Networks Retrieval Study

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December 15, 2018

1 Reading the Data File

```
> net = read.csv("CompiledData_E4.csv", header = TRUE, sep = ",")
> #net = net %>% filter(!Subject %in% c(5, 1, 2,6, 3,7))
```

2 Item Analysis

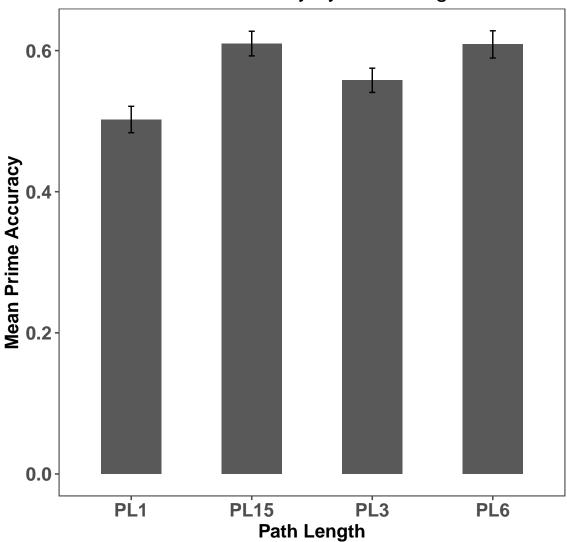
3 Figures

3.1 Prime Accuracy

```
> net_primeacc = group_by(net, Subject, pathlength) %>%
+ summarize_at(vars(PrimeFirstResp_ACC), mean)
> netprime_rmisc = Rmisc::summarySE(net_primeacc,
+ measurevar = "PrimeFirstResp_ACC",
+ groupvars = c("pathlength"))
> netprime_rmisc$pathlength = as.factor(netprime_rmisc$pathlength)
> library(ggplot2)
> library(ggthemes)
> netprime_rmisc %>%
```

```
ggplot(aes(x = pathlength,
            y = PrimeFirstResp_ACC))+
   geom_bar(stat = "identity", position = "dodge",
            width = 0.5)+
    geom_errorbar(aes(ymin = PrimeFirstResp_ACC - se,
                      ymax = PrimeFirstResp_ACC + se),
                  width=.05, position=position_dodge(.5)) +
+
    theme_few()+
+
    scale_fill_wsj()+
    xlab("Path Length") + ylab("Mean Prime Accuracy") +
    ggtitle("Prime Accuracy by Path Length ") +
      theme(axis.text = element_text(face = "bold", size = rel(1.2)),
            axis.title = element_text(face = "bold", size = rel(1.2)),
            legend.title = element_text(face = "bold", size = rel(1.2)),
            plot.title = element_text( size = rel(1.4), hjust = .5))
```

Prime Accuracy by Path Length

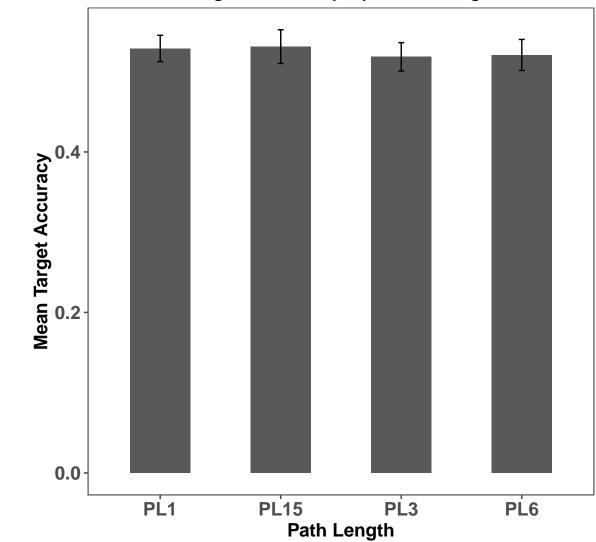


3.2 Target Accuracy

```
> net_targetacc = group_by(net, Subject, pathlength) %>%
+ summarize_at(vars(TargetAccuracy), mean)
> nettarget_rmisc = Rmisc::summarySE(net_targetacc,
+ measurevar = "TargetAccuracy",
+ groupvars = c("pathlength"))
> nettarget_rmisc$pathlength = as.factor(nettarget_rmisc$pathlength)
> library(ggplot2)
> library(ggthemes)
```

```
> nettarget_rmisc %>%
+ ggplot(aes(x = pathlength,
             y = TargetAccuracy))+
   geom_bar(stat = "identity", position = "dodge",
            width = 0.5)+
    geom_errorbar(aes(ymin = TargetAccuracy - se,
                      ymax = TargetAccuracy + se),
+
                  width=.05, position=position_dodge(.5)) +
+
    theme_few()+
    scale_fill_wsj()+
    xlab("Path Length") + ylab("Mean Target Accuracy") +
    ggtitle("Target Accuracy by Path Length") +
      theme(axis.text = element_text(face = "bold", size = rel(1.2)),
            axis.title = element_text(face = "bold", size = rel(1.2)),
            legend.title = element_text(face = "bold", size = rel(1.2)),
            plot.title = element_text( size = rel(1.4), hjust = .5))
```

Target Accuracy by Path Length

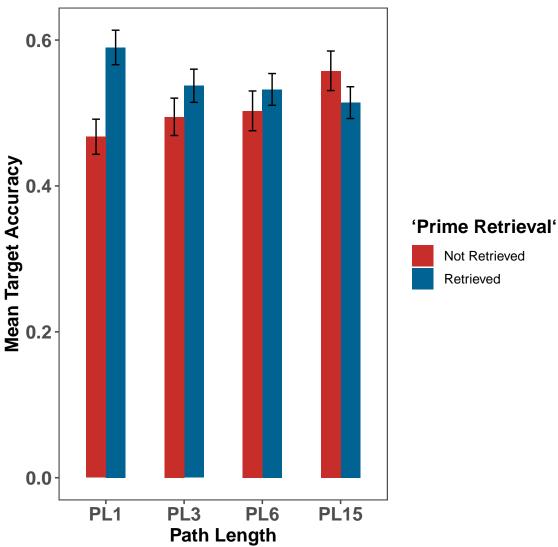


3.3 Prime Retrieval

```
> net_subject = group_by(net, Subject, pathlength, PrimeFirstResp_ACC) %>%
+ summarize_at(vars(TargetAccuracy), mean)
> net_rmisc = Rmisc::summarySE(net,
+ measurevar = "TargetAccuracy",
+ groupvars = c("pathlength", "PrimeFirstResp_ACC"))
> net_rmisc$PrimeFirstResp_ACC = as.factor(net_rmisc$PrimeFirstResp_ACC)
> net_rmisc$pathlength = as.factor(net_rmisc$pathlength)
> net_rmisc$pathlengthfac = ordered(as.factor(as.character(net_rmisc$pathlength)),
```

```
levels = c("PL1", "PL3", "PL6", "PL15"))
> library(ggplot2)
> library(ggthemes)
> net_rmisc %>% mutate(`Prime Retrieval` = factor(PrimeFirstResp_ACC,
                                           levels = unique(PrimeFirstResp_ACC),
                      labels = c("Not Retrieved", "Retrieved")))%>%
 ggplot(aes(x = pathlengthfac,
             y = TargetAccuracy,
             fill = `Prime Retrieval`, group = `Prime Retrieval`))+
   geom_bar(stat = "identity", position = "dodge",
            width = 0.5)+
    geom_errorbar(aes(ymin = TargetAccuracy - se,
                      ymax = TargetAccuracy + se),
+
                  width=.2, position=position_dodge(.5)) +
+
    theme_few()+
+
    scale_fill_wsj()+
    xlab("Path Length") + ylab("Mean Target Accuracy") +
    ggtitle("Target Accuracy by Path Length & Prime Accuracy") +
      theme(axis.text = element_text(face = "bold", size = rel(1.2)),
            axis.title = element_text(face = "bold", size = rel(1.2)),
+
            legend.title = element_text(face = "bold", size = rel(1.2)),
            plot.title = element_text( size = rel(1), hjust = .5))
```





