

# Pilot data analysis for “Essentially blocked - Can structural factors block an essentialist interpretation of a formal explanation?”

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## Introduction

This project’s repository and preregistration can be found online.

## Methods

### Planned Sample

Planned sample size is 5-year-olds and 6-year-olds recruited from a university preschool and museums

### Materials

### Procedure

2x2 design \* Context - nonstructural context, or structural context \* Explanation - control explanation, or formal explanation

Essentialism DVs \* Pilot 1 (n=14) - 5 canonical essentialism DVs (like in Muradoglu et al, other studies): stability\_past, stability\_future, innateness\_stop, inductive\_potential, innateness\_switch. But there's a worry that these items are not specific to essentialism, and a structural conception of gender may at times yield what appears to be an essentialist answer to these DVs. \* Pilot 2.1 (n=4, all structural) - testing new set of 4 DVs: fc\_expl\_group, inductivePoten, normative\_indiv, innateness\_switch \* Pilot 2.2 (n=9) - changes in group vs individual level, fc\_expl in order to make it flow better as the first item from the previous narration, normative because we're interested in group level normativity: fc\_expl\_indiv, inductivePoten, normative\_group, innateness\_switch \* Pilot 2.3 (n=7) - minor changes, fc\_expl\_indiv now mentions "size of the buckets", inductivePoten is now 4 point response instead of 2 point response: fc\_expl\_indiv\_size, inductivePoten, normative\_group, innateness\_switch

3/31 email: Nadya thinks normativity shouldn't be part of the essentialism battery, she suggests we analyze separately as exploratory. I kind of agree with her actually - discuss w Ellen

## Analysis Plan

### Exclusion criteria

Experimenter error, out of age range.

### Analysis of interest

ANOVA on essentialism measure with an interaction term for context and explanation.

We predict an interaction between context and explanation, such that in the nonstructural condition, hearing a formal explanation relative to a control explanation increases essentialism, but in the structural condition, hearing a formal explanation relative to a control explanation does not increase or increases essentialism to a lesser extent than in the nonstructural condition. In other words, the formal explanation may be interpreted structurally, and an essentialist reading blocked in the structural condition.

->

## Results

### Data preparation

Data preparation as specified in the analysis plan.

```
require("knitr")

## Loading required package: knitr

## Warning: package 'knitr' was built under R version 3.5.3

#### Load relevant libraries and functions
library(tidyverse)

## -- Attaching packages ----- tidyverse 1.2.1 --

## v ggplot2 3.1.0      v purrr   0.3.2
## v tibble  2.0.1      v dplyr   0.8.0.1
## v tidyr   0.8.2      v stringr 1.4.0
## v readr   1.3.1      v forcats 0.4.0
```

```
## Warning: package 'purrr' was built under R version 3.5.3

## -- Conflicts ----- tidyverse_conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag() masks stats::lag()
```

```
library(broom)
library(paramtest) # power analysis
```

```
## Warning: package 'paramtest' was built under R version 3.5.3
```

```
#### Import data for analysis
df.data <- read_csv("../data/FYP_data_pilot_children_2.csv")
```

```
## Parsed with column specification:
## cols(
##   .default = col_character(),
##   subject = col_double(),
##   stim = col_double(),
##   age = col_double(),
##   fc_expl_indiv_size_expl = col_logical()
## )
```

```
## See spec(...) for full column specifications.
```

```
#### Data exclusion / filtering
# Record exclusions: experimenter error, age
df.excl <- tibble(
  exp_error = sum(df.data$exp_error == "yes"),
  age = sum(df.data$age < 5 | df.data$age >= 7)
)

# Exclude subjects: experimenter error, age
df.data <- df.data %>%
  filter(exp_error == "no" &
    (age >= 5 & age < 7)) %>%
  select(-exp_error, -starts_with("check")) # Delete exp_error, check columns
```

```
#### Memory check analysis
```

```
#### Demographics analysis
# Add age categorical variable
df.data <- df.data %>%
  mutate(age_cat = case_when(
    age < 5 ~ "4",
    age >= 5 & age < 6 ~ "5",
    age >= 6 & age < 7 ~ "6",
    age >= 7 ~ "7"))

# Age
df.dem_age <- df.data %>%
```

```

count(age_cat)

# Gender
df.dem_gender <- df.data %>%
  count(gender)

#### Prepare data for analysis

# Recode essentialism dependent measures
df.data$fc_expl_group <- df.data$fc_expl_group %>%
  recode("Because of the buckets in their classrooms" = 0,
        "Because girls like playing Yellow-Ball" = 1,
        "Because girls like playing Green-Ball" = 1)
df.data$fc_expl_indiv <- df.data$fc_expl_indiv %>%
  recode("Because of the buckets in her classroom" = 0,
        "Because Suzy likes playing Yellow-Ball" = 1,
        "Because Suzy likes playing Green-Ball" = 1)
df.data$fc_expl_indiv_size <- df.data$fc_expl_indiv_size %>%
  recode("Because of the size of the buckets in her classroom" = 0,
        "Because Suzy likes playing Yellow-Ball" = 1,
        "Because Suzy likes playing Green-Ball" = 1)

df.data$normative_group <- df.data$normative_group %>%
  recode("Okay" = 0,
        "Not okay" = 1)
df.data$normative_indiv <- df.data$normative_indiv %>%
  recode("Okay" = 0,
        "Not okay" = 1)

df.data$inductivePoten <-
  if_else(df.data$cb == "girlsYellow",
    (recode(df.data$inductivePoten,
      "Green-Ball" = 1/6,
      "Yellow-Ball" = 5/6, # conservatively estimate as midway between maybe and for sure
      "For sure Green-Ball" = 0,
      "Maybe Green-Ball" = 1/3,
      "Maybe Yellow-Ball" = 2/3,
      "For sure Yellow-Ball" = 1)),
    (recode(df.data$inductivePoten,
      "Yellow-Ball" = 1/6,
      "Green-Ball" = 5/6,
      "For sure Yellow-Ball" = 0,
      "Maybe Yellow-Ball" = 1/3,
      "Maybe Green-Ball" = 2/3,
      "For sure Green-Ball" = 1)))

df.data$innateness_switch <-
  if_else(df.data$cb == "girlsYellow",
    (recode(df.data$innateness_switch,
      "For sure Green-Ball" = 0,
      "Maybe Green-Ball" = 1/3,
      "Maybe Yellow-Ball" = 2/3,
      "For sure Yellow-Ball" = 1)),

