### Example 6

First let's read in the data.

```
dat<-read.csv("homework6.csv")</pre>
```

Next we'll check the structure.

```
str(dat)
```

```
## 'data.frame': 48 obs. of 5 variables:
## $ rt : num 348 309 291 333 315 ...
## $ type : Factor w/ 2 levels "conjunction",..: 2 2 2 2 2 2 2 2 2 2 2 2 ...
## $ distractors: int 4 4 4 4 4 4 4 4 8 8 ...
## $ subject : int 1 2 3 4 5 6 7 8 1 2 ...
## $ subject2 : int 1 2 3 4 5 6 7 8 1 2 ...
```

The data fram contains response times for different types of searches with different numbers of distractors with two different subject variables. However the distractor and subject variables aren't factors so we need to change that.

```
dat$distractors <- as.factor(dat$distractors)
dat$subject <- as.factor(dat$subject)
dat$subject2 <- as.factor(dat$subject2)</pre>
```

Now we'll run a one-way between-subjects ANOVA to see if the number of distracctors affected response times for conjunction searches only.

```
summary(aov(rt~distractors, data = dat[dat$type=="conjunction",]))
```

```
## Df Sum Sq Mean Sq F value Pr(>F)
## distractors 2 14078 7039 8.603 0.00187 **
## Residuals 21 17182 818
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

According to the results of the ANOVA the number of distractors affected how long it took people to complete conjunction searches, F(2,21) = 8.6, p = .002. Let's create a line graph to see how the distractors affected response times. First we'll need to load our graphics libraries.

```
library(ggplot2)
library(gplots)
```

```
##
## Attaching package: 'gplots'
##
## The following object is masked from 'package:stats':
##
## lowess
```

#### library(dplyr)

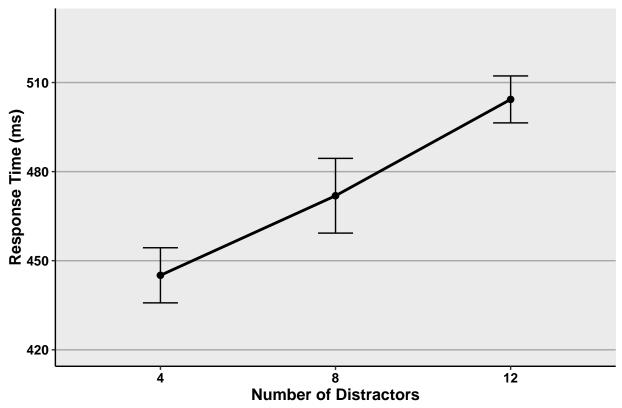
```
##
## Attaching package: 'dplyr'
##
## The following objects are masked from 'package:stats':
##
## filter, lag
##
## The following objects are masked from 'package:base':
##
## intersect, setdiff, setequal, union
```

Next we'll need to compute the means and standard errors for our graph.

Finally, we'll create our line graph.

```
f<-ggplot(temp, aes(x=as.factor(distractors),</pre>
                    y=means,
                    group=1))+
  geom_line(size=1)+
  geom_point(size=2)+
  geom errorbar(aes(ymax=means+sems,
                    ymin=means-sems),
                width=.2)+
  ggtitle("How Distractors Affect Search Times")+
  labs(x="Number of Distractors",y="Response Time (ms)")+
  theme(plot.title=element_text(size=15,face="bold",vjust=.5))+
  theme(axis.title.x=element_text(size=12,face="bold",vjust=-.25))+
  theme(axis.title.y=element_text(size=12,face="bold",vjust=1))+
  theme(axis.text.x=element_text(size=10,face="bold",color="black"))+
  theme(axis.text.y=element_text(size=10,face="bold",color="black"))+
  coord_cartesian(ylim=c(min(temp$means)-2*max(temp$sems),
                         max(temp$means)+2*max(temp$sems)))+
  theme(panel.border=element blank(),axis.line=element line())+
  theme(panel.grid.major.x=element_blank())+
  theme(panel.grid.major.y=element_line(color="darkgrey"))+
  theme(panel.grid.minor.y=element_blank())
f
```

### **How Distractors Affect Search Times**



From this figure and the results of the ANOVA, it's clear that the more distractors there are, the more time it takes to complete the searches.

As a demonstration, I'll also conduct a one-way within-subjects ANOVA.