4 AOV

4.1 Target Accuracy

4.2 Prime Accuracy

4.3 Effect of Retrieval

```
Error: Subject

Df Sum Sq Mean Sq F value Pr(>F)

Residuals 47 3.391 0.07215

Error: Subject:PrimeFirstResp_ACC

Df Sum Sq Mean Sq F value Pr(>F)
```

```
Residuals
                  47 1.3130 0.02794
Error: Subject:pathlength
            Df Sum Sq Mean Sq F value Pr(>F)
            3 0.033 0.01112
                                0.49 0.69
Residuals 141 3.202 0.02271
Error: Subject:PrimeFirstResp_ACC:pathlength
                               Df Sum Sq Mean Sq F value Pr(>F)
PrimeFirstResp_ACC:pathlength
                               3 0.361 0.12026 3.27 0.0232 *
Residuals
                              141 5.186 0.03678
Signif. codes: 0 âĂŸ***âĂŹ 0.001 âĂŸ**âĂŹ 0.01 âĂŸ*âĂŹ 0.05 âĂŸ.âĂŹ 0.1 âĂŸ âĂŹ 1
> ## LMER
> net$pathlength = as.factor(net$pathlength)
> net$Subject = as.factor(net$Subject)
> net$PrimeFirstResp_ACC = as.factor(net$PrimeFirstResp_ACC)
> library(optimx)
> library(lme4)
> retrieval_model = glmer(data = net,
                          {\tt TargetAccuracy} \ \sim \ {\tt pathlength*PrimeFirstResp\_ACC} \ + \\
                          (1|Subject) + (1|Stimuli1), family = "binomial",
                          control = glmerControl(optimizer = "optimx",
                                                 calc.derivs = FALSE,
       optCtrl = list(method = "nlminb", starttests = FALSE, kkt = FALSE)))
> summary(retrieval_model)
Generalized linear mixed model fit by maximum likelihood (Laplace
  Approximation) [glmerMod]
Family: binomial (logit)
Formula: TargetAccuracy ~ pathlength * PrimeFirstResp_ACC + (1 | Subject) +
    (1 | Stimuli1)
   Data: net
Control:
glmerControl(optimizer = "optimx", calc.derivs = FALSE, optCtrl = list(method = "nlminb"
    starttests = FALSE, kkt = FALSE))
              BIC
                  logLik deviance df.resid
  3824.8
           3886.2 -1902.4 3804.8
Scaled residuals:
    Min
         1Q Median
                             3 Q
-4.4698 -0.6475 0.2139 0.6497
                                3.8589
Random effects:
```

PrimeFirstResp_ACC 1 0.0129 0.01287 0.461 0.501

```
Variance Std.Dev.
 Groups
          Name
 Stimuli1 (Intercept) 2.3631
                             1.5372
 Subject (Intercept) 0.2276
                               0.4771
Number of obs: 3456, groups: Stimuli1, 72; Subject, 48
Fixed effects:
                                    Estimate Std. Error z value Pr(>|z|)
(Intercept)
                                    -0.007773
                                                0.228308
                                                          -0.034
                                                                   0.9728
pathlengthPL15
                                    0.284371
                                                0.178286
                                                          1.595
                                                                   0.1107
                                    0.059384
                                                          0.341
pathlengthPL3
                                               0.174275
                                                                   0.7333
pathlengthPL6
                                    0.088339
                                               0.175690
                                                         0.503
                                                                   0.6151
PrimeFirstResp_ACC1
                                    0.414188
                                               0.172704
                                                          2.398
                                                                   0.0165 *
pathlengthPL15:PrimeFirstResp_ACC1 -0.563928
                                                0.245406
                                                          -2.298
                                                                   0.0216 *
pathlengthPL3:PrimeFirstResp_ACC1
                                   -0.286751
                                                0.244274
                                                          -1.174
                                                                   0.2404
pathlengthPL6:PrimeFirstResp_ACC1
                                   -0.300875
                                               0.244572
                                                         -1.230
                                                                   0.2186
Signif. codes: 0 âĂŸ***âĂŹ 0.001 âĂŸ**âĂŹ 0.01 âĂŸ*âĂŹ 0.05 âĂŸ.âĂŹ 0.1 âĂŸ âĂŹ 1
Correlation of Fixed Effects:
            (Intr) ptPL15 pthPL3 pthPL6 PFR_AC pPL15: pPL3:P
pthlngtPL15 -0.346
pthlngthPL3 -0.357
                    0.454
pthlngthPL6 -0.349
                    0.447
                          0.469
PrmFrR_ACC1 -0.380 0.482
                          0.494
                                  0.489
pPL15:PFR_A 0.264 -0.760 -0.345 -0.340 -0.698
pPL3:PFR_AC 0.268 -0.339 -0.749 -0.355 -0.703
                                                       0.505
pPL6:PFR_AC 0.263 -0.335 -0.357 -0.752 -0.700
                                                0.487
```

> car::Anova(retrieval_model)

```
Analysis of Deviance Table (Type II Wald chisquare tests)

Response: TargetAccuracy

Chisq Df Pr(>Chisq)

pathlength 0.6496 3 0.8850

PrimeFirstResp_ACC 2.1035 1 0.1470

pathlength: PrimeFirstResp_ACC 5.2968 3 0.1513
```

5 Demasking RTs

```
+ net$RTrecognisePrime < 7000)
> net_firsttrim_targetdef = subset(net,
+ net$TargetDefRT > 250 &
+ net$TargetDefRT < 9000)</pre>
```

RTRecogniseprime

```
> ## FOR PRIME
> ## aggregate per subject all IVs and DVs
> meanRT = group_by(net_firsttrim_prime, Subject) %>%
    summarise_at(vars(RTrecognisePrime), mean)
> colnames(meanRT) = c("Subject",
                       "MeanRTrecogPrime")
> sdRT = group_by(net_firsttrim_prime, Subject) %>%
   summarise_at(vars(RTrecognisePrime), sd)
 colnames(sdRT) = c("Subject",
                       "sdRTrecogPrime")
> RT_agg = merge(meanRT, sdRT, by = "Subject")
> ## merge aggregate info with long data
> net_z_prime = merge(net_firsttrim_prime,
                               RT_agg, by = "Subject", all.x = T)
> ## person and grand-mean centered scores using original and aggregate
> library(dplyr)
> net_z_prime = net_z_prime %>% mutate(zPrimeRecogRT =
                                                (RTrecognisePrime -
                                                   MeanRTrecogPrime)/sdRTrecogPrime)
> ## checking: subject level means should be zero
> sub_pic = group_by(net_z_prime, Subject) %>%
 summarise_at(vars(zPrimeRecogRT), mean)
```