```

```

      (recode(df.data$innateness_switch,
              "For sure Green-Ball" = 1,
              "Maybe Green-Ball" = 2/3,
              "Maybe Yellow-Ball" = 1/3,
              "For sure Yellow-Ball" = 0)))

# Gather to tidy long form
df.tidy <- df.data %>%
  select(-starts_with("check"), -ends_with("expl")) %>%
  gather(question, response, "fc_expl_indiv":"innateness_switch")

# Order questions
df.tidy$question <- df.tidy$question %>%
  factor(levels=c('fc_expl_indiv_size', 'fc_expl_indiv', 'fc_expl_group', 'normative_indiv', 'normative_group'))

# Split dataset by DV set
df.tidy.1 <- df.tidy %>%
  filter(dvs == "fc_expl_group, inductivePoten, normative_indiv, innateness_switch")
df.tidy.2 <- df.tidy %>%
  filter(dvs == "fc_expl_indiv, inductivePoten, normative_group, innateness_switch")
df.tidy.3 <- df.tidy %>%
  filter(dvs == "fc_expl_indiv_size, inductivePoten, normative_group, innateness_switch")
df.tidy.2.3 <- df.tidy %>%
  filter(dvs == "fc_expl_indiv, inductivePoten, normative_group, innateness_switch" | dvs == "fc_expl_indiv_size, inductivePoten, normative_group, innateness_switch")

# Calculate overall essentialism measure per subject
df.means_subj <- df.tidy %>%
  group_by(subject, age, context, explanation, dvs) %>%
  summarize(essentialism = mean(response, na.rm = TRUE))
df.means_subj.1 <- df.tidy.1 %>%
  group_by(subject, age, context, explanation, dvs) %>%
  summarize(essentialism = mean(response, na.rm = TRUE))
df.means_subj.2 <- df.tidy.2 %>%
  group_by(subject, age, context, explanation, dvs) %>%
  summarize(essentialism = mean(response, na.rm = TRUE))
df.means_subj.3 <- df.tidy.3 %>%
  group_by(subject, age, context, explanation, dvs) %>%
  summarize(essentialism = mean(response, na.rm = TRUE))
df.means_subj.2.3 <- df.tidy.2.3 %>%
  group_by(subject, age, context, explanation, dvs) %>%
  summarize(essentialism = mean(response, na.rm = TRUE))

df.means_subj.2.3.noNormative <- df.tidy.2.3 %>%
  filter(!str_detect(question, "normative")) %>%
  group_by(subject, age, context, explanation, dvs) %>%
  summarize(essentialism = mean(response, na.rm = TRUE))

```

## Exploring the pilot 2 data

```
# Overall essentialism measure across subjects by condition
df.means <- df.tidy %>%
  group_by(context, explanation) %>%
  summarize(essentialism = mean(response, na.rm = TRUE),
            sd = sd(response, na.rm = TRUE),
            n = length(unique(subject)))
df.means
```

```
## # A tibble: 4 x 5
## # Groups:   context [2]
##   context      explanation essentialism    sd      n
##   <chr>         <chr>          <dbl> <dbl> <int>
## 1 nonstructural control          0.354 0.389     4
## 2 nonstructural formal           0.5   0.467     4
## 3 structural   control          0.354 0.412     6
## 4 structural   formal           0.361 0.398     6
```

```
df.means.1 <- df.tidy.1 %>%
  group_by(context, explanation) %>%
  summarize(essentialism = mean(response, na.rm = TRUE),
            sd = sd(response, na.rm = TRUE),
            n = length(unique(subject)))
df.means.1
```

```
## # A tibble: 2 x 5
## # Groups:   context [1]
##   context      explanation essentialism    sd      n
##   <chr>         <chr>          <dbl> <dbl> <int>
## 1 structural control          0.417 0.454     2
## 2 structural formal           0.375 0.478     2
```

```
df.means.2 <- df.tidy.2 %>%
  group_by(context, explanation) %>%
  summarize(essentialism = mean(response, na.rm = TRUE),
            sd = sd(response, na.rm = TRUE),
            n = length(unique(subject)))
df.means.2
```

```
## # A tibble: 4 x 5
## # Groups:   context [2]
##   context      explanation essentialism    sd      n
##   <chr>         <chr>          <dbl> <dbl> <int>
## 1 nonstructural control          0.5   0.427     2
## 2 nonstructural formal           0.333 0.427     2
## 3 structural   control          0.292 0.384     3
## 4 structural   formal           0.333 0.388     2
```

```
df.means.3 <- df.tidy.3 %>%
  group_by(context, explanation) %>%
```

```

summarize(essentialism = mean(response, na.rm = TRUE),
          sd = sd(response, na.rm = TRUE),
          n = length(unique(subject)))
df.means.3

```

```

## # A tibble: 4 x 5
## # Groups:   context [2]
##   context      explanation essentialism    sd      n
##   <chr>         <chr>          <dbl> <dbl> <int>
## 1 nonstructural control          0.208 0.305     2
## 2 nonstructural formal          0.667 0.471     2
## 3 structural   control          0.417 0.5      1
## 4 structural   formal          0.375 0.375     2

```

```

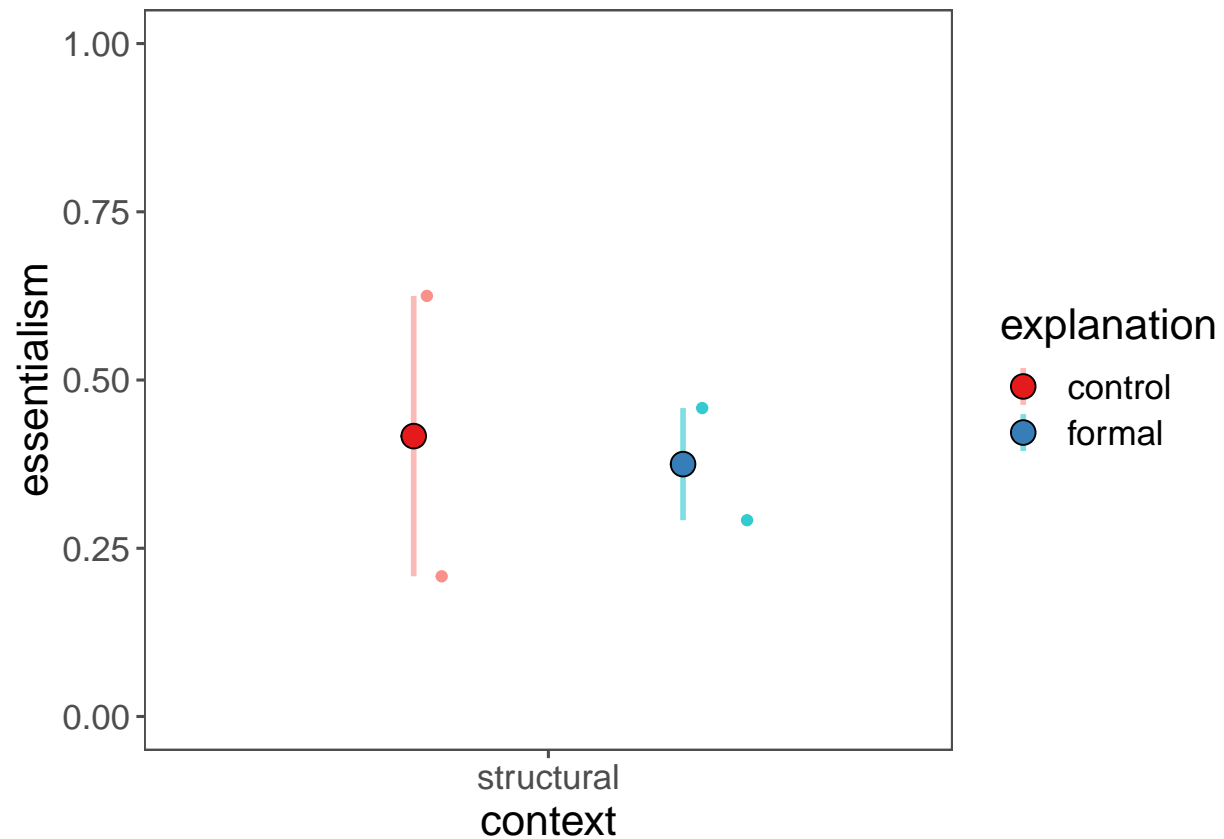
# Set visualization theme
theme_set(
  ggthemes::theme_few() +
  theme(text = element_text(size = 16)) # large text size for presentation figures
)

