

# Prochoice Analysis

## Load the data

```
library(readxl)  
  
file_path <- "/Users/daryani/Desktop/prochoice_intervention.xlsx"  
  
data <- read_excel(file_path)
```

## Prepare the data

```
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

```

# Create mean scores for your key variables
data <- data %>%
  mutate(
    threat_score = rowMeans(select(., threat_1:threat_6), na.rm = TRUE),
    trust_score = rowMeans(select(., trust_1:trust_6), na.rm = TRUE),
    perspective_taking = rowMeans(select(., emp_1:emp_14), na.rm = TRUE)
  )

# Convert intervention to a factor with meaningful labels
data <- data %>%
  mutate(
    intervention_factor = factor(intervention, levels = c(1, 2, 3),
                                   labels = c("Better", "Worse", "Control")),
    group_factor = factor(group, levels = c(1, 2),
                          labels = c("Individualizing", "Binding"))
  )

```

## Run the ANCOVA Models with Moderation

```

# For trust outcome
trust_model <- aov(trust_score ~ ideology + intervention_factor * group_factor,
                     data = data)

# For threat outcome
threat_model <- aov(threat_score ~ ideology + intervention_factor * group_factor,
                     data = data)

# Check results for trust model
summary(trust_model)

```

	Df	Sum Sq	Mean Sq	F value	Pr(>F)						
ideology	1	144.8	144.82	79.361	< 2e-16 ***						
intervention_factor	2	31.5	15.75	8.633	0.000201 ***						
group_factor	1	4.0	3.98	2.179	0.140423						
intervention_factor:group_factor	2	2.3	1.14	0.627	0.534642						
Residuals	597	1089.4	1.82								
---											
Signif. codes:	0	'***'	0.001	'**'	0.01	'*'	0.05	'. '	0.1	' '	1

```
# Check results for threat model
summary(threat_model)
```

	Df	Sum Sq	Mean Sq	F value	Pr(>F)						
ideology	1	226.9	226.91	108.418	< 2e-16 ***						
intervention_factor	2	54.3	27.15	12.974	3.05e-06 ***						
group_factor	1	10.1	10.09	4.823	0.0285 *						
intervention_factor:group_factor	2	1.8	0.90	0.431	0.6498						
Residuals	597	1249.5	2.09								
---											
Signif. codes:	0	'***'	0.001	'**'	0.01	'*'	0.05	'. '	0.1	' '	1

```
library(effectsize)

# For trust model
eta_squared(trust_model, partial = TRUE)
```

# Effect Size for ANOVA (Type I)

Parameter	Eta2 (partial)	95% CI
ideology	0.12	[0.08, 1.00]
intervention_factor	0.03	[0.01, 1.00]
group_factor	3.64e-03	[0.00, 1.00]
intervention_factor:group_factor	2.10e-03	[0.00, 1.00]

- One-sided CIs: upper bound fixed at [1.00].