RTRecogniseTarget

```
> ## FOR TARGET
> ## aggregate per subject all IVs and DVs
> meanRT = group_by(net_firsttrim_target, Subject) %>%
+ summarise_at(vars(RTrecogniseTarget), mean)
> colnames(meanRT) = c("Subject", "MeanRTrecogTarget")
> sdRT = group_by(net_firsttrim_target, Subject) %>%
+ summarise_at(vars(RTrecogniseTarget), sd)
> colnames(sdRT) = c("Subject", "sdRTrecogTarget")
> RT_agg = merge(meanRT, sdRT, by = "Subject")
> ## merge aggregate info with long data
> net_z_target= merge(net_firsttrim_target,
+ RT_agg, by = "Subject", all.x = T)
> ## person and grand-mean centered scores using original and aggregate
```

6 Trimming z-RTs

7 Repeating z-scoring

7.1 For prime

```
> ## aggregate per subject all IVs and DVs
 meanRT_prime = group_by(net_z_trimmed_prime, Subject) %>%
    summarise_at(vars(RTrecognisePrime), mean)
 colnames(meanRT_prime) = c("Subject",
                       "MeanRTrecogPrime_trim")
> sdRT_prime = group_by(net_z_trimmed_prime, Subject) %>%
    summarise_at(vars(RTrecognisePrime), sd)
 colnames(sdRT_prime) = c("Subject",
                       "sdRTrecogPrime_trim")
> RT_agg_prime = merge(meanRT_prime, sdRT_prime, by = "Subject")
 ## merge aggregate info with long data
> net_final_z_prime = merge(net_z_trimmed_prime,
                               RT_agg_prime, by = "Subject", all.x = T)
 ## person and grand-mean centered scores using original and aggregate
> library(dplyr)
> net_final_z_prime = net_final_z_prime %>%
                                    mutate( zPrimeRecogRT_trim =
                                                (RTrecognisePrime -
                                        MeanRTrecogPrime_trim)/sdRTrecogPrime_trim)
>
  ## checking: subject level means should be zero
```

```
> sub_pic = group_by(net_final_z_prime, Subject) %>%
+ summarise_at(vars(zPrimeRecogRT_trim), mean)
>
```

7.2 For Target

```
> ## aggregate per subject all IVs and DVs
> meanRT_target = group_by(net_z_trimmed_target, Subject) %>%
    summarise_at(vars(RTrecogniseTarget), mean)
> colnames(meanRT_target) = c("Subject",
                       "MeanRTrecogTarget_trim")
> sdRT_target = group_by(net_z_trimmed_target, Subject) %>%
    summarise_at(vars(RTrecogniseTarget), sd)
 colnames(sdRT_target) = c("Subject",
                        "sdRTrecogTarget_trim")
> RT_agg_target = merge(meanRT_target, sdRT_target, by = "Subject")
> ## merge aggregate info with long data
> net_final_z_target = merge(net_z_trimmed_target,
                               RT_agg_target, by = "Subject", all.x = T)
>
 ## person and grand-mean centered scores using original and aggregate
> library(dplyr)
> net_final_z_target = net_final_z_target %>%
                                    mutate( zTargetRecogRT_trim =
                                                (RTrecogniseTarget -
                                        MeanRTrecogTarget_trim)/sdRTrecogTarget_trim)
 ## checking: subject level means should be zero
 sub_pic = group_by(net_final_z_target, Subject) %>%
   summarise_at(vars(zTargetRecogRT_trim), mean)
```

7.3 Combining z-RT Prime and Target

8 Linear Models

```
> # Mean RT to retrieve Target as a function of Prime Condition
> # Effect of RT prime on Accuracy
> library(lme4)
> library(lmerTest)
> RTprime_acc_model = glmer(data = net_final_z,
                           TargetAccuracy ~ zPrimeRecogRT_trim*pathlength +
                              (1|Subject) + (1|Stimuli1), family = binomial)
> summary(RTprime_acc_model)
Generalized linear mixed model fit by maximum likelihood (Laplace
  Approximation) [glmerMod]
 Family: binomial (logit)
Formula: TargetAccuracy \sim zPrimeRecogRT_trim * pathlength + (1 | Subject) +
    (1 | Stimuli1)
   Data: net_final_z
     AIC
             BIC logLik deviance df.resid
  3669.5
           3730.5 -1824.7
                            3649.5
Scaled residuals:
         1Q Median
    Min
                            3 Q
-4.4403 -0.6573 0.2236 0.6516
                                3.5634
Random effects:
Groups Name
                     Variance Std.Dev.
 Stimuli1 (Intercept) 2.4175 1.5548
Subject (Intercept) 0.2384 0.4882
Number of obs: 3306, groups: Stimuli1, 72; Subject, 48
Fixed effects:
                                   Estimate Std. Error z value Pr(>|z|)
(Intercept)
                                  0.2244949 0.2145389 1.046
                                                                 0.295
                                                                  0.856
zPrimeRecogRT_trim
                                  -0.0158394 0.0871814 -0.182
pathlengthPL15
                                  -0.0038643 0.1185447 -0.033
                                                                 0.974
pathlengthPL3
                                  -0.0444858 0.1186873
                                                       -0.375
                                                                  0.708
pathlengthPL6
                                  -0.0232283 0.1188323
                                                       -0.195
                                                                  0.845
zPrimeRecogRT_trim:pathlengthPL15 0.0008804
                                             0.1217133
                                                         0.007
                                                                  0.994
zPrimeRecogRT_trim:pathlengthPL3 0.0268590 0.1235306
                                                         0.217
                                                                  0.828
zPrimeRecogRT_trim:pathlengthPL6 0.0995457 0.1254506
                                                       0.794
                                                                  0.427
Correlation of Fixed Effects:
            (Intr) zPrRRT_ ptPL15 pthPL3 pthPL6 zPRRT_:PL1 zPRRT_:PL3
zPrmRcgRT_t -0.014
pthlngtPL15 -0.277
                   0.025
pthlngthPL3 -0.278 0.025
                           0.504
```