```

```

# Pilot 2.1: essentialism by context and explanation
ggplot(df.means_subj.1, aes(x = context, y = essentialism, fill = explanation, color = explanation)) +
  geom_point(position = position_jitterdodge(jitter.width = 0.2, dodge.width = 0.8),
            alpha = 0.8) +
  stat_summary(fun.data = "mean_cl_boot",
              position = position_dodge(width = 0.8),
              geom = "linerange",
              size = 1,
              alpha = 0.5) +
  stat_summary(fun.y = "mean",
              position = position_dodge(width = 0.8),
              geom = "point",
              shape = 21,
              color = "black",
              size = 4) +
  scale_fill_brewer(palette = "Set1") +
  scale_y_continuous(limits = c(0, 1))

```

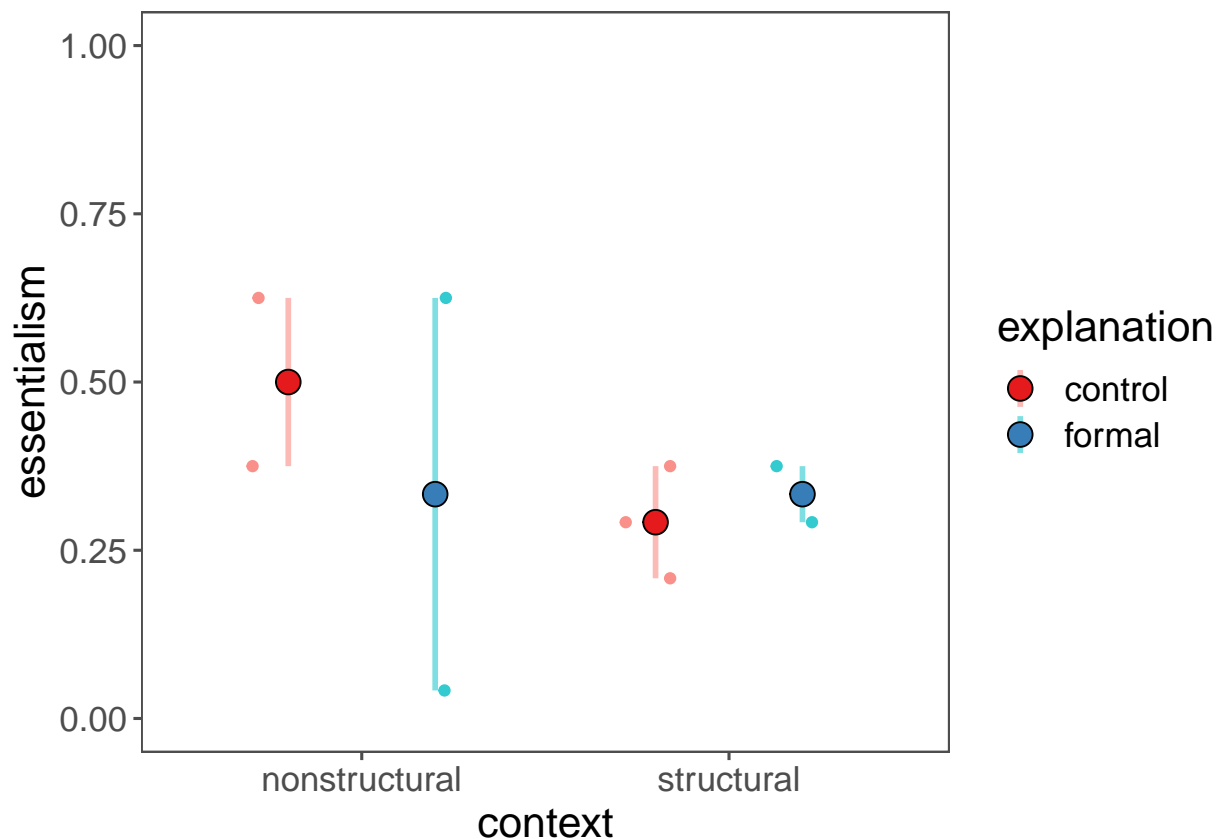


```
ggsave("FYP_pilot_children_2.1_contextExpl.png", width = 5)
```

```
## Saving 5 x 4.5 in image
```

```
# Pilot 2.2: essentialism by context and explanation
ggplot(df.means_subj.2, aes(x = context, y = essentialism, fill = explanation, color = explanation)) +
  geom_point(position = position_jitterdodge(jitter.width = 0.2, dodge.width = 0.8),
    alpha = 0.8) +
  stat_summary(fun.data = "mean_cl_boot",
    position = position_dodge(width = 0.8),
    geom = "linerange",
    size = 1,
    alpha = 0.5) +
  stat_summary(fun.y = "mean",
    position = position_dodge(width = 0.8),
    geom = "point",
    shape = 21,
    color = "black",
    size = 4) +
  scale_fill_brewer(palette = "Set1") +
  scale_y_continuous(limits = c(0, 1))
```



