

w241_final_project_report_figures

```
library(data.table)
library(ggplot2)
library(RCurl)
```

```
## Loading required package: bitops
```

```
library(stargazer)
```

```
##
```

```
## Please cite as:
```

```
## Hlavac, Marek (2015). stargazer: Well-Formatted Regression and Summary Statistics Tables.
```

```
## R package version 5.2. http://CRAN.R-project.org/package=stargazer
```

```
library(ri)
```

```
#####
##### ATG EXPERIMENT #####
#####
```

```
##### ATG EXPERIMENT: EXPLORATORY ANALYSIS #####
```

```
# read data from remote git repo
```

```
csv = getURL\('https://raw.githubusercontent.com/winlingit/w241-project-csw/master/rcode/atg\_results.csv'\)
dt.atg = data.table(read.csv(textConnection(csv)))
```

```
# recover observations, from: http://stackoverflow.com/questions/2894775/replicate-each-row-of-data-frame
dt.atgx = dt.atg[rep(seq(.N), N)] # expand table to 352 rows
```

```
dt.atgx[, responded := c(rep(1, max(Responses)), rep(0, .N - max(Responses))), by = CollectorName] #
dt.atg$Responses == dt.atgx[, sum(responded), by = CollectorName]$V1 # checksums for total responses
```

```
[1] TRUE TRUE TRUE TRUE TRUE TRUE TRUE TRUE TRUE TRUE TRUE TRUE TRUE TRUE [15]
TRUE TRUE TRUE TRUE
```

```
# estimate overall ATE
```

```
dt.atg[, .(y = sum(Responses)/sum(N)), by = treat][, y[1]-y[2]]
```

```
[1] 0.07931818
```

```
# calculate response rates in each block
```

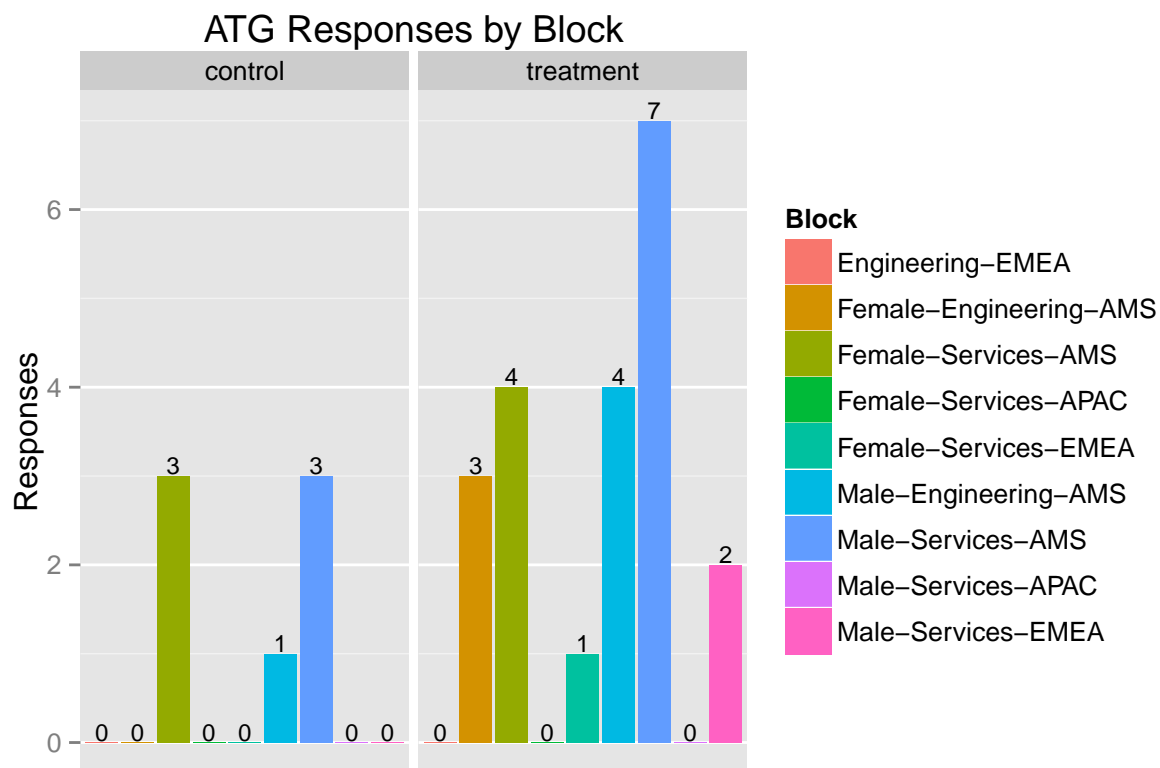
```
dt.atg[, Rate := Responses / N]
```

```
dt.atg[ treat == 1, Treat := 'treatment']
```

```
dt.atg[ treat == 0, Treat := 'control']
```