0.503 0.502

pthlngthPL6 -0.277 0.024

```
zPRRT_:PL15  0.011  -0.716  -0.032  -0.017  -0.018
zPrRRT_:PL3 0.011 -0.714 -0.017 -0.034 -0.017
                                                  0.505
                                                             0.496
zPrRRT_:PL6  0.013 -0.693 -0.017 -0.017  0.003  0.492
> car::Anova(RTprime_acc_model)
Analysis of Deviance Table (Type II Wald chisquare tests)
Response: TargetAccuracy
                                Chisq Df Pr(>Chisq)
zPrimeRecogRT_trim
                               0.1066 1
                                            0.7441
pathlength
                               0.1754 3
                                             0.9815
zPrimeRecogRT_trim:pathlength 0.8263 3
                                             0.8432
> options(contrasts = c("contr.sum","contr.poly"))
> anova(RTprime_acc_model)
Analysis of Variance Table
                              Df Sum Sq Mean Sq F value
zPrimeRecogRT_trim
                               1 0.10961 0.109615 0.1096
pathlength
                               3 0.17694 0.058981
                                                    0.0590
zPrimeRecogRT_trim:pathlength 3 0.83629 0.278764 0.2788
> RTprime_RT_model = lmer(data = net_final_z,
                    {\tt zTargetRecogRT\_trim} \, \sim \, {\tt zPrimeRecogRT\_trim*pathlength} \, + \,
                               (1|Subject) + (1|Stimuli1) )
> summary(RTprime_RT_model)
Linear mixed model fit by REML. t-tests use Satterthwaite's method [
lmerModLmerTest]
Formula: zTargetRecogRT\_trim \sim zPrimeRecogRT\_trim * pathlength + (1 | 
    Subject) + (1 | Stimuli1)
   Data: net_final_z
REML criterion at convergence: 8887.6
Scaled residuals:
    Min
         1Q Median
                             3 Q
                                    Max
-2.6406 -0.6232 -0.2314 0.4217 4.6935
Random effects:
 Groups Name
                      Variance Std.Dev.
 Stimuli1 (Intercept) 1.686e-01 4.106e-01
 Subject (Intercept) 5.846e-20 2.418e-10
 Residual
                      8.093e-01 8.996e-01
Number of obs: 3306, groups: Stimuli1, 72; Subject, 48
```

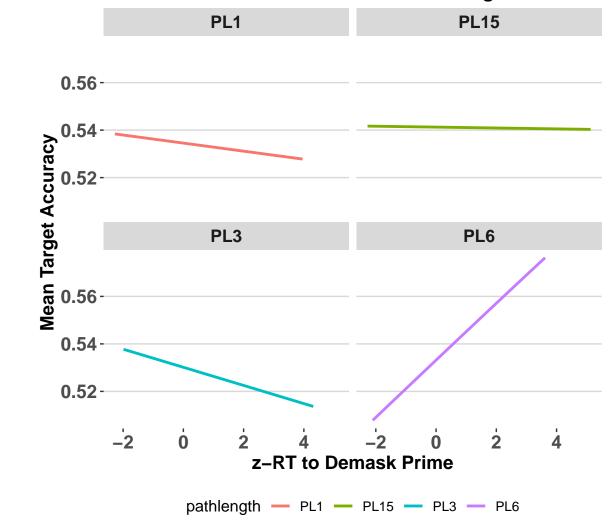
```
Fixed effects:
                                 Estimate Std. Error
                                                             df t value
(Intercept)
                                8.195e-04 5.087e-02 6.954e+01 0.016
zPrimeRecogRT_trim
                                1.359e-01 1.626e-02 3.256e+03
                                                                 8.354
pathlength1
                               -3.371e-02 2.717e-02 3.228e+03 -1.241
                                          2.718e-02 3.228e+03
                                                                  1.631
pathlength2
                                4.432e-02
pathlength3
                               -3.706e-02
                                           2.710e-02
                                                      3.227e+03
                                                                  -1.367
zPrimeRecogRT_trim:pathlength1 -8.416e-03
                                           2.789e-02 3.256e+03
                                                                 -0.302
zPrimeRecogRT_trim:pathlength2 -1.536e-02
                                          2.807e-02 3.262e+03 -0.547
zPrimeRecogRT_trim:pathlength3 -1.739e-02 2.787e-02 3.257e+03 -0.624
                               Pr(>|t|)
(Intercept)
                                  0.987
                                 <2e-16 ***
zPrimeRecogRT_trim
pathlength1
                                  0.215
pathlength2
                                  0.103
                                  0.172
pathlength3
                                  0.763
zPrimeRecogRT_trim:pathlength1
zPrimeRecogRT_trim:pathlength2
                                  0.584
zPrimeRecogRT_trim:pathlength3
                                  0.533
Signif. codes: 0 âĂŸ***âĂŹ 0.001 âĂŸ**âĂŹ 0.01 âĂŸ*âĂŹ 0.05 âĂŸ.âĂŹ 0.1 âĂŸ âĂŹ 1
Correlation of Fixed Effects:
            (Intr) zPrRRT_ pthln1 pthln2 pthln3 zPRRT_:1 zPRRT_:2
zPrmRcgRT_t 0.003
pathlength1 0.000 -0.031
pathlength2 0.000 -0.007
                           -0.334
pathlength3 -0.001 -0.011
                           -0.331 -0.331
zPrmRcRT_:1 -0.009 -0.016
                                  0.021
                                          0.022
                           -0.029
zPrmRcRT_:2 -0.003 -0.021
                            0.022 -0.004
                                         0.010 -0.319
zPrmRcRT_:3 -0.003 -0.025
                           0.023 0.008 -0.004 -0.325
                                                         -0.320
> car::Anova(RTprime_RT_model)
Analysis of Deviance Table (Type II Wald chisquare tests)
Response: zTargetRecogRT_trim
                                Chisq Df Pr(>Chisq)
zPrimeRecogRT_trim
                              68.6025
                                       1
                                             <2e-16 ***
pathlength
                               5.0852
                                       3
                                             0.1657
zPrimeRecogRT_trim:pathlength 2.0680
                                      3
                                             0.5584
Signif. codes: 0 âĂŸ***âĂŹ 0.001 âĂŸ**âĂŹ 0.01 âĂŸ*âĂŹ 0.05 âĂŸ.âĂŹ 0.1 âĂŸ âĂŹ 1
```

> options(contrasts = c("contr.sum","contr.poly"))

> anova(RTprime_RT_model)

8.1 Acc Figure

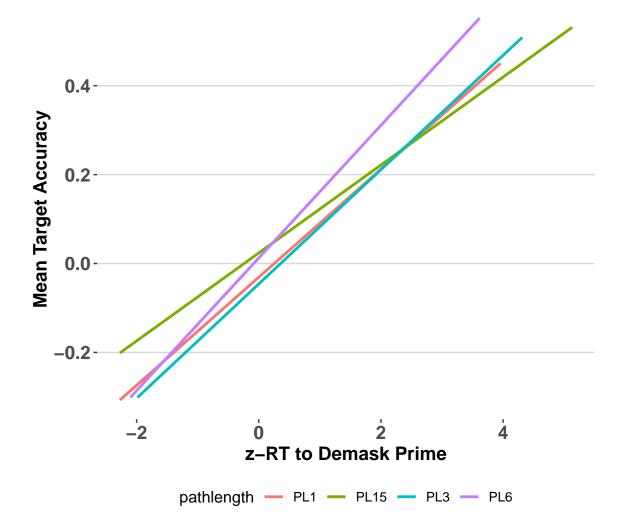
Target Accuracy as a Function of RT to Demask Prime & Path Length