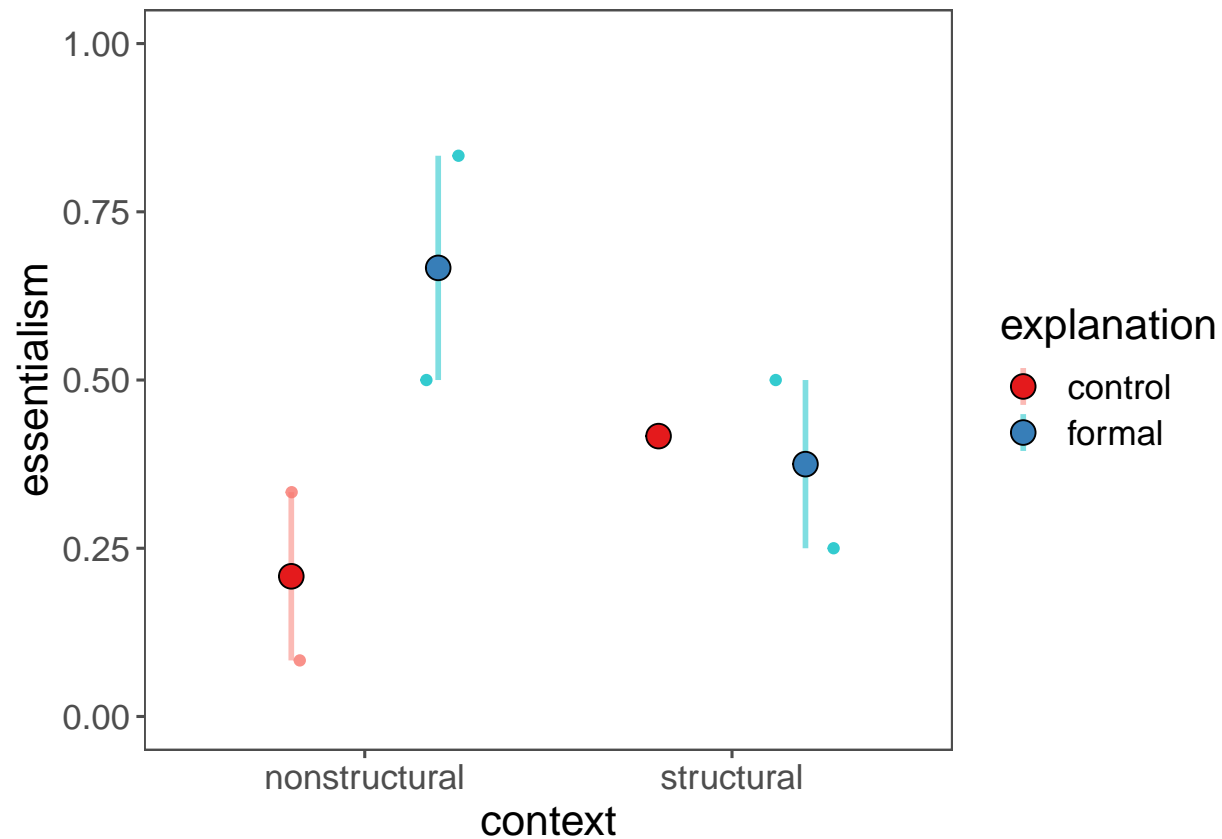


```
ggsave("FYP_pilot_children_2.2_contextExpl.png", width = 5)
```

```
## Saving 5 x 4.5 in image
```

```
# Pilot 2.3: essentialism by context and explanation
ggplot(df.means_subj.3, aes(x = context, y = essentialism, fill = explanation, color = explanation)) +
  geom_point(position = position_jitterdodge(jitter.width = 0.2, dodge.width = 0.8),
    alpha = 0.8) +
  stat_summary(fun.data = "mean_cl_boot",
    position = position_dodge(width = 0.8),
    geom = "linerange",
    size = 1,
    alpha = 0.5) +
  stat_summary(fun.y = "mean",
    position = position_dodge(width = 0.8),
    geom = "point",
    shape = 21,
    color = "black",
    size = 4) +
  scale_fill_brewer(palette = "Set1") +
  scale_y_continuous(limits = c(0, 1))
```

```
## Warning: Removed 1 rows containing missing values (geom_linerange).
```



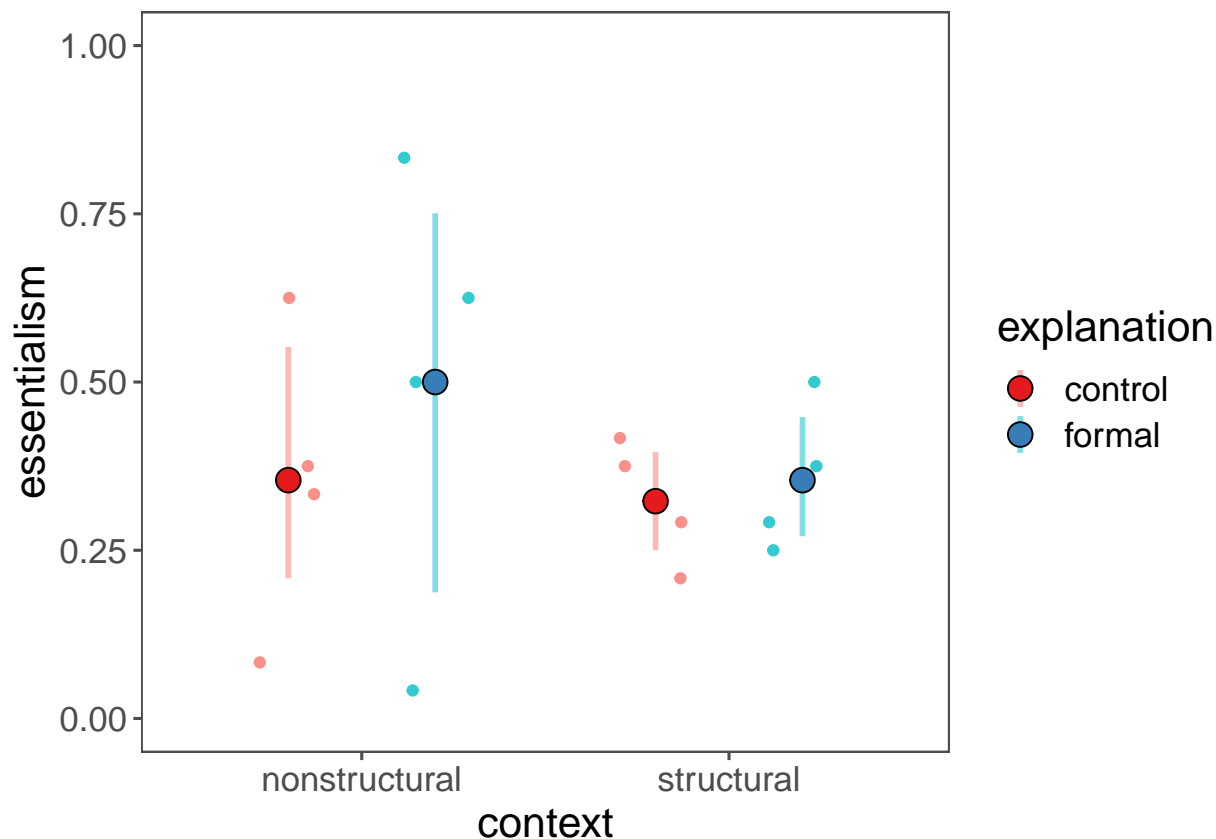
```
ggsave("FYP_pilot_children_2.3_contextExpl.png", width = 5)
```

```
## Saving 5 x 4.5 in image
```

```
## Warning: Removed 1 rows containing missing values (geom_linerange).
```

```
# Pilot 2.2 + 2.3: essentialism by context and explanation
```