```
# For threat model
eta_squared(threat_model, partial = TRUE)
```

# Effect Size for ANOVA (Type I)

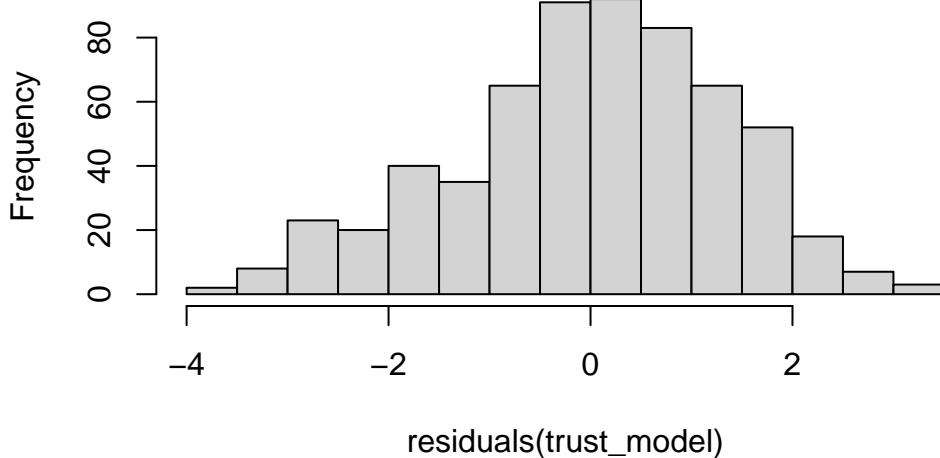
Parameter	Eta2 (partial)	95% CI
ideology	0.15	[0.11, 1.00]
intervention_factor	0.04	[0.02, 1.00]
group_factor	8.01e-03	[0.00, 1.00]
intervention_factor:group_factor	1.44e-03	[0.00, 1.00]

- One-sided CIs: upper bound fixed at [1.00].

## Check Model Assumptions

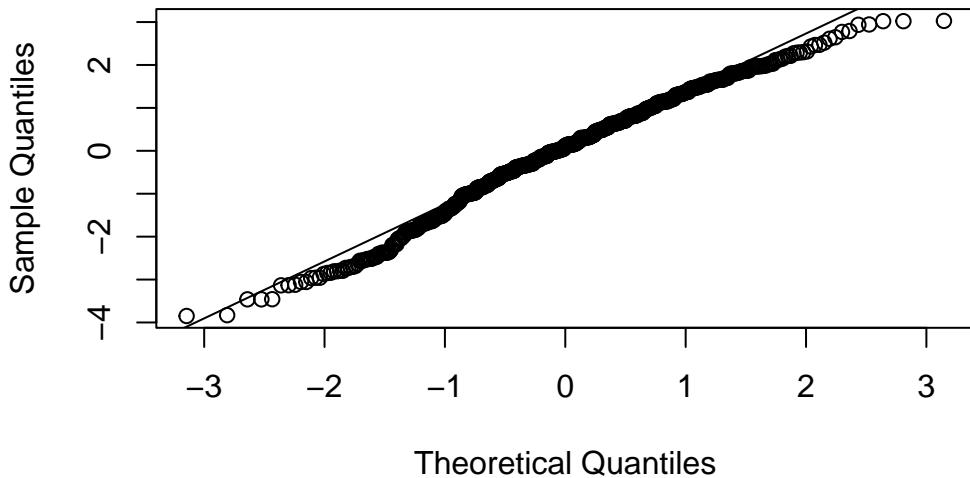
```
# Check normality of residuals  
hist(residuals(trust_model))
```

**Histogram of residuals(trust\_model)**

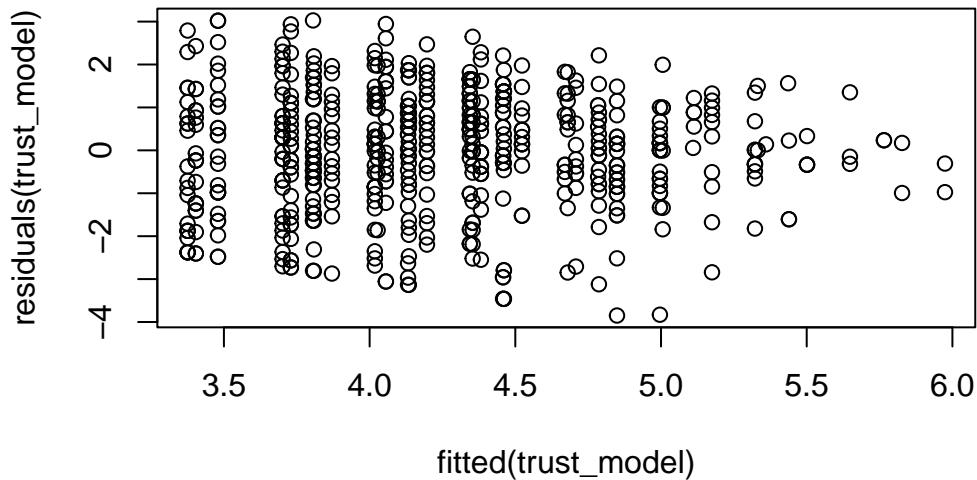


```
qqnorm(residuals(trust_model))  
qqline(residuals(trust_model))
```

**Normal Q-Q Plot**