8.2 RT Figure

```
+ axis.title = element_text(face = "bold", size = rel(1.2)),
+ strip.text.x = element_text(face = "bold", size = rel(1.4)),
+ plot.title = element_text(face = "bold", size = rel(1.2), hjust = .5))
```

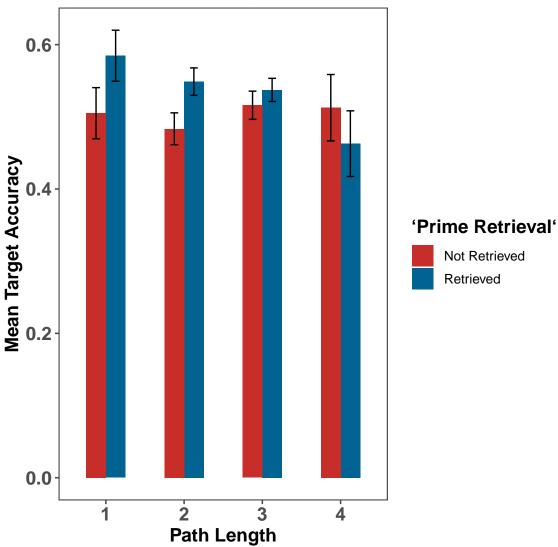
Target Accuracy as a Function of RT to Demask Prime & Path Length



9 Undirected Network

```
measurevar = "TargetAccuracy",
                        groupvars = c("Undirected", "PrimeFirstResp_ACC"))
> undirected_rmisc$PrimeFirstResp_ACC = as.factor(undirected_rmisc$PrimeFirstResp_ACC)
> undirected_rmisc$Undirected = as.factor(undirected_rmisc$Undirected)
> undirected_rmisc = undirected_rmisc %>% filter(!is.na(undirected_rmisc$Undirected))
> library(ggplot2)
> library(ggthemes)
 undirected_rmisc %>% mutate(`Prime Retrieval` = factor(PrimeFirstResp_ACC,
                                          levels = unique(PrimeFirstResp_ACC),
                      labels = c("Not Retrieved", "Retrieved")))%>%
 ggplot(aes(x = Undirected,
             y = TargetAccuracy,
             fill = `Prime Retrieval`, group = `Prime Retrieval`))+
   geom_bar(stat = "identity", position = "dodge",
            width = 0.5)+
    geom_errorbar(aes(ymin = TargetAccuracy - se,
                      ymax = TargetAccuracy + se),
                  width=.2, position=position_dodge(.5)) +
    theme_few()+
    scale_fill_wsj()+
    xlab("Path Length") + ylab("Mean Target Accuracy") +
    ggtitle("Target Accuracy by Path Length & Prime Accuracy") +
      theme(axis.text = element_text(face = "bold", size = rel(1.2)),
+
            axis.title = element_text(face = "bold", size = rel(1.2)),
            legend.title = element_text(face = "bold", size = rel(1.2)),
            plot.title = element_text( size = rel(1), hjust = .5))
```

Target Accuracy by Path Length & Prime Accuracy



Undirected Model

```
Generalized linear mixed model fit by maximum likelihood (Laplace
  Approximation) [glmerMod]
 Family: binomial (logit)
Formula: TargetAccuracy \sim undirectedfac * PrimeFirstResp_ACC + (1 | Subject) +
   (1 | Stimuli1)
  Data: net
Control:
glmerControl(optimizer = "optimx", calc.derivs = FALSE, optCtrl = list(method = "nlminb'
    starttests = FALSE, kkt = FALSE))
                   logLik deviance df.resid
             BIC
          3887.3 -1902.9
  3825.8
                           3805.8 3446
Scaled residuals:
           1Q Median
                            3 Q
-4.3630 -0.6478 0.2141 0.6531
                               3.8103
Random effects:
Groups Name
                     Variance Std.Dev.
 Stimuli1 (Intercept) 2.3776 1.5420
 Subject (Intercept) 0.2283 0.4778
Number of obs: 3456, groups: Stimuli1, 72; Subject, 48
Fixed effects:
                                  Estimate Std. Error z value Pr(>|z|)
(Intercept)
                                   0.10537
                                              0.20374
                                                        0.517
                                                                 0.605
undirectedfac1
                                   0.10444
                                                        0.890
                                              0.11734
                                                                 0.373
undirectedfac2
                                   0.08142
                                              0.08400 0.969
                                                                 0.332
undirectedfac3
                                   0.06187
                                              0.07747 0.799
                                                                0.425
PrimeFirstResp_ACC1
                                  -0.06549
                                             0.05804 -1.128
                                                                0.259
undirectedfac1:PrimeFirstResp_ACC1 -0.07712
                                              0.10887
                                                       -0.708
                                                                 0.479
undirectedfac2:PrimeFirstResp_ACC1 -0.05489
                                              0.07805 -0.703
                                                                 0.482
undirectedfac3:PrimeFirstResp_ACC1  0.05127
                                             0.07236 0.709
                                                                 0.479
Correlation of Fixed Effects:
           (Intr) undrc1 undrc2 undrc3 PFR_AC u1:PFR u2:PFR
undirctdfc1 0.035
undirctdfc2 -0.134 -0.318
undirctdfc3 -0.167 -0.164 0.177
PrmFrR_ACC1 0.003 -0.051 0.032
                                0.039
u1:PFR_ACC1 -0.008 -0.066 0.002 0.002 0.135
u2:PFR_ACC1 0.017 0.016 0.043 -0.088 -0.438 -0.256
u3:PFR_ACC1 0.013 0.015 -0.066 0.053 -0.544 -0.224 0.163
```

> car::Anova(retrieval_model_undirected)

Analysis of Deviance Table (Type II Wald chisquare tests)

```
Response: TargetAccuracy
                                  Chisq Df Pr(>Chisq)
undirectedfac
                                 3.0910 3
                                                0.3778
PrimeFirstResp_ACC
                                 2.0724 1
                                                0.1500
undirectedfac:PrimeFirstResp_ACC 1.7892 3
                                               0.6173
> options(contrasts = c("contr.sum","contr.poly"))
> anova(retrieval_model_undirected)
Analysis of Variance Table
                                 Df Sum Sq Mean Sq F value
                                            1.0136
undirectedfac
                                  3 3.0409
                                                    1.0136
                                  1 2.0724
                                            2.0724
                                                    2.0724
PrimeFirstResp_ACC
undirectedfac:PrimeFirstResp_ACC 3 1.7892 0.5964 0.5964
> net_final_z$undirectedfac = as.factor(net_final_z$Undirected)
> RTprime_acc_model_undirected = glmer(data = net_final_z,
                            {\tt TargetAccuracy} \, \sim \, {\tt zPrimeRecogRT\_trim*undirectedfac} \, + \,
                               (1|Subject) + (1|Stimuli1), family = binomial)
> summary(RTprime_acc_model_undirected)
Generalized linear mixed model fit by maximum likelihood (Laplace
  Approximation) [glmerMod]
 Family: binomial (logit)
Formula: TargetAccuracy \sim zPrimeRecogRT_trim * undirectedfac + (1 | Subject) +
    (1 | Stimuli1)
   Data: net_final_z
              BIC logLik deviance df.resid
           3725.8 -1822.4
  3664.7
                           3644.7
Scaled residuals:
         1Q Median
                             3 Q
                                    Max
-4.5450 -0.6560 0.2220 0.6463 3.4222
Random effects:
Groups Name
                      Variance Std.Dev.
Stimuli1 (Intercept) 2.4219 1.5563
 Subject (Intercept) 0.2405
                               0.4904
Number of obs: 3306, groups: Stimuli1, 72; Subject, 48
Fixed effects:
                                   Estimate Std. Error z value Pr(>|z|)
                                   0.150899
                                             0.206562
                                                        0.731
                                                                   0.465
(Intercept)
zPrimeRecogRT_trim
                                   0.082135
                                              0.056686
                                                          1.449
                                                                   0.147
```