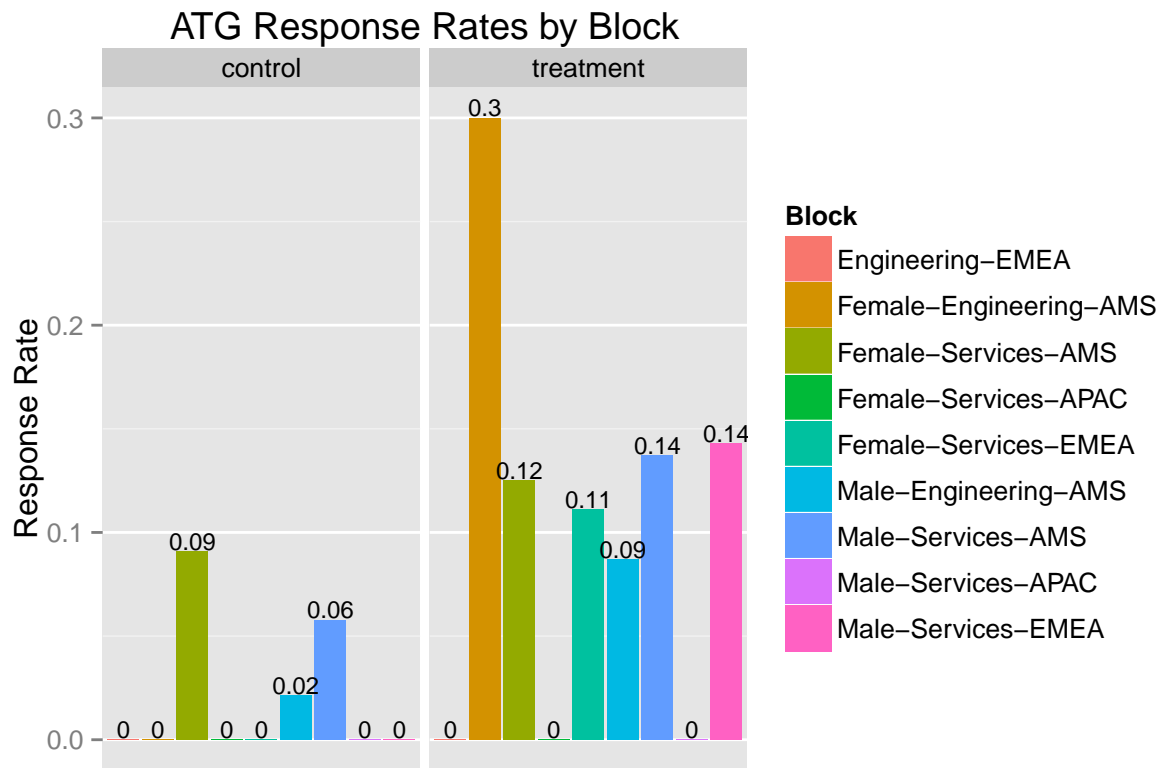
```
# Plot the chart of winning
```

```
ggplot(dt.atg, aes(x=Block, y=Responses, fill=Block)) +
  geom_bar(stat='identity') +
  geom_text(aes(x=Block, y=Responses, label=Responses), vjust=-.1, size=3) +
  facet_wrap( ~ Treat) +
  ggtitle("ATG Responses by Block") +
  xlab("") +
  ylab("Responses") +
  theme( axis.line=element_blank(),
        axis.text.x=element_blank(),
        axis.ticks.x=element_blank(),
        axis.title.x=element_blank(),
        panel.border=element_blank(),
        panel.grid.major.x=element_blank(),
        panel.grid.minor.x=element_blank())
```



```
# Plot the chart of proportional winning
ggplot(dt.atg, aes(x=Block, y=Rate, fill=Block)) +
  geom_bar(stat='identity') +
  geom_text(aes(x=Block, y=Rate, label=round(Rate, digits=2)), vjust=-.1, size=3) +
  facet_wrap( ~ Treat) +
  ggtitle("ATG Response Rates by Block") +
  xlab("") +
  ylab("Response Rate") +
  theme( axis.line=element_blank(),
        axis.text.x=element_blank(),
        axis.ticks.x=element_blank(),
        axis.title.x=element_blank(),
        panel.border=element_blank(),
```

```
panel.grid.major.x=element_blank(),
panel.grid.minor.x=element_blank())
```



```
##### ATG EXPERIMENT: REGRESSION ANALYSIS #####
```

```
# regression models
```

```
m1.atg = lm(responded ~ treat, data = dt.atgx) # treatment only
```

```
m2.atg = lm(responded ~ treat + Female, data = dt.atgx) # treatment + female
```

```
m3.atg = lm(responded ~ treat + Female + Org, data = dt.atgx) # treatment + female + org
```

```
m4.atg = lm(responded ~ treat + Female + Org + Region, data = dt.atgx) # treatment + female + org + reg
```

```
# show all regression models
```

```
stargazer(m1.atg, m2.atg, m3.atg, m4.atg, type = 'latex', title = 'Regression Analysis for ATG Feedback')
```

```
% Table created by stargazer v.5.2 by Marek Hlavac, Harvard University. E-mail: hlavac at fas.harvard.edu
```

```
% Date and time: Wed, May 04, 2016 - 01:29:29
```

```
#####
```

```
##### PTG EXPERIMENT #####
```

```
#####
```

```
##### PTG EXPERIMENT: EXPLORATORY ANALYSIS #####
```

```
# read data from remote git repo
```

```
csv = getURL('https://raw.githubusercontent.com/winlingit/w241-project-csw/master/rcode/ptg_results.csv')
```

```
dt.ptg = data.table(read.csv(textConnection(csv)))
```

```
# recover observations
```