```
# Check homogeneity of variance  
plot(fitted(trust_model), residuals(trust_model))
```



```
# Repeat for threat model
```

## Calculate EMMs at Different Levels of Perspective Taking

```
library(emmeans)
```

Welcome to emmeans.

Caution: You lose important information if you filter this package's results.  
See '? untidy'

```
# For trust model - Examine the interaction effect  
trust_emms <- emmeans(trust_model,  
                      specs = ~ intervention_factor | group_factor,  
                      covariates = list(ideology = mean(data$ideology, na.rm = TRUE)))  
  
# For threat model  
threat_emms <- emmeans(threat_model,  
                      specs = ~ intervention_factor | group_factor,  
                      covariates = list(ideology = mean(data$ideology, na.rm = TRUE)))  
  
# Alternative: Get the full grid of means  
trust_emms_grid <- emmeans(trust_model,
```

```

    specs = ~ intervention_factor * group_factor,
    covariates = list(ideology = mean(data$ideology, na.rm = TRUE)))

threat_emms_grid <- emmeans(threat_model,
                            specs = ~ intervention_factor * group_factor,
                            covariates = list(ideology = mean(data$ideology, na.rm = TRUE)))

```

## Examine Pairwise Comparisons

```

# Compare intervention conditions within each moral condition
trust_pairs <- pairs(trust_emms, adjust = "tukey")
summary(trust_pairs)

```

group\_factor = Individualizing:

contrast	estimate	SE	df	t.ratio	p.value
Better - Worse	0.495	0.185	597	2.678	0.0208
Better - Control	0.391	0.193	597	2.030	0.1060
Worse - Control	-0.104	0.189	597	-0.550	0.8463

group\_factor = Binding:

contrast	estimate	SE	df	t.ratio	p.value
Better - Worse	0.614	0.191	597	3.213	0.0040
Better - Control	0.209	0.196	597	1.071	0.5326
Worse - Control	-0.405	0.192	597	-2.112	0.0883

P value adjustment: tukey method for comparing a family of 3 estimates

```

threat_pairs <- pairs(threat_emms, adjust = "tukey")
summary(threat_pairs)

```

group\_factor = Individualizing:

contrast	estimate	SE	df	t.ratio	p.value
Better - Worse	-0.607	0.198	597	-3.065	0.0064
Better - Control	-0.231	0.206	597	-1.121	0.5017
Worse - Control	0.376	0.203	597	1.852	0.1537

group\_factor = Binding:

contrast	estimate	SE	df	t.ratio	p.value
Better - Worse	-0.851	0.205	597	-4.156	0.0001

```

Better - Control   -0.449 0.209 597  -2.145  0.0819
Worse - Control    0.402 0.205 597   1.957  0.1240

```

P value adjustment: tukey method for comparing a family of 3 estimates

## Moderating role of empathy

```

# Run full model with perspective taking as a continuous moderator
trust_model_full <- lm(trust_score ~ ideology + intervention_factor * group_factor * perspective_taking,
                        data = data)
summary(trust_model_full)

```

Call:

```
lm(formula = trust_score ~ ideology + intervention_factor * group_factor *
perspective_taking, data = data)
```

Residuals:

Min	1Q	Median	3Q	Max
-4.0744	-0.7989	0.1667	0.9513	3.0863

Coefficients:

	Estimate
(Intercept)	2.72107
ideology	0.33885
intervention_factorWorse	-1.00770
intervention_factorControl	-1.77086
group_factorBinding	-0.01290
perspective_taking	0.19958
intervention_factorWorse:group_factorBinding	0.97693
intervention_factorControl:group_factorBinding	1.45818
intervention_factorWorse:perspective_taking	0.12620
intervention_factorControl:perspective_taking	0.34026
group_factorBinding:perspective_taking	0.03745
intervention_factorWorse:group_factorBinding:perspective_taking	-0.27313
intervention_factorControl:group_factorBinding:perspective_taking	-0.31056
	Std. Error
(Intercept)	0.76970
ideology	0.03753
intervention_factorWorse	1.18822

intervention_factorControl	1.20669
group_factorBinding	1.12512
perspective_taking	0.19108
intervention_factorWorse:group_factorBinding	1.67720
intervention_factorControl:group_factorBinding	1.68986
intervention_factorWorse:perspective_taking	0.29615
intervention_factorControl:perspective_taking	0.29922
group_factorBinding:perspective_taking	0.27965
intervention_factorWorse:group_factorBinding:perspective_taking	0.41470
intervention_factorControl:group_factorBinding:perspective_taking	0.41933
	t value
(Intercept)	3.535
ideology	9.028
intervention_factorWorse	-0.848
intervention_factorControl	-1.468
group_factorBinding	-0.011
perspective_taking	1.045
intervention_factorWorse:group_factorBinding	0.582
intervention_factorControl:group_factorBinding	0.863
intervention_factorWorse:perspective_taking	0.426
intervention_factorControl:perspective_taking	1.137
group_factorBinding:perspective_taking	0.134
intervention_factorWorse:group_factorBinding:perspective_taking	-0.659
intervention_factorControl:group_factorBinding:perspective_taking	-0.741
	Pr(> t )
(Intercept)	0.000439 ***
ideology	< 2e-16 ***
intervention_factorWorse	0.396737
intervention_factorControl	0.142765
group_factorBinding	0.990856
perspective_taking	0.296673
intervention_factorWorse:group_factorBinding	0.560469
intervention_factorControl:group_factorBinding	0.388543
intervention_factorWorse:perspective_taking	0.670156
intervention_factorControl:perspective_taking	0.255930
group_factorBinding:perspective_taking	0.893524
intervention_factorWorse:group_factorBinding:perspective_taking	0.510396
intervention_factorControl:group_factorBinding:perspective_taking	0.459228
---	
Signif. codes:	0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 1.344 on 591 degrees of freedom  
 Multiple R-squared: 0.1602, Adjusted R-squared: 0.1431

F-statistic: 9.395 on 12 and 591 DF, p-value: < 2.2e-16

```
threat_model_full <- lm(threat_score ~ ideology + intervention_factor * group_factor * perspective_taking  
                         data = data)  
summary(threat_model_full)
```

Call:

```
lm(formula = threat_score ~ ideology + intervention_factor *  
    group_factor * perspective_taking, data = data)
```

Residuals:

Min	1Q	Median	3Q	Max
-3.8102	-0.8405	0.1004	1.0142	3.8858

Coefficients:

	Estimate
(Intercept)	5.65738
ideology	-0.41266
intervention_factorWorse	0.23850
intervention_factorControl	-0.67775
group_factorBinding	-1.26407
perspective_taking	-0.17852
intervention_factorWorse:group_factorBinding	0.56382
intervention_factorControl:group_factorBinding	1.35014
intervention_factorWorse:perspective_taking	0.09505
intervention_factorControl:perspective_taking	0.23012
group_factorBinding:perspective_taking	0.21565
intervention_factorWorse:group_factorBinding:perspective_taking	-0.08352
intervention_factorControl:group_factorBinding:perspective_taking	-0.28616
	Std. Error
(Intercept)	0.83175
ideology	0.04056
intervention_factorWorse	1.28400
intervention_factorControl	1.30397
group_factorBinding	1.21582
perspective_taking	0.20648
intervention_factorWorse:group_factorBinding	1.81240
intervention_factorControl:group_factorBinding	1.82609
intervention_factorWorse:perspective_taking	0.32002
intervention_factorControl:perspective_taking	0.32334
group_factorBinding:perspective_taking	0.30219

intervention_factorWorse:group_factorBinding:perspective_taking	0.44813
intervention_factorControl:group_factorBinding:perspective_taking	0.45313
	t value
(Intercept)	6.802
ideology	-10.174
intervention_factorWorse	0.186
intervention_factorControl	-0.520
group_factorBinding	-1.040
perspective_taking	-0.865
intervention_factorWorse:group_factorBinding	0.311
intervention_factorControl:group_factorBinding	0.739
intervention_factorWorse:perspective_taking	0.297
intervention_factorControl:perspective_taking	0.712
group_factorBinding:perspective_taking	0.714
intervention_factorWorse:group_factorBinding:perspective_taking	-0.186
intervention_factorControl:group_factorBinding:perspective_taking	-0.632
	Pr(> t )
(Intercept)	2.54e-11 ***
ideology	< 2e-16 ***
intervention_factorWorse	0.853
intervention_factorControl	0.603
group_factorBinding	0.299
perspective_taking	0.388
intervention_factorWorse:group_factorBinding	0.756
intervention_factorControl:group_factorBinding	0.460
intervention_factorWorse:perspective_taking	0.767
intervention_factorControl:perspective_taking	0.477
group_factorBinding:perspective_taking	0.476
intervention_factorWorse:group_factorBinding:perspective_taking	0.852
intervention_factorControl:group_factorBinding:perspective_taking	0.528
---	
Signif. codes:	0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 1.453 on 591 degrees of freedom  
 Multiple R-squared: 0.1914, Adjusted R-squared: 0.175  
 F-statistic: 11.66 on 12 and 591 DF, p-value: < 2.2e-16