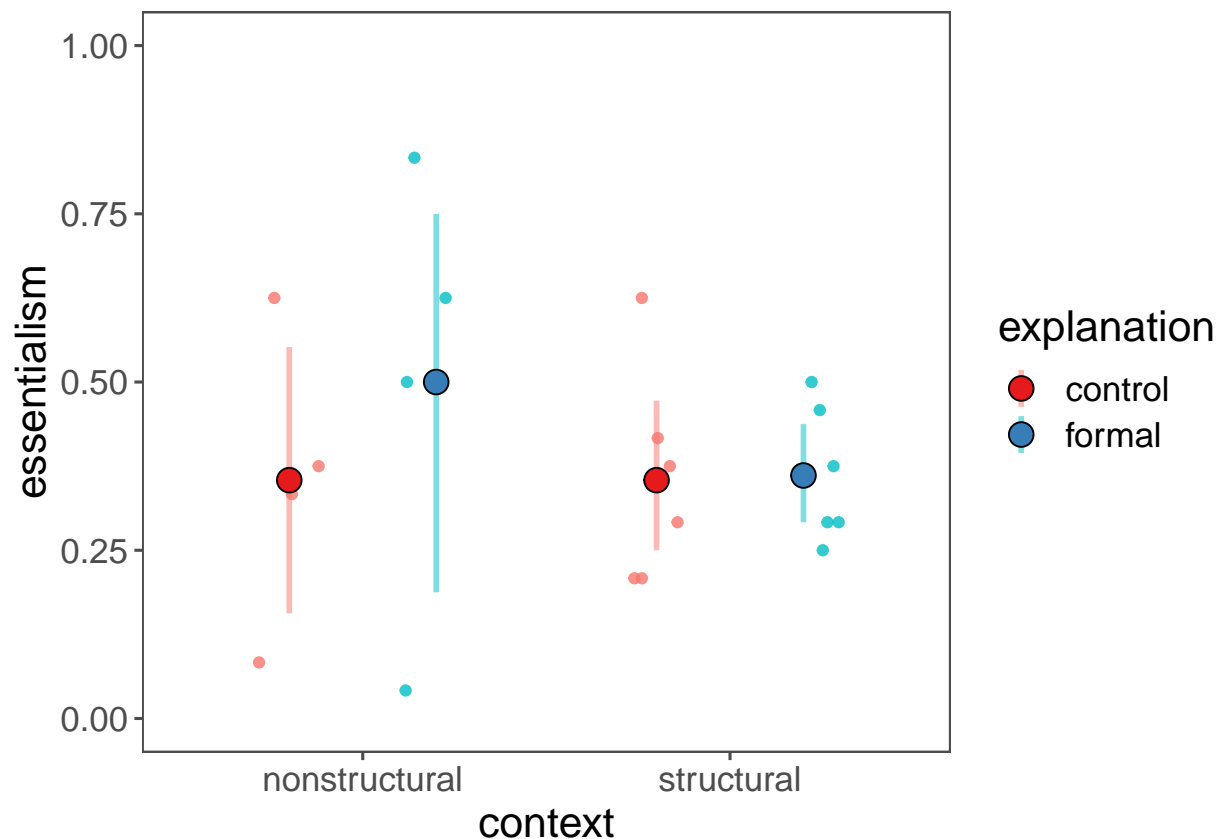
```
ggplot(df.means_subj.2.3, aes(x = context, y = essentialism, fill = explanation, color = explanation)) +
  geom_point(position = position_jitterdodge(jitter.width = 0.2, dodge.width = 0.8),
    alpha = 0.8) +
  stat_summary(fun.data = "mean_cl_boot",
    position = position_dodge(width = 0.8),
    geom = "linerange",
    size = 1,
    alpha = 0.5) +
  stat_summary(fun.y = "mean",
    position = position_dodge(width = 0.8),
    geom = "point",
    shape = 21,
    color = "black",
    size = 4) +
  scale_fill_brewer(palette = "Set1") +
  scale_y_continuous(limits = c(0, 1))
```



```
ggsave("FYP_pilot_children_2.2_2.3_contextExpl.png", width = 5)
```

```
## Saving 5 x 4.5 in image
```