0.038636

0.111908

0.120382

0.086930

0.321

1.287

0.748

0.198

undirectedfac1

undirectedfac2

```
0.043535
                                              0.079461
undirectedfac3
                                                        0.548
                                                                  0.584
zPrimeRecogRT_trim:undirectedfac1 -0.008329 0.103719 -0.080
                                                                   0.936
zPrimeRecogRT_trim:undirectedfac2 -0.051908
                                              0.077670
                                                        -0.668
                                                                   0.504
zPrimeRecogRT_trim:undirectedfac3 -0.134096
                                                                  0.066 .
                                              0.072932
                                                        -1.839
Signif. codes: 0 âĂŸ***âĂŹ 0.001 âĂŸ**âĂŹ 0.01 âĂŸ*âĂŹ 0.05 âĂŸ.âĂŹ 0.1 âĂŸ âĂŹ 1
Correlation of Fixed Effects:
            (Intr) zPrRRT_ undrc1 undrc2 undrc3 zPRRT_:1 zPRRT_:2
zPrmRcgRT_t -0.026
undirctdfc1 0.031 -0.026
undirctdfc2 -0.139 0.069
                          -0.303
undirctdfc3 -0.174 0.080 -0.149 0.194
zPrmRcRT_:1 -0.002 0.082
                          -0.104 0.001 -0.013
zPrmRcRT_:2 0.025 -0.406 0.011 -0.070 -0.067 -0.248
zPrmRcRT_:3 0.023 -0.536 0.032 -0.063 -0.050 -0.202
                                                         0.132
> car::Anova(RTprime_acc_model_undirected)
Analysis of Deviance Table (Type II Wald chisquare tests)
Response: TargetAccuracy
                                  Chisq Df Pr(>Chisq)
zPrimeRecogRT_trim
                                 0.1131
                                        1
                                               0.7366
undirectedfac
                                 1.8664 3
                                               0.6006
zPrimeRecogRT_trim:undirectedfac 3.8941 3
                                               0.2731
> options(contrasts = c("contr.sum","contr.poly"))
> anova(RTprime_acc_model_undirected)
Analysis of Variance Table
                                 Df Sum Sq Mean Sq F value
                                  1 0.1050 0.10497
zPrimeRecogRT_trim
                                                   0.1050
                                  3 1.8788 0.62626 0.6263
undirectedfac
zPrimeRecogRT_trim:undirectedfac 3 3.9450 1.31501 1.3150
> RTprime_RT_model_undirected = lmer(data = net_final_z,
+
                    {\tt zTargetRecogRT\_trim} \ \sim \ {\tt zPrimeRecogRT\_trim*undirectedfac} \ +
                              (1|Subject) + (1|Stimuli1) )
> summary(RTprime_RT_model_undirected)
Linear mixed model fit by REML. t-tests use Satterthwaite's method [
lmerModLmerTest]
```

Formula: $zTargetRecogRT_trim \sim zPrimeRecogRT_trim * undirectedfac + (1 |$

Subject) + (1 | Stimuli1)

Data: net_final_z

```
REML criterion at convergence: 8881.5
Scaled residuals:
   Min 1Q Median
                            3 Q
                                   Max
-2.7538 -0.6337 -0.2260 0.4237
                               4.6717
Random effects:
 Groups Name
                     Variance Std.Dev.
 Stimuli1 (Intercept) 0.1704 0.4127
 Subject (Intercept) 0.0000
                             0.0000
 Residual
                     0.8082
                            0.8990
Number of obs: 3306, groups: Stimuli1, 72; Subject, 48
Fixed effects:
                                   Estimate Std. Error
                                                               df t value
(Intercept)
                                  2.606e-02 5.344e-02 8.271e+01
                                                                   0.488
zPrimeRecogRT_trim
                                  1.470e-01 2.092e-02 3.262e+03
                                                                  7.027
undirectedfac1
                                  1.478e-02 4.342e-02 3.294e+03
                                                                  0.340
undirectedfac2
                                  -5.001e-02 3.175e-02 3.291e+03 -1.575
undirectedfac3
                                  -3.684e-02 2.939e-02 3.296e+03 -1.254
zPrimeRecogRT_trim:undirectedfac1 5.611e-02 3.742e-02 3.256e+03
                                                                   1.499
zPrimeRecogRT_trim:undirectedfac2 -6.771e-02 2.876e-02 3.258e+03
                                                                   -2.354
zPrimeRecogRT_trim:undirectedfac3 -2.021e-03 2.700e-02 3.261e+03
                                                                  -0.075
                                 Pr(>|t|)
(Intercept)
                                   0.6271
zPrimeRecogRT_trim
                                 2.57e-12 ***
undirectedfac1
                                   0.7336
undirectedfac2
                                   0.1154
undirectedfac3
                                   0.2101
zPrimeRecogRT_trim:undirectedfac1
                                   0.1339
zPrimeRecogRT_trim:undirectedfac2
                                   0.0186 *
zPrimeRecogRT_trim:undirectedfac3
                                   0.9403
Signif. codes: 0 âĂŸ***âĂŹ 0.001 âĂŸ**âĂŹ 0.01 âĂŸ*âĂŹ 0.05 âĂŸ.âĂŹ 0.1 âĂŸ âĂŹ 1
Correlation of Fixed Effects:
            (Intr) zPrRRT_ undrc1 undrc2 undrc3 zPRRT_:1 zPRRT_:2
zPrmRcgRT_t -0.034
\verb"undirctdfc1" 0.046" -0.046"
undirctdfc2 -0.196 0.062
                          -0.295
undirctdfc3 -0.247 0.080 -0.162 0.190
zPrmRcRT_:1 -0.013 0.061 -0.111 0.019
                                        0.010
zPrmRcRT_:2 0.032 -0.393 0.017 -0.041 -0.070 -0.240
zPrmRcRT_:3 0.033 -0.523 0.045 -0.068 -0.039 -0.192
                                                         0.118
```

> car::Anova(RTprime_RT_model_undirected)