```
# Calculate EMMs at specific levels of perspective taking
pt_mean <- mean(data$perspective_taking, na.rm = TRUE)
pt_sd <- sd(data$perspective_taking, na.rm = TRUE)

trust_emms_pt <- emmeans(trust_model_full,
```

```

    specs = ~ intervention_factor | group_factor,
    at = list(perspective_taking = c(pt_mean - pt_sd, pt_mean, pt_mean +
covariates = list(ideology = mean(data$ideology, na.rm = TRUE)))

```

NOTE: Results may be misleading due to involvement in interactions

## Graph

```

library(ggplot2)
library(dplyr)
library(gridExtra)

```

Attaching package: 'gridExtra'

The following object is masked from 'package:dplyr':

combine

```

# First, prepare your data with EMMs
trust_emms_df <- as.data.frame(trust_emms)
threat_emms_df <- as.data.frame(threat_emms)

# Violin plot for Trust
trust_plot <- ggplot() +
  # Add violin plot of raw data
  geom_violin(data = data, aes(x = intervention_factor, y = trust_score,
                                fill = group_factor),
               alpha = 0.5, position = position_dodge(0.8), width = 0.7) +
  # Add EMM points and error bars
  geom_point(data = trust_emms_df, aes(x = intervention_factor, y = emmean,
                                         group = group_factor, shape = group_factor),
             position = position_dodge(0.8), size = 3) +
  geom_errorbar(data = trust_emms_df,
                aes(x = intervention_factor, y = emmean,
                    group = group_factor,
                    ymin = lower.CL, ymax = upper.CL),
                position = position_dodge(0.8), width = 0.2, linewidth = 1) +

```

```

# Custom aesthetics
scale_fill_manual(values = c("skyblue", "coral")) +
# Set fixed y-axis range from 1 to 7
scale_y_continuous(limits = c(1, 7), breaks = 1:7) +
labs(title = "Trust Toward Outgroup",
x = "Feedback Condition",
y = "Trust Score",
fill = "Moral Foundation",
shape = "Moral Foundation") +
scale_x_discrete(labels = c("Better\nthan expected", "Worse\nthan expected", "Control")) +
theme_minimal(base_size = 12) +
theme(
  plot.title = element_text(hjust = 0.5, face = "bold"),
  axis.title = element_text(face = "bold"),
  legend.position = "bottom",
  legend.title = element_text(face = "bold"),
  panel.grid.major = element_line(color = "gray90"),
  panel.grid.minor = element_line(color = "gray95")
)
}