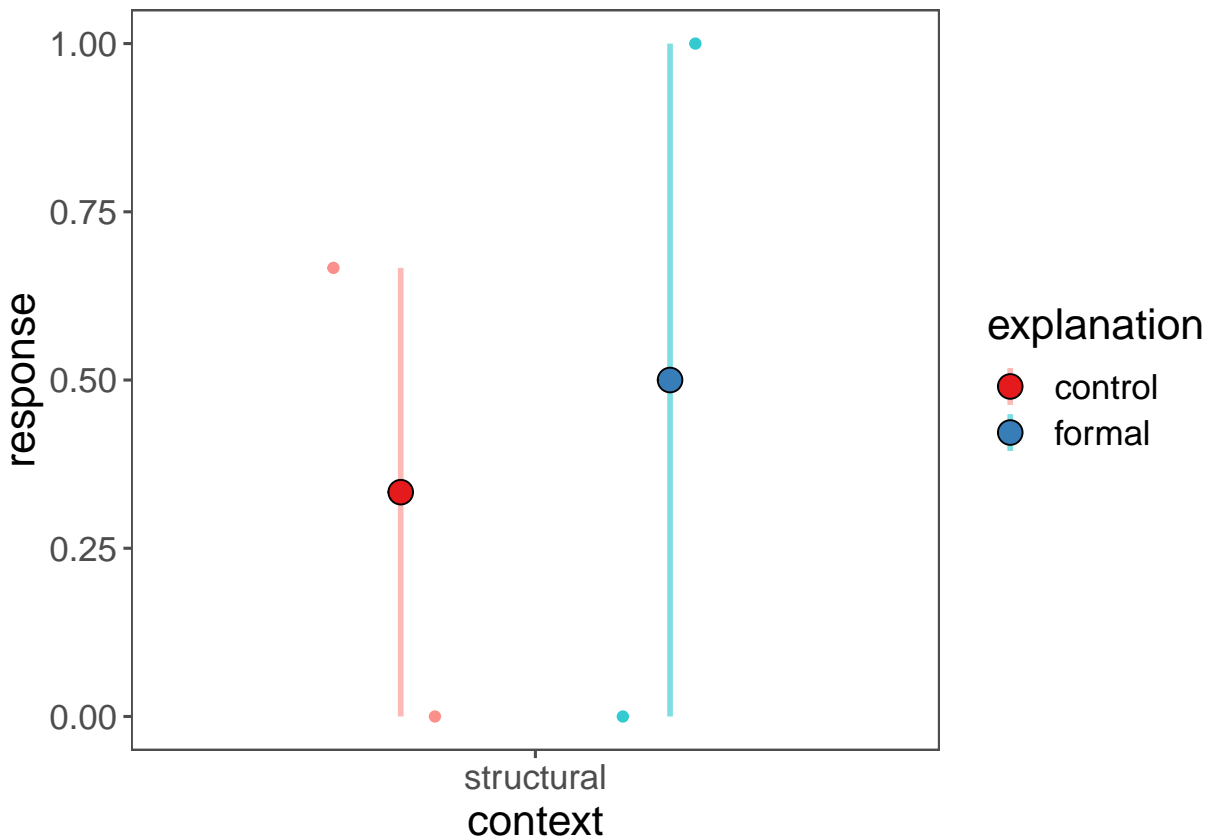
```
# Pilot 2.1 + 2.2 + 2.3: essentialism by context and explanation
ggplot(df.means_subj, aes(x = context, y = essentialism, fill = explanation, color = explanation)) +
  geom_point(position = position_jitterdodge(jitter.width = 0.2, dodge.width = 0.8),
    alpha = 0.8) +
  stat_summary(fun.data = "mean_cl_boot",
    position = position_dodge(width = 0.8),
    geom = "linerange",
    size = 1,
    alpha = 0.5) +
  stat_summary(fun.y = "mean",
    position = position_dodge(width = 0.8),
    geom = "point",
    shape = 21,
    color = "black",
    size = 4) +
  scale_fill_brewer(palette = "Set1") +
  scale_y_continuous(limits = c(0, 1))
```



```
ggsave("FYP_pilot_children_2.1_2.2_2.3_contextExpl.png", width = 5)
```

```
## Saving 5 x 4.5 in image
```

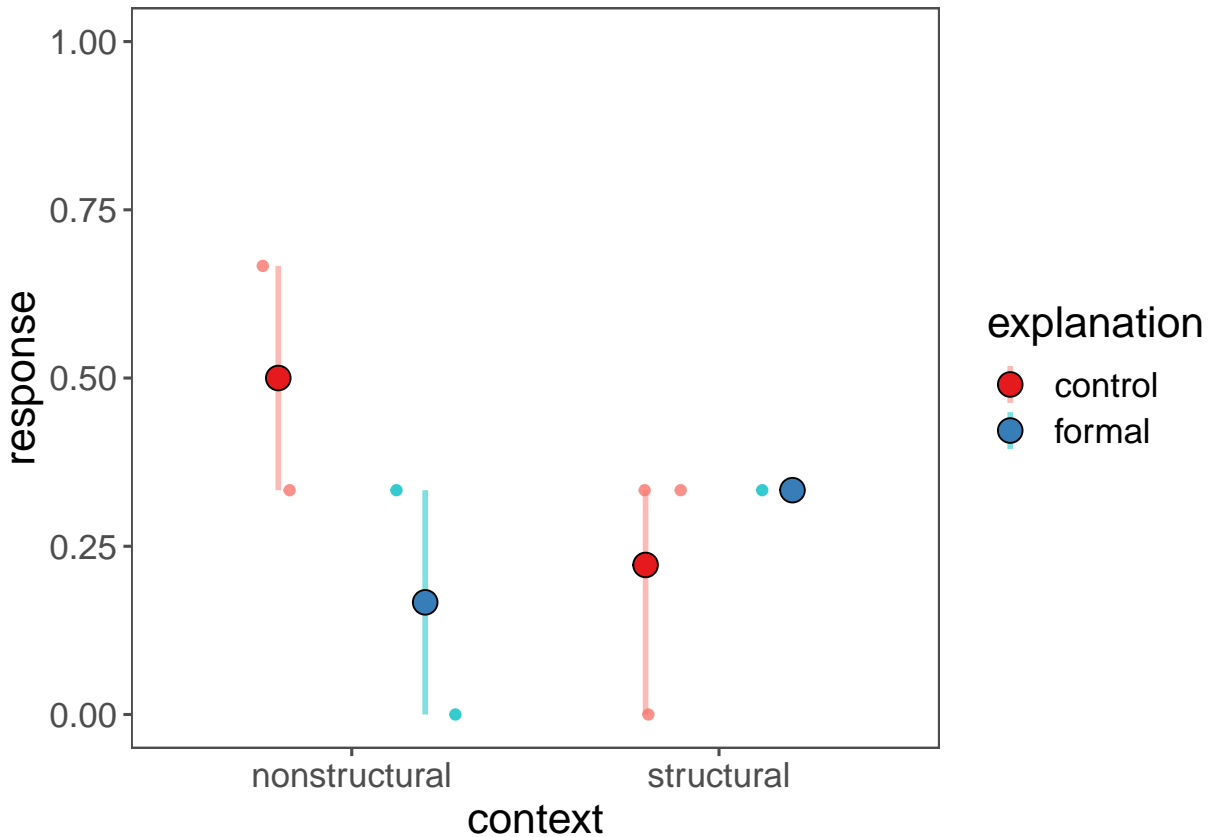
```
# Pilot 2.1 (innateness switch only): essentialism by context and explanation
ggplot(df.tidy.1 %>% filter(question == "innateness_switch"), aes(x = context, y = response, fill = exp
  geom_point(position = position_jitterdodge(jitter.width = 0.2, dodge.width = 0.8),
    alpha = 0.8) +
  stat_summary(fun.data = "mean_cl_boot",
    position = position_dodge(width = 0.8),
    geom = "linerange",
    size = 1,
    alpha = 0.5) +
  stat_summary(fun.y = "mean",
    position = position_dodge(width = 0.8),
    geom = "point",
    shape = 21,
    color = "black",
    size = 4) +
  scale_fill_brewer(palette = "Set1") +
  scale_y_continuous(limits = c(0, 1))
```



```
ggsave("FYP_pilot_children_2.1_contextExpl_innatenessSwitch.png", width = 5)
```

```
## Saving 5 x 4.5 in image
```

```
# Pilot 2.2 (innateness switch only): essentialism by context and explanation
ggplot(df.tidy.2 %>% filter(question == "innateness_switch"), aes(x = context, y = response, fill = exp
  geom_point(position = position_jitterdodge(jitter.width = 0.2, dodge.width = 0.8),
    alpha = 0.8) +
  stat_summary(fun.data = "mean_cl_boot",
    position = position_dodge(width = 0.8),
    geom = "linerange",
    size = 1,
    alpha = 0.5) +
  stat_summary(fun.y = "mean",
    position = position_dodge(width = 0.8),
    geom = "point",
    shape = 21,
    color = "black",
    size = 4) +
  scale_fill_brewer(palette = "Set1") +
  scale_y_continuous(limits = c(0, 1))
```