Analysis of Deviance Table (Type II Wald chisquare tests)

```
Response: zTargetRecogRT_trim

Chisq Df Pr(>Chisq)

zPrimeRecogRT_trim 66.3415 1 3.792e-16 ***
undirectedfac 4.0258 3 0.25870

zPrimeRecogRT_trim:undirectedfac 6.6100 3 0.08543 .

---
Signif. codes: 0 âĂŸ***âĂŹ 0.001 âĂŸ**âĂŹ 0.01 âĂŸ*âĂŹ 0.05 âĂŸ.âĂŹ 0.1 âĂŸ âĂŹ 1

> options(contrasts = c("contr.sum", "contr.poly"))
> anova(RTprime_RT_model_undirected)
```

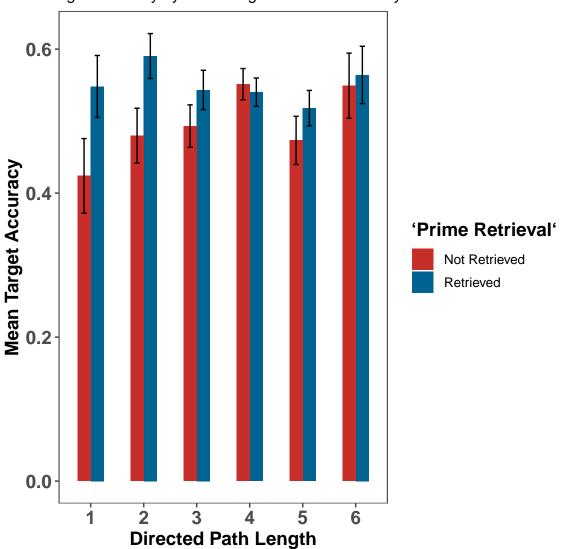
```
Type III Analysis of Variance Table with Satterthwaite's method
                                 Sum Sq Mean Sq NumDF DenDF F value
                                                                        Pr(>F)
                                        39.904
                                                   1 3261.8 49.3724 2.566e-12
zPrimeRecogRT_trim
                                 39.904
undirectedfac
                                                    3 3294.1
                                  2.816
                                         0.939
                                                             1.1614
zPrimeRecogRT_trim:undirectedfac 5.342
                                        1.781
                                                   3 3257.1 2.2033
                                                                       0.08564
zPrimeRecogRT_trim
undirectedfac
zPrimeRecogRT_trim:undirectedfac .
Signif. codes: 0 âĂŸ***âĂŹ 0.001 âĂŸ**âĂŹ 0.01 âĂŸ*âĂŹ 0.05 âĂŸ.âĂŹ 0.1 âĂŸ âĂŹ 1
```

10 Directed Network

```
> net$newdirected = ifelse(net$Directed == "Inf" |
                                net$Directed == "NA", NA,
                                net$Directed)
 directed_rmisc = Rmisc::summarySE(net,
                        measurevar = "TargetAccuracy",
                        groupvars = c("newdirected", "PrimeFirstResp_ACC"))
> directed_rmisc = directed_rmisc %>% filter(!is.na(newdirected))
> directed_rmisc$PrimeFirstResp_ACC = as.factor(directed_rmisc$PrimeFirstResp_ACC)
> directed_rmisc$newdirected = as.factor(directed_rmisc$newdirected)
> library(ggplot2)
> library(ggthemes)
> directed_rmisc %>% mutate(`Prime Retrieval` = factor(PrimeFirstResp_ACC,
                                          levels = unique(PrimeFirstResp_ACC),
                      labels = c("Not Retrieved", "Retrieved")))%>%
 ggplot(aes(x = newdirected,
             y = TargetAccuracy,
             fill = `Prime Retrieval`, group = `Prime Retrieval`))+
   geom_bar(stat = "identity", position = "dodge",
            width = 0.5)+
    geom_errorbar(aes(ymin = TargetAccuracy - se,
```

```
# ymax = TargetAccuracy + se),
# width=.2, position=position_dodge(.5)) +
# theme_few()+
# scale_fill_wsj()+
# xlab("Directed Path Length") + ylab("Mean Target Accuracy") +
# ggtitle("Target Accuracy by Path Length & Prime Accuracy") +
# theme(axis.text = element_text(face = "bold", size = rel(1.2)),
# axis.title = element_text(face = "bold", size = rel(1.2)),
# legend.title = element_text(face = "bold", size = rel(1.2)),
# plot.title = element_text( size = rel(1), hjust = .5))
```

Target Accuracy by Path Length & Prime Accuracy



Directed Model

```
Generalized linear mixed model fit by maximum likelihood (Laplace
  Approximation) [glmerMod]
Family: binomial (logit)
Formula: TargetAccuracy ~ newdirected * PrimeFirstResp_ACC + (1 | Subject) +
   (1 | Stimuli1)
  Data: net
Control:
glmerControl(optimizer = "optimx", calc.derivs = FALSE, optCtrl = list(method = "nlminb"
    starttests = FALSE, kkt = FALSE))
             BIC
                  logLik deviance df.resid
          3734.5 -1842.9 3685.8 3355
  3697.8
Scaled residuals:
         10 Median
                            30
-4.4648 -0.6425 0.2167 0.6523
                               3.6660
Random effects:
Groups Name
                     Variance Std.Dev.
Stimuli1 (Intercept) 2.4315 1.5593
 Subject (Intercept) 0.2365 0.4863
Number of obs: 3361, groups: Stimuli1, 72; Subject, 48
Fixed effects:
                               Estimate Std. Error z value Pr(>|z|)
                                                    1.786 0.07414 .
(Intercept)
                                           0.24636
                                0.43993
                                                   -1.929
newdirected
                               -0.07317
                                           0.03793
                                                           0.05371 .
                                                   -2.824
PrimeFirstResp_ACC1
                               -0.38124
                                          0.13502
                                                           0.00475 **
newdirected:PrimeFirstResp_ACC1 0.08369
                                          0.03395
                                                   2.465 0.01369 *
Signif. codes: 0 âĂŸ***âĂŹ 0.001 âĂŸ**âĂŹ 0.01 âĂŸ*âĂŹ 0.05 âĂŸ.âĂŹ 0.1 âĂŸ âĂŹ 1
Correlation of Fixed Effects:
           (Intr) nwdrct PFR_AC
newdirected -0.572
PrmFrR_ACC1 0.075 -0.121
nw:PFR_ACC1 -0.070 0.128 -0.943
```

```
Analysis of Deviance Table (Type II Wald chisquare tests)
Response: TargetAccuracy
                                Chisq Df Pr(>Chisq)
newdirected
                               5.1170
                                      1
                                            0.02369 *
                               2.2515
                                      1
PrimeFirstResp_ACC
                                             0.13348
newdirected:PrimeFirstResp_ACC 6.0781
                                      1
                                            0.01369 *
Signif. codes: 0 âĂŸ***âĂŹ 0.001 âĂŸ**âĂŹ 0.01 âĂŸ*âĂŹ 0.05 âĂŸ.âĂŹ 0.1 âĂŸ âĂŹ 1
> options(contrasts = c("contr.sum","contr.poly"))
> anova(retrieval_model_directed)
Analysis of Variance Table
                               Df Sum Sq Mean Sq F value
newdirected
                                1 5.1342
                                         5.1342 5.1342
                                         2.2515
PrimeFirstResp_ACC
                                1 2.2515
                                                   2.2515
newdirected:PrimeFirstResp_ACC 1 6.0781 6.0781 6.0781
> net_final_z$newdirected = ifelse(net_final_z$Directed == "Inf" |
                                net_final_z$Directed == "NA", NA,
                                net_final_z$Directed)
> RTprime_acc_model_directed = glmer(data = net_final_z,
                            {\tt TargetAccuracy} \ \sim \ {\tt zPrimeRecogRT\_trim*newdirected} \ + \\
                               (1|Subject) + (1|Stimuli1), family = binomial )
> summary(RTprime_acc_model_directed)
Generalized linear mixed model fit by maximum likelihood (Laplace
  Approximation) [glmerMod]
 Family: binomial (logit)
Formula: TargetAccuracy ~ zPrimeRecogRT_trim * newdirected + (1 | Subject) +
    (1 | Stimuli1)
   Data: net_final_z
     AIC
              BIC
                   logLik deviance df.resid
           3591.7 -1771.6
  3555.2
                             3543.2
                                        3215
Scaled residuals:
    Min 1Q Median
                             3 Q
                                    Max
-4.6235 -0.6543 0.2277 0.6433
                                 3.5036
Random effects:
 Groups Name
                      Variance Std.Dev.
 Stimuli1 (Intercept) 2.4586
                               1.5680
 Subject (Intercept) 0.2515
```