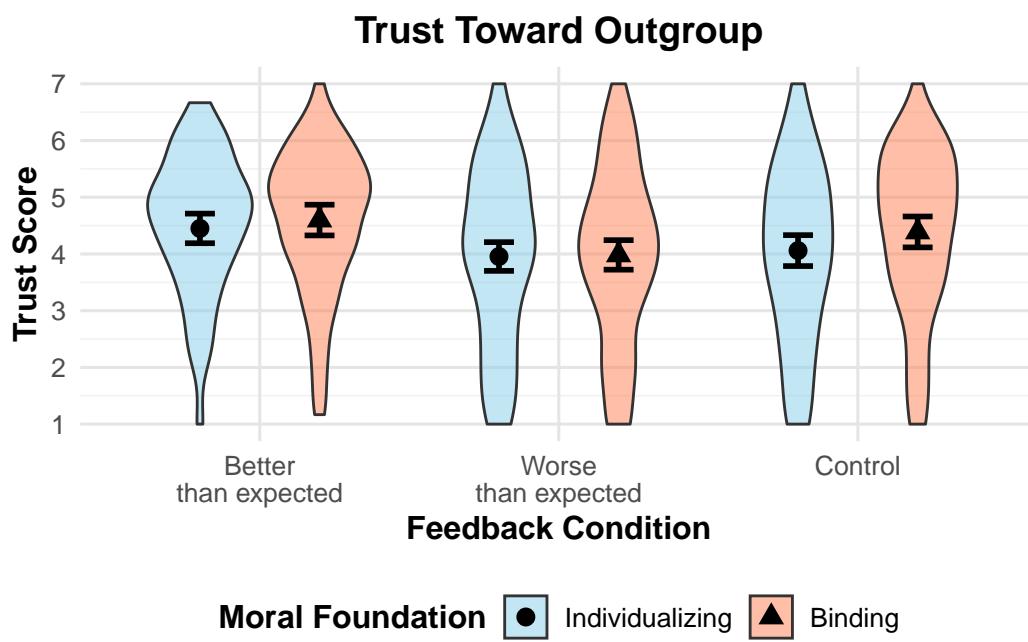
# Violin plot for Threat
threat_plot <- ggplot() +
# Add violin plot of raw data
geom_violin(data = data, aes(x = intervention_factor, y = threat_score,
                               fill = group_factor),
             alpha = 0.5, position = position_dodge(0.8), width = 0.7) +
# Add EMM points and error bars
geom_point(data = threat_emms_df, aes(x = intervention_factor, y = emmean,
                                         group = group_factor, shape = group_factor),
            position = position_dodge(0.8), size = 3) +
geom_errorbar(data = threat_emms_df,
              aes(x = intervention_factor, y = emmean,
                  group = group_factor,
                  ymin = lower.CL, ymax = upper.CL),
              position = position_dodge(0.8), width = 0.2, linewidth = 1) +
# Custom aesthetics
scale_fill_manual(values = c("skyblue", "coral")) +
# Set fixed y-axis range from 1 to 7
scale_y_continuous(limits = c(1, 7), breaks = 1:7) +
labs(title = "Perceived Threat from Outgroup",
x = "Feedback Condition",
y = "Threat Score",

```

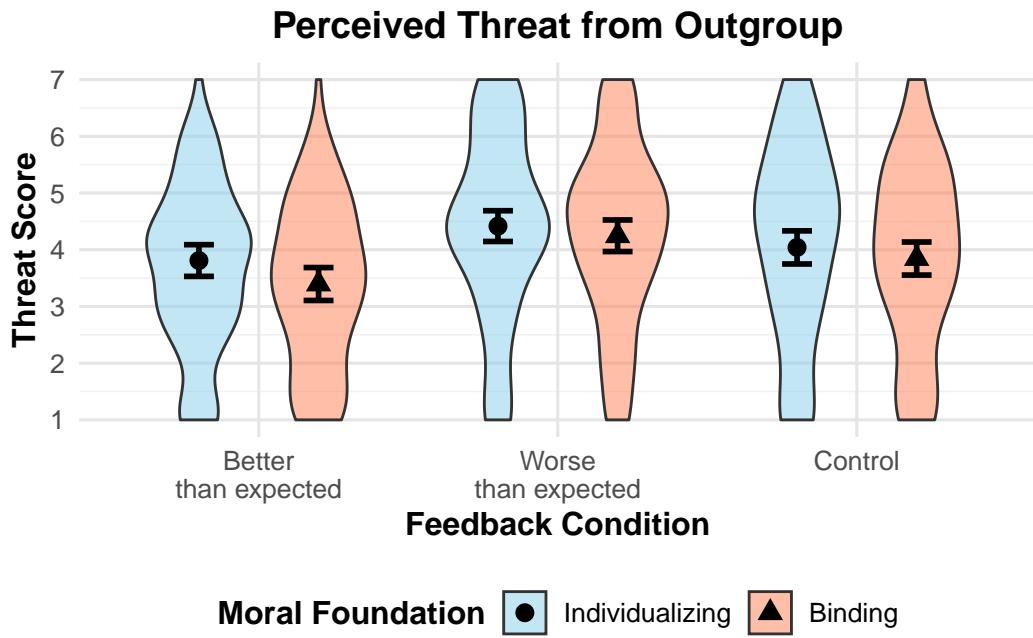
```