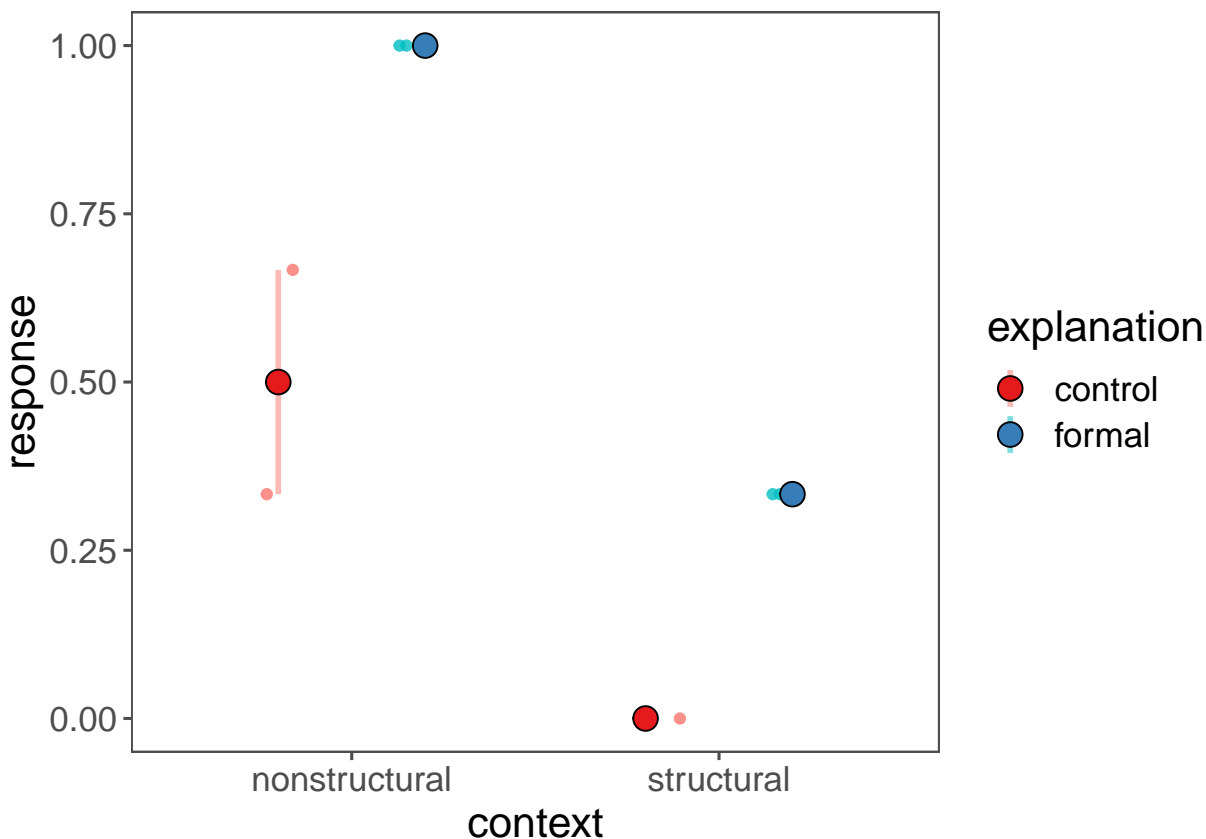


```
ggsave("FYP_pilot_children_2.2_contextExpl_innatenessSwitch.png", width = 5)
```

```
## Saving 5 x 4.5 in image
```

```
# Pilot 2.3 (innateness switch only): essentialism by context and explanation
ggplot(df.tidy.3 %>% filter(question == "innateness_switch"), aes(x = context, y = response, fill = exp
  geom_point(position = position_jitterdodge(jitter.width = 0.2, dodge.width = 0.8),
    alpha = 0.8) +
  stat_summary(fun.data = "mean_cl_boot",
    position = position_dodge(width = 0.8),
    geom = "linerange",
    size = 1,
    alpha = 0.5) +
  stat_summary(fun.y = "mean",
    position = position_dodge(width = 0.8),
    geom = "point",
    shape = 21,
    color = "black",
    size = 4) +
  scale_fill_brewer(palette = "Set1") +
  scale_y_continuous(limits = c(0, 1))
```

```
## Warning: Removed 1 rows containing missing values (geom_linerange).
```