```
##
## Error: subject
             Df Sum Sq Mean Sq F value Pr(>F)
##
## Residuals 7 15437
                           2205
##
## Error: subject:distractors
##
               Df Sum Sq Mean Sq F value
                                            Pr(>F)
                             7039
                   14078
                                    56.45 1.99e-07 ***
## distractors
## Residuals
               14
                    1746
                              125
## ---
                   0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Signif. codes:
```

The results of this test also indicate that response times increase with increasing distractors, F(2,14) = 56.5, p < .05.

Here, I'm going to perform a between-subjects ANOVA to examine the effects and interactions between the number of distractors and the search type.

```
summary(aov(rt~type*distractors, data = dat))
```

```
##
                   Df Sum Sq Mean Sq F value Pr(>F)
## type
                    1 342239 342239 459.417 < 2e-16 ***
## distractors
                    2
                        3945
                                1972
                                      2.648 0.08262 .
## type:distractors 2 11675
                                5838
                                      7.836 0.00128 **
## Residuals
                   42 31288
                                745
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

There's a significant effect of search type, F(1,42) = 459.4, p < .05. There's no effect of the type of distractors, F(2,42) = 2.6, p = .083. There was an interaction between the type of search and number of distractors, F(2,42) = 7.8, p = .001.

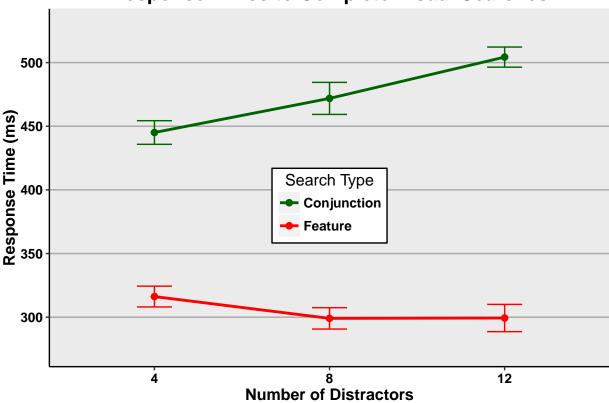
To better understand the effect of type and the interaction, I'll plot a line graph and a grouped bar graph. But first we need to summarize the data before we can plot it.

Now I can create the figures.

```
f <- ggplot (temp, aes (x=distractors,
                    y=means,
                    group=type,
                    color=type))+
  geom_line(size=1)+
  geom_point(size=2)+
  scale_color_manual(values=c("darkgreen", "red"),
                     name="Search Type",
                     breaks=c("conjunction", "feature"),
                     labels=c("Conjunction", "Feature"))+
  geom_errorbar(aes(ymax=means+sems, ymin=means-sems), width=.2)+
  ggtitle("Response Times to Complete Visual Searches")+
  labs(x="Number of Distractors",y="Response Time (ms)")+
  theme(plot.title=element_text(size=15,face="bold",vjust=.5))+
  theme(axis.title.x=element_text(size=12,face="bold",vjust=-.25))+
  theme(axis.title.y=element_text(size=12,face="bold",vjust=1))+
  theme(axis.text.x=element_text(size=10,face="bold",color="black"))+
  theme(axis.text.y=element_text(size=10,face="bold",color="black"))+
  coord_cartesian(ylim=c(min(temp$means)-2*max(temp$sems),
                         max(temp$means)+2*max(temp$sems)))+
  theme(panel.border=element_blank(),axis.line=element_line())+
  theme(panel.grid.major.x=element_blank())+
  theme(panel.grid.major.y=element_line(color="darkgrey"))+
  theme(panel.grid.minor.y=element_blank())+
  theme(legend.position=c(.5,.45))+
  theme(legend.background=element_blank())+
  theme(legend.background=element_rect(color="black"))+
  theme(legend.title=element_blank())+
  theme(legend.title=element text(size=12))+
  theme(legend.title.align=.5)+
```

```
theme(legend.text=element_text(size=10,face="bold"))
f
```