fill = "Moral Foundation",
shape = "Moral Foundation") +
scale_x_discrete(labels = c("Better\nthan expected", "Worse\nthan expected", "Control")) +
theme_minimal(base_size = 12) +
theme(
  plot.title = element_text(hjust = 0.5, face = "bold"),
  axis.title = element_text(face = "bold"),
  legend.position = "bottom",
  legend.title = element_text(face = "bold"),
  panel.grid.major = element_line(color = "gray90"),
  panel.grid.minor = element_line(color = "gray95")
)
# Display both plots
trust_plot

```

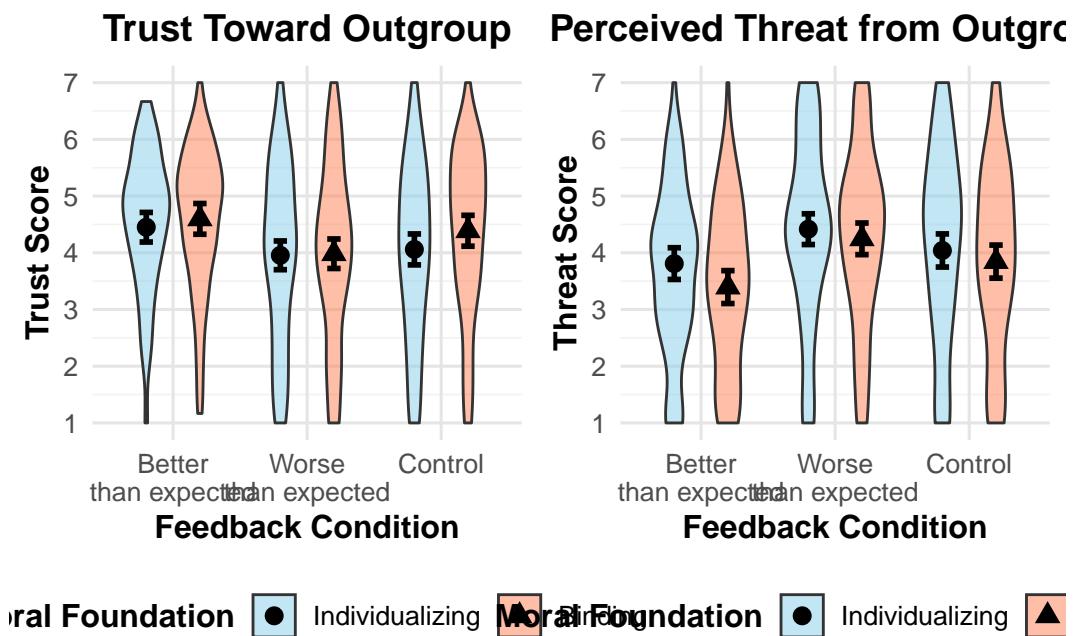


```
threat_plot
```



```
# To save the plots to files:
ggsave("/Users/daryani/Desktop/trust_violin_plot.jpg", trust_plot, width = 10, height = 7, dpi = 300)
ggsave("/Users/daryani/Desktop/threat_violin_plot.jpg", threat_plot, width = 10, height = 7, dpi = 300)

# To display both plots side by side in a single figure:
combined_plot <- grid.arrange(trust_plot, threat_plot, ncol = 2)
```



```
ggsave("/Users/daryani/Desktop/combined_violin_plots.jpg", combined_plot, width = 14, height
```