x), "baseline",  
                                           ifelse(!is.na(df3$treat),  
                                                    "covariates", "started"))))  
  
  summary(df3$completed)  
  df3$treat = as.numeric(df3$treat)  
  str(df3)  
  df3$completed = factor(df3$completed, levels=c("started", "covariates", "baseline", "completed"))  
  
  str(df3)  
  n=218-171  
  df_started = data.frame(session_id = as.factor(1:n), treat=3, completed=factor("started"))  
  str(df_started)  
  df4 = full_join(df3, df_started, by="session_id")  
  str(df4)  
  df4$treat = ifelse(is.na(df4$treat.x), df4$treat.y.y, df4$treat.x)  
  df4$completed = as.factor(ifelse(is.na(df4$completed.x), df4$completed.y, df4$completed.x))  
}  
  
print_stats = function() {  
  print(paste("After cleaning, the number of rows in our dataset is:", toString(nrow(dataset))))  
  print(paste("After cleaning, the number of observations in treatment is:", toString(sum(dataset$treat))))  
  print(paste("After cleaning, the number of observations in control is:", toString(nrow(dataset) - sum(dataset$treat))))  
}  
  
calc_regressions = function() {  
  regression1 <- lm(score ~ treat + age + prior_knowledge + reading + gender + practice, data=dataset)  
  regression2 <- lm(score ~ treat, data=dataset)  
  clustered_errors1 <- vcovCL_1c <- vcovCL(regression1, cluster = dataset[, 'cluster'])  
  clustered_errors2 <- vcovCL_2c <- vcovCL(regression2, cluster = dataset[, 'cluster'])  
}  
  
print_summary = function() {  
  stargazer(dataset,  
             header= F,  
             title = "Summary Table of Data",  
             type="latex") #flip type between text and latex  
}
```

```

print_regressions = function() {
  stargazer(regression1, regression2,
    header = F,
    type = "latex",
    omit.table.layout= "n",
    keep.stat = c("adj.rsq", "n", "f", "ser", "aic", "wald"),
    se = list(sqrt(diag(clustered_errors1)),sqrt(diag(clustered_errors2))),
    star.cutoffs = c(0.05, 0.01, 0.001),
    title="Regression Results with Clustered Standard Errors")
}

```

```

plot_rand_gender = function (){
  dataset %>% ggplot(aes(x=gender, fill=treat))+
    geom_bar(stat="count", position="stack") +
    theme_minimal() +
    #scale_fill_brewer(palette="Dark2") +
    scale_fill_manual(values=c("#003262", "#FDB515"),
      labels=c("Control", "Treatment"))+
    ylab("Count") +
    ggtitle("Randomization - gender") +

    theme(legend.title=element_blank())
}

```

```

plot_rand_age = function (){
  dataset %>% ggplot(aes(x=age, fill=treat))+
    geom_bar(stat="count", position="stack", binwidth=3) +
    theme_minimal() +
    #scale_fill_brewer(palette="Dark2") +
    scale_fill_manual(values=c("#003262", "#FDB515"),
      labels=c("Control", "Treatment"))+
    ylab("Count") +
    ggtitle("Randomization - age") +

    theme(legend.title=element_blank())
}

```

```

plot_rand_reading = function (){
  dataset %>% ggplot(aes(x=reading, fill=treat))+
    geom_bar(stat="count", position="stack", binwidth=1) +
    theme_minimal() +
    #scale_fill_brewer(palette="Dark2") +
    scale_fill_manual(values=c("#003262", "#FDB515"),
      labels=c("Control", "Treatment"))+
    ylab("Count") +
    ggtitle("Randomization - reading habits") +

    theme(legend.title=element_blank())
}

```

```

plot_rand_practice = function (){
  dataset %>% ggplot(aes(x=practice, fill=treat))+
    geom_bar(stat="count", position="stack", binwidth=1) +
    theme_minimal() +

```

```

    #scale_fill_brewer(palette="Dark2") +
    scale_fill_manual(values=c("#003262", "#FDB515"),
                      labels=c("Control", "Treatment"))+
    ylab("Count") +
    ggtitle("Randomization - practice memorizing") +

    theme(legend.title=element_blank())
}

plot_scores = function() {
  dataset %>% ggplot(aes(x=score, fill=as.factor(treat)))+
    geom_bar(stat="count", position="dodge") +
    theme_minimal() +
    #scale_fill_brewer(palette="Dark2") +
    scale_fill_manual(values=c("#003262", "#FDB515"),
                      labels=c("Control", "Treatment"))+
    ylab("Frequency") +
    ggtitle("Score difference between baseline and experiment") +
    theme(legend.title=element_blank())
}

plot_gender = function() {
  ggplot(dataset, aes(x=gender)) +
  geom_bar() +
  ggtitle("Distribution of Gender")
}

plot_age = function() {
  dataset %>% ggplot(aes(x=age, fill=gender))+
    geom_bar(stat="count", position="stack", binwidth=3) +
    theme_minimal() +
    #scale_fill_brewer(palette="Dark2") +
    scale_fill_manual(values=c("#003262", "#FDB515", "#C4820E"),
                      labels=c("Female", "Male", "Other"))+
    ylab("Count") +
    ggtitle("Age distribution") +
    theme(legend.title=element_blank())
}

plot_score_diffs = function () {
  dataset %>% ggplot(aes(x=score, fill=treat))+
    geom_density(stat="count", alpha=0.3)+
    geom_histogram(stat="count", position="dodge") +
    theme_minimal() +
    #scale_fill_brewer(palette="Dark2") +
    scale_fill_manual(values=c("#003262", "#FDB515"),
                      labels=c("Control", "Treatment"))+
    ylab("Frequency") +
    ggtitle("Score difference between baseline and experiment") +
    theme(legend.title = element_blank())
}

plot_participation = function() {

```

```

df_a = data.frame(id=1:4,stage=c("started", "covariates", "baseline", "complete"),
                  n=c(218, 171, 123, 108))
df_a %>% ggplot(aes(x=stage, y=n, fill=stage))+
  geom_bar(stat="identity") +
  theme_minimal() +
  scale_x_discrete(limits=c("started", "covariates", "baseline", "complete")) +
  #scale_fill_brewer(palette="Dark2") +
  scale_fill_manual(values=c("#003262", "#3B7EA1", "#FDB515", "#C4820E"))+
  ylab("Participants") +
  ggtitle("Participation by stage")
}

plot_attrition = function () {
  df4 %>%
    filter(completed != 4) %>%
    ggplot(aes(x=completed, fill=as.factor(treat)))+
    geom_histogram(stat="count") +
    theme_minimal() +
    scale_x_discrete(labels=c("started", "covariates", "baseline", "complete")) +
    scale_fill_brewer(palette="Dark2") +
    scale_fill_manual(values=c("#003262", "#3B7EA1", "#FDB515", "#C4820E"),
                      labels=c("Control", "Treatment", "Before assignment"))+
    ylab("Participants dropping out") +
    ggtitle("Attrition by stage") +
    theme(legend.title=element_blank())
}

```