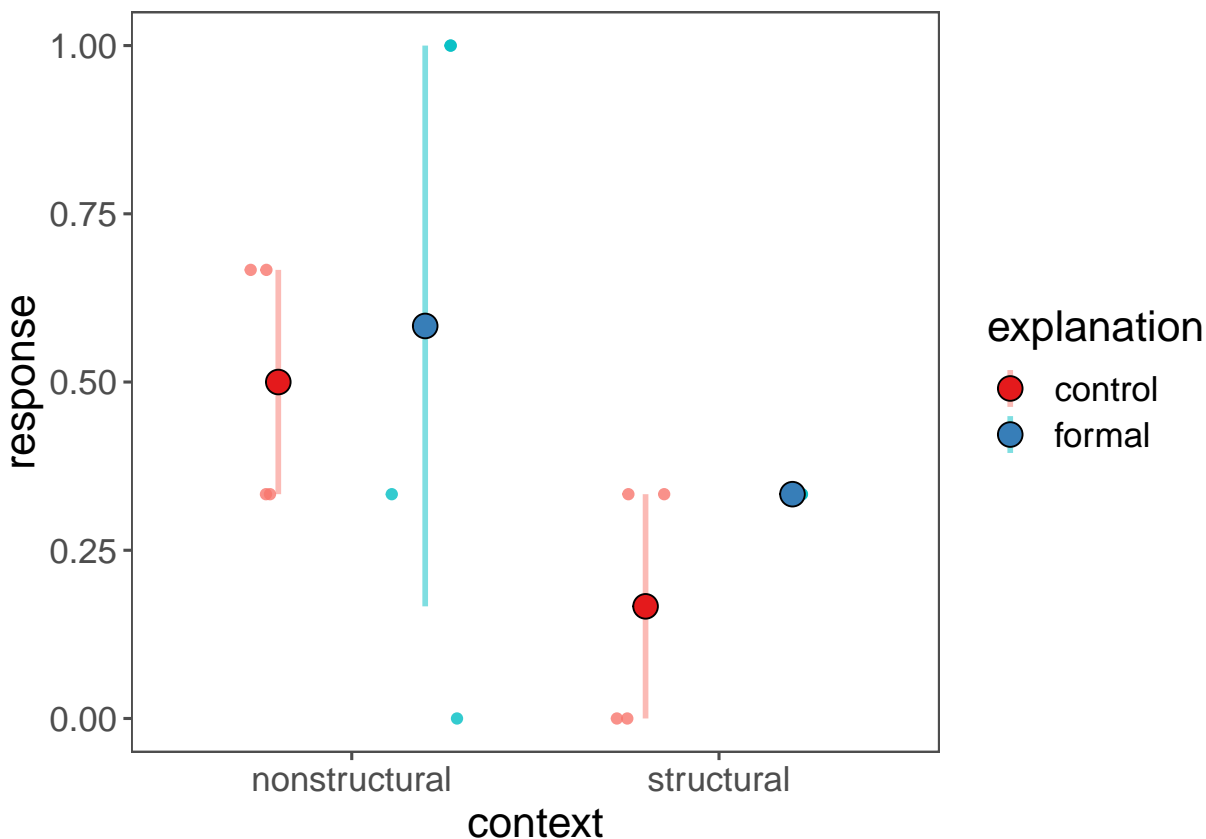


```
ggsave("FYP_pilot_children_2.3_contextExpl_innatenessSwitch.png", width = 5)
```

```
## Saving 5 x 4.5 in image
```

```
## Warning: Removed 1 rows containing missing values (geom_linerange).
```

```
# Pilot 2.2 + 2.3 (innateness switch only): essentialism by context and explanation
ggplot(df.tidy.2.3 %>% filter(question == "innateness_switch"), aes(x = context, y = response, fill = explanation)) +
  geom_point(position = position_jitterdodge(jitter.width = 0.2, dodge.width = 0.8),
    alpha = 0.8) +
  stat_summary(fun.data = "mean_cl_boot",
    position = position_dodge(width = 0.8),
    geom = "linerange",
    size = 1,
    alpha = 0.5) +
  stat_summary(fun.y = "mean",
    position = position_dodge(width = 0.8),
    geom = "point",
    shape = 21,
    color = "black",
    size = 4) +
  scale_fill_brewer(palette = "Set1") +
  scale_y_continuous(limits = c(0, 1))
```

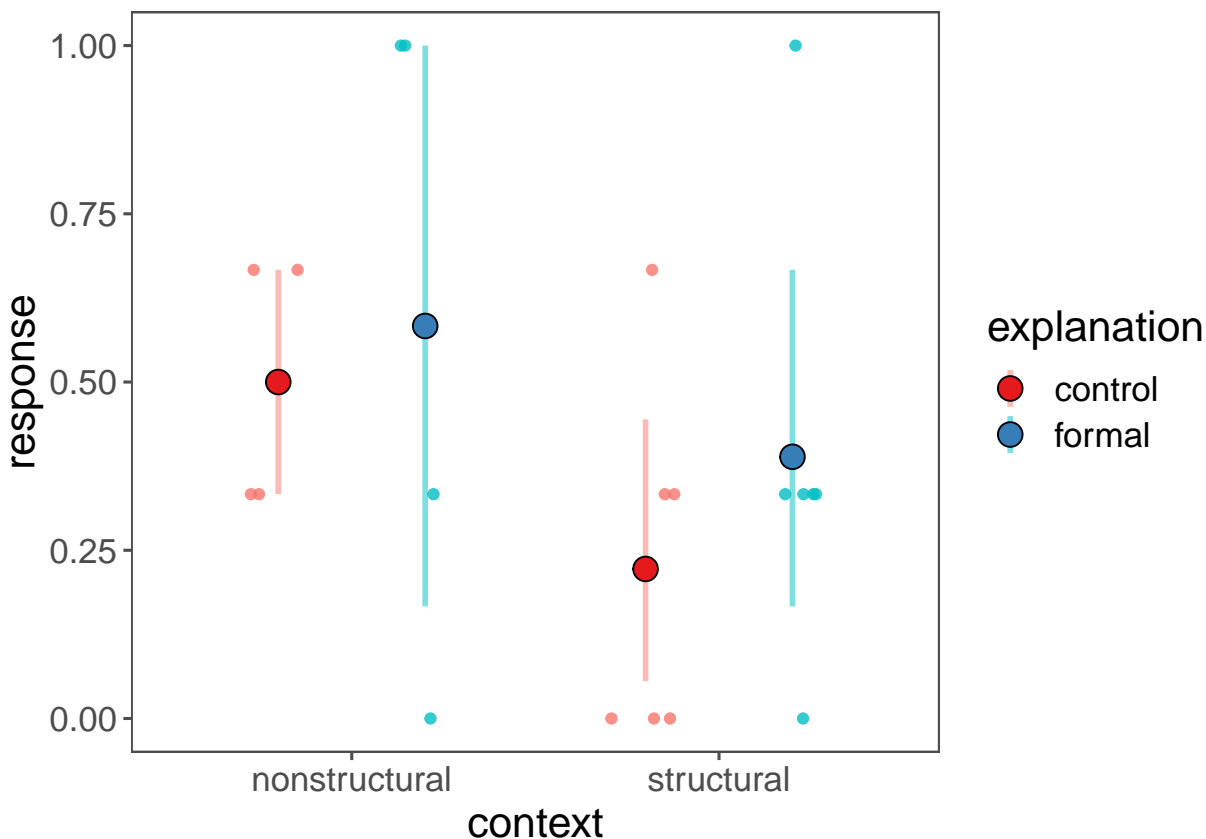


```
ggsave("FYP_pilot_children_2.2_2.3_contextExpl_innatenessSwitch.png", width = 5)
```

```
## Saving 5 x 4.5 in image
```

```
# Pilot 2.1 + 2.2 + 2.3 (innateness switch only): essentialism by context and explanation
ggplot(df.tidy %>% filter(question == "innateness_switch"), aes(x = context, y = response, fill = explanation)) +
  geom_point(position = position_jitterdodge(jitter.width = 0.2, dodge.width = 0.8