Table 1: Regression Analysis for ATG Feedback Survey Experiment

	<i>Dependent variable:</i>			
	responded			
	(1)	(2)	(3)	(4)
treat	0.079*** (0.029)	0.081*** (0.029)	0.081*** (0.029)	0.083*** (0.029)
Female		0.032 (0.032)	0.030 (0.032)	0.026 (0.033)
OrgServices			0.009 (0.032)	0.025 (0.034)
RegionAPAC				-0.101 (0.068)
RegionEMEA				-0.036 (0.046)
Constant	0.040** (0.020)	0.031 (0.023)	0.025 (0.030)	0.025 (0.030)
Observations	351	344	344	344
R ²	0.021	0.025	0.025	0.033
Adjusted R ²	0.019	0.019	0.017	0.018
Residual Std. Error	0.269 (df = 349)	0.271 (df = 341)	0.272 (df = 340)	0.271 (df = 338)
F Statistic	7.641*** (df = 1; 349)	4.396** (df = 2; 341)	2.951** (df = 3; 340)	2.285** (df = 5; 338)

Note:

*p<0.1; **p<0.05; ***p<0.01

```
dt.ptgx = dt.ptg[rep(seq(.N), N)] # expand table to 352 rows
dt.ptgx[, responded := c(rep(1, max(Responses)), rep(0, .N - max(Responses))), by = CollectorName] #
dt.ptg$Responses == dt.ptgx[, sum(responded), by = CollectorName]$V1 # checksums for total responses
```

```
## Warning in dt.ptg$Responses == dt.ptgx[, sum(responded), by =
## CollectorName]$V1: longer object length is not a multiple of shorter object
## length
```