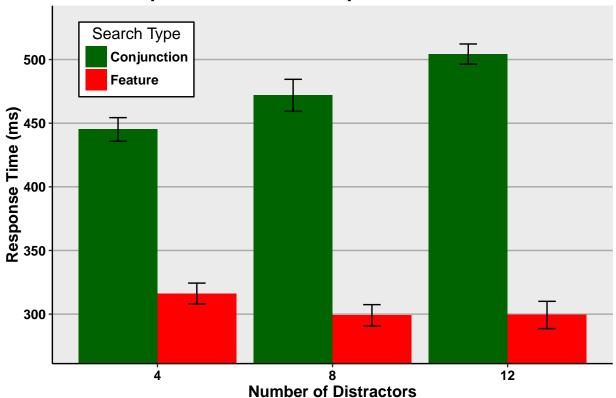
## **Response Times to Complete Visual Searches**



```
f<-ggplot(temp, aes(x=distractors,</pre>
                    y=means,
                    fill=type))+
  geom_bar(stat="identity",position=position_dodge())+
  scale_fill_manual(values=c("darkgreen", "red"),
                     name="Search Type",
                     breaks=c("conjunction", "feature"),
                     labels=c("Conjunction", "Feature"))+
  geom_errorbar(aes(ymax=means+sems,
                    ymin=means-sems),
                width=.2.
                position=position_dodge(.9))+
  ggtitle("Response Times to Complete Visual Searches")+
  labs(x="Number of Distractors",y="Response Time (ms)")+
  theme(plot.title=element_text(size=15,face="bold",vjust=.5))+
  theme(axis.title.x=element_text(size=12,face="bold",vjust=-.25))+
  theme(axis.title.y=element_text(size=12,face="bold",vjust=1))+
  theme(axis.text.x=element_text(size=10,face="bold",color="black"))+
  theme(axis.text.y=element_text(size=10,face="bold",color="black"))+
  coord_cartesian(ylim=c(min(temp$means)-2*max(temp$sems),
                         max(temp$means)+2*max(temp$sems)))+
  theme(panel.border=element_blank(),axis.line=element_line())+
```

```
theme(panel.grid.major.x=element_blank())+
theme(panel.grid.major.y=element_line(color="darkgrey"))+
theme(panel.grid.minor.y=element_blank())+
theme(legend.position=c(.15,.85))+
theme(legend.background=element_blank())+
theme(legend.background=element_rect(color="black"))+
theme(legend.title=element_blank())+
theme(legend.title=element_text(size=12))+
theme(legend.title.align=.5)+
theme(legend.text=element_text(size=10,face="bold"))
f
```

# **Response Times to Complete Visual Searches**



Based on the results and the figure, it's clear that conjunction searches take more time to complete when there are more distractors. However, for feature searches the number of distractors doesn't have much of an effect on the time to complete the searches.

Now I'm going to perform a within-subjects two-way ANOVA on the data I've already analyzed above.

```
summary(aov(rt~type*distractors+Error(subject/(type*distractors)), data = dat))
```

```
Df Sum Sq Mean Sq F value Pr(>F)
                                 1626 1.5e-09 ***
## type
             1 342239
                       342239
## Residuals
            7
                 1473
                          210
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Error: subject:distractors
##
              Df Sum Sq Mean Sq F value Pr(>F)
## distractors 2
                   3945 1972.3
                                 11.16 0.00127 **
## Residuals
              14
                   2475
                         176.8
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Error: subject:type:distractors
##
                   Df Sum Sq Mean Sq F value
                                              Pr(>F)
## type:distractors 2
                       11675
                                5838
                                      32.05 5.95e-06 ***
## Residuals
                   14
                        2550
                                 182
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

According to these results and interpreted in light of the figures, conjunction searches took more time than feature searches F(1,7) = 1626, p < .05. Searches with more distractors generally took longer to complete, F(2,14) = 11.2, p = .001. Finally, distractors had a greater effect for conjunction searches, F(2,14) = 32.0, p < .05.

Finally, I'm going to conduct a mixed ANOVA where the type of search varies across subjects and the number of distractors varies within.

```
summary(aov(rt~type*distractors+Error(subject2/distractors), data = dat))
```

```
##
## Error: subject2
            Df Sum Sq Mean Sq F value
##
                                        Pr(>F)
## type
             1 342239
                                182.4 2.02e-09 ***
                       342239
## Residuals 14 26263
                         1876
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Error: subject2:distractors
##
                   Df Sum Sq Mean Sq F value
                                               Pr(>F)
## distractors
                        3945
                                1972
                                       10.99
                                                3e-04 ***
                   2
                       11675
                                5838
                                       32.53 4.98e-08 ***
## type:distractors
## Residuals
                   28
                        5025
                                 179
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

According to these results, conjunction searches took more time than feature searches, F(1,14) = 182.4, p < .05. As the number of distractors increased, search times generally increased, F(2,28) = 11.0, p < .05. Finally search times increased distractors for conjunction, but not for feature searches, F(2,28) = 32.5, p < .05.