> car::Anova(retrieval_model_directed)

```
Number of obs: 3221, groups: Stimuli1, 72; Subject, 48
Fixed effects:
                                Estimate Std. Error z value Pr(>|z|)
(Intercept)
                                0.496830 0.249413 1.992
                                                              0.0464 *
                                0.048098 0.133417
                                                    0.361
zPrimeRecogRT_trim
                                                              0.7185
newdirected
                               -0.075770
                                          0.038640
                                                     -1.961
                                                              0.0499 *
zPrimeRecogRT_trim:newdirected -0.009696 0.034026 -0.285
                                                              0.7757
Signif. codes: 0 âĂŸ***âĂŹ 0.001 âĂŸ**âĂŹ 0.01 âĂŸ*âĂŹ 0.05 âĂŸ.âĂŹ 0.1 âĂŸ âĂŹ 1
Correlation of Fixed Effects:
            (Intr) zPrRRT_ nwdrct
zPrmRcgRT_t -0.004
newdirected -0.575 0.009
zPrmRcgRT_: 0.009 -0.942 -0.016
> car::Anova(RTprime_acc_model_directed)
Analysis of Deviance Table (Type II Wald chisquare tests)
Response: TargetAccuracy
                                Chisq Df Pr(>Chisq)
zPrimeRecogRT_trim
                               0.0756 1
                                            0.78341
                               3.8647
                                            0.04931 *
newdirected
                                      1
zPrimeRecogRT_trim:newdirected 0.0812
                                      1
                                            0.77567
Signif. codes: 0 âĂŸ***âĂŹ 0.001 âĂŸ**âĂŹ 0.01 âĂŸ*âĂŹ 0.05 âĂŸ.âĂŹ 0.1 âĂŸ âĂŹ 1
> options(contrasts = c("contr.sum","contr.poly"))
> anova(RTprime_acc_model_directed)
Analysis of Variance Table
                               Df Sum Sq Mean Sq F value
zPrimeRecogRT_trim
                                1 0.0541 0.0541 0.0541
newdirected
                                1 3.9036 3.9036 3.9036
zPrimeRecogRT_trim:newdirected 1 0.0818 0.0818 0.0818
> RTprime_RT_model_directed = lmer(data = net_final_z,
                    zTargetRecogRT\_trim \sim zPrimeRecogRT\_trim*newdirected +
                              (1|Subject) + (1|Stimuli1) )
> summary(RTprime_RT_model_directed)
Linear mixed model fit by REML. t-tests use Satterthwaite's method [
lmerModLmerTest]
Formula: zTargetRecogRT\_trim \sim zPrimeRecogRT\_trim * newdirected + (1 |
```

Subject) + (1 | Stimuli1)

```
Data: net_final_z
REML criterion at convergence: 8650.7
Scaled residuals:
         1Q Median
    Min
                            3 Q
-2.7558 -0.6295 -0.2313 0.4230
Random effects:
                     Variance Std.Dev.
Groups Name
 Stimuli1 (Intercept) 0.1735 0.4165
 Subject (Intercept) 0.0000 0.0000
                     0.8097
                             0.8998
Residual
Number of obs: 3221, groups: Stimuli1, 72; Subject, 48
Fixed effects:
                                Estimate Std. Error
                                                            df t value
(Intercept)
                              -5.003e-02 7.254e-02 2.506e+02 -0.690
zPrimeRecogRT_trim
                               1.668e-01 4.784e-02 3.176e+03 3.487
newdirected
                               1.444e-02 1.375e-02 3.205e+03 1.050
zPrimeRecogRT_trim:newdirected -7.797e-03 1.222e-02 3.176e+03 -0.638
                              Pr(>|t|)
                              0.491061
(Intercept)
                              0.000496 ***
zPrimeRecogRT_trim
newdirected
                              0.293632
zPrimeRecogRT_trim:newdirected 0.523612
Signif. codes: 0 âĂŸ***âĂŹ 0.001 âĂŸ**âĂŹ 0.01 âĂŸ*âĂŹ 0.05 âĂŸ.âĂŹ 0.1 âĂŸ âĂŹ 1
Correlation of Fixed Effects:
            (Intr) zPrRRT_ nwdrct
zPrmRcgRT_t -0.003
newdirected -0.703 0.005
zPrmRcgRT_: 0.005 -0.938 -0.006
> car::Anova(RTprime_RT_model_directed)
Analysis of Deviance Table (Type II Wald chisquare tests)
```

```
Analysis of Deviance Table (Type II Wald chisquare tests)

Response: zTargetRecogRT_trim

Chisq Df Pr(>Chisq)

zPrimeRecogRT_trim 69.1098 1 <2e-16 ***
newdirected 1.0949 1 0.2954

zPrimeRecogRT_trim:newdirected 0.4069 1 0.5236

---
Signif. codes: 0 âĂŸ***âĂŹ 0.001 âĂŸ**âĂŹ 0.01 âĂŸ*âĂŹ 0.05 âĂŸ.âĂŹ 0.1 âĂŸ âĂŹ 1
```

> options(contrasts = c("contr.sum","contr.poly"))

> anova(RTprime_RT_model)

```
Type III Analysis of Variance Table with Satterthwaite's method
Sum Sq Mean Sq NumDF DenDF F value Pr(>F)

zPrimeRecogRT_trim 56.480 56.480 1 3256.1 69.7916 <2e-16 ***
pathlength 4.255 1.418 3 3227.5 1.7528 0.1541
zPrimeRecogRT_trim:pathlength 1.674 0.558 3 3257.1 0.6893 0.5585
---
Signif. codes: 0 âĂŸ***âĂŹ 0.001 âĂŸ**âĂŹ 0.01 âĂŸ*âĂŹ 0.05 âĂŸ.âĂŹ 0.1 âĂŸ âĂŹ 1
```