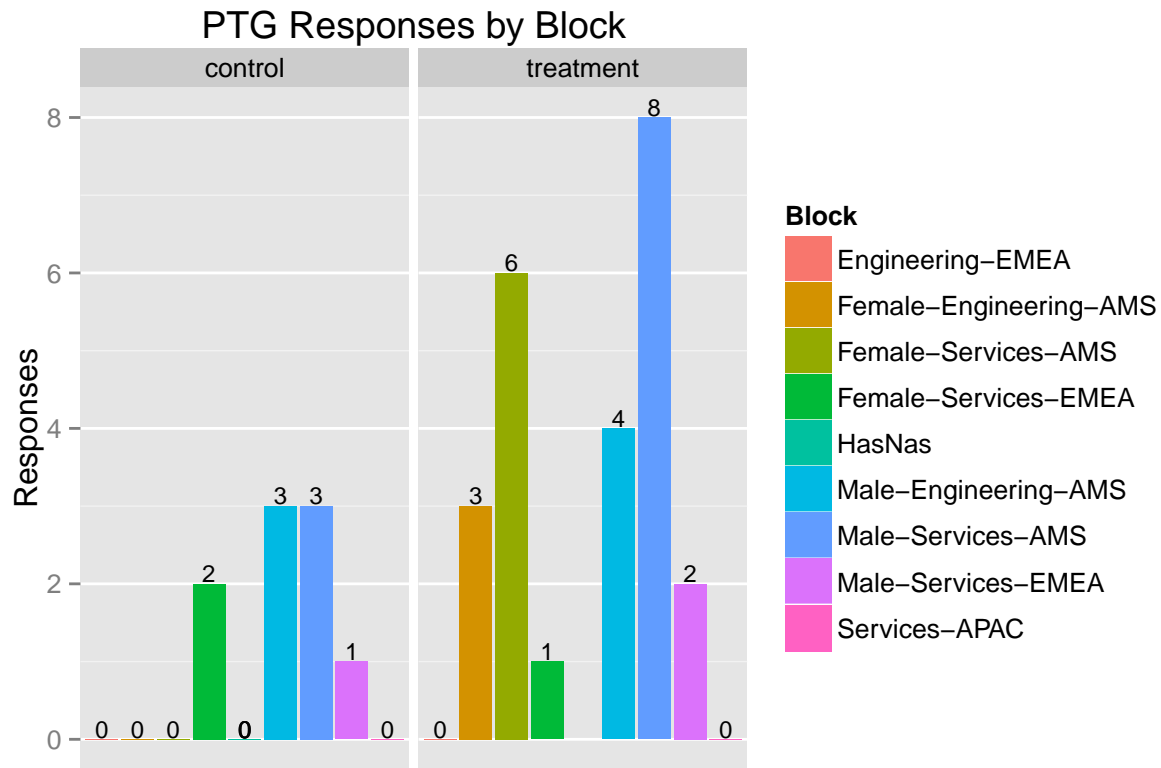
```
[1] TRUE TRUE TRUE TRUE TRUE TRUE TRUE TRUE TRUE TRUE TRUE TRUE TRUE TRUE [15]
TRUE TRUE TRUE TRUE TRUE TRUE
```

```
# estimate overall ATE
dt.ptg[, .(y = sum(Responses)/sum(N)), by = treat][, y[1]-y[2]]
```

```
[1] 0.08108108
```

```
# calculate response rates in each block
dt.ptg[, Rate := Responses / N]
dt.ptg[ treat == 1, Treat := 'treatment']
dt.ptg[ treat == 0, Treat := 'control']

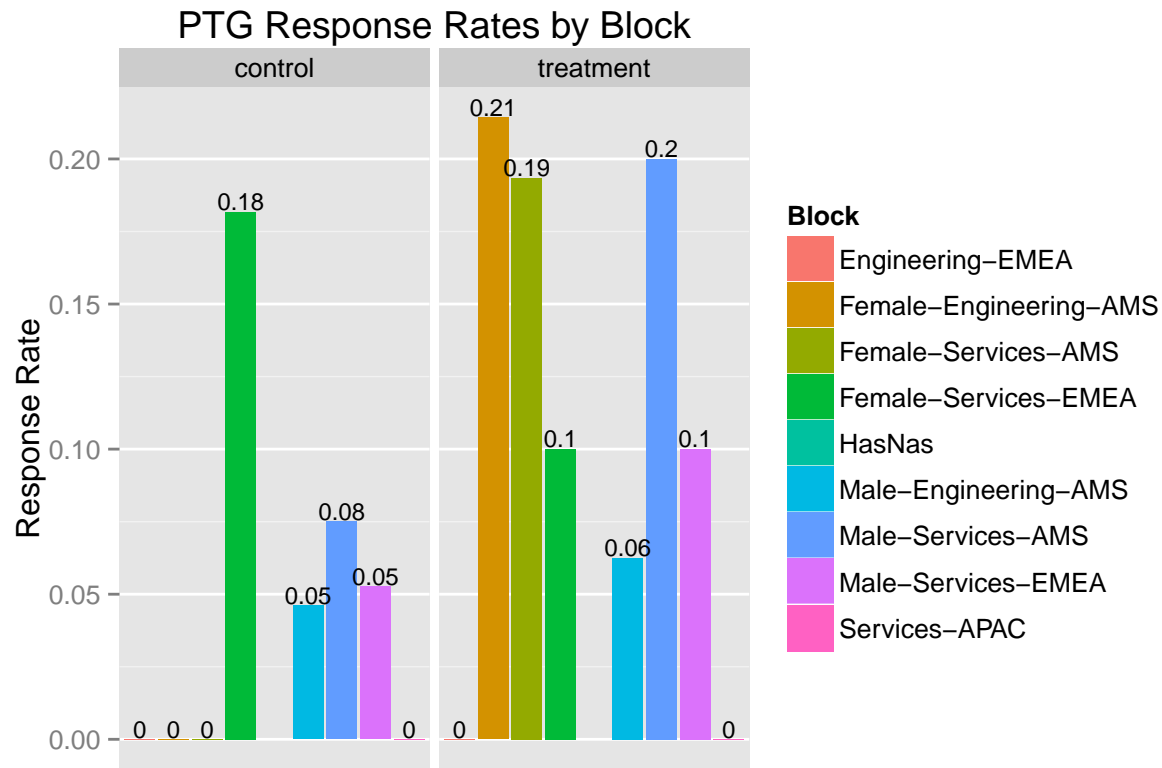
# Plot the chart of winning
ggplot(dt.ptg, aes(x=Block, y=Responses, fill=Block)) +
  geom_bar(stat='identity') +
  geom_text(aes(x=Block, y=Responses, label=Responses), vjust=-.1, size=3) +
  facet_wrap( ~ Treat) +
  ggtitle("PTG Responses by Block") +
  xlab("") +
  ylab("Responses") +
  theme( axis.line=element_blank(),
        axis.text.x=element_blank(),
        axis.ticks.x=element_blank(),
        axis.title.x=element_blank(),
        panel.border=element_blank(),
        panel.grid.major.x=element_blank(),
        panel.grid.minor.x=element_blank())
```



```
# Plot the chart of proportional winning
ggplot(dt.ptg, aes(x=Block, y=Rate, fill=Block)) +
  geom_bar(stat='identity') +
  facet_wrap(~ Treat) +
  geom_text(aes(x=Block, y=Rate, label=round(Rate, digits=2)), vjust=-.1, size=3) +
  ggtitle("PTG Response Rates by Block") +
  xlab("") +
  ylab("Response Rate") +
  theme(axis.line=element_blank(),
        axis.text.x=element_blank(),
        axis.ticks.x=element_blank(),
        axis.title.x=element_blank(),
        panel.border=element_blank(),
        panel.grid.major.x=element_blank(),
        panel.grid.minor.x=element_blank())
```

```
## Warning: Removed 4 rows containing missing values (position_stack).
```

```
## Warning: Removed 4 rows containing missing values (geom_text).
```



PTG EXPERIMENT: REGRESSION ANALYSIS

regression models

`m1.ptg = lm(responded ~ treat, data = dt.ptgx) # treatment only`

`m2.ptg = lm(responded ~ treat + Female, data = dt.ptgx) # treatment + female`

`m3.ptg = lm(responded ~ treat + Female + Org, data = dt.ptgx) # treatment + female + org`

`m4.ptg = lm(responded ~ treat + Female + Org + Region, data = dt.ptgx) # treatment + female + org + reg`

show all models

`stargazer(m1.ptg, m2.ptg, m3.ptg, m4.ptg, type = 'latex', title = 'Regression Analysis for PTG Feedback`

% Table created by stargazer v.5.2 by Marek Hlavac, Harvard University. E-mail: hlavac at fas.harvard.edu

% Date and time: Wed, May 04, 2016 - 01:29:30

`stargazer(m1.atg, m1.ptg, type = 'latex', title = 'Regression Analysis for ATG and PTG Feedback Survey I`
`dep.var.labels = 'Responded to Survey',`
`covariate.labels = 'Personalization')`

% Table created by stargazer v.5.2 by Marek Hlavac, Harvard University. E-mail: hlavac at fas.harvard.edu

% Date and time: Wed, May 04, 2016 - 01:29:31

Table 2: Regression Analysis for PTG Feedback Survey Experiment

	<i>Dependent variable:</i>			
	responded			
	(1)	(2)	(3)	(4)
treat	0.081*** (0.029)	0.082*** (0.029)	0.081*** (0.029)	0.082*** (0.029)
Female		0.025 (0.032)	0.012 (0.033)	0.012 (0.033)
OrgServices			0.044 (0.031)	0.055 (0.033)
RegionAPAC				-0.122 (0.103)
RegionEMEA				-0.022 (0.042)
Constant	0.049** (0.021)	0.041* (0.023)	0.020 (0.027)	0.020 (0.027)
Observations	370	370	370	370
R ²	0.020	0.022	0.027	0.031
Adjusted R ²	0.018	0.016	0.019	0.018
Residual Std. Error	0.283 (df = 368)	0.283 (df = 367)	0.283 (df = 366)	0.283 (df = 364)
F Statistic	7.599*** (df = 1; 368)	4.094** (df = 2; 367)	3.424** (df = 3; 366)	2.362** (df = 5; 364)

Note:

*p<0.1; **p<0.05; ***p<0.01

Table 3: Regression Analysis for ATG and PTG Feedback Survey Experiments

	<i>Dependent variable:</i>	
	Responded to Survey	
	ATG (1)	PTG (2)
Personalization	0.079*** (0.029)	0.081*** (0.029)
Constant	0.040** (0.020)	0.049** (0.021)
Observations	351	370
R ²	0.021	0.020
Adjusted R ²	0.019	0.018
Residual Std. Error	0.269 (df = 349)	0.283 (df = 368)
F Statistic	7.641*** (df = 1; 349)	7.599*** (df = 1; 368)

Note:

*p<0.1; **p<0.05; ***p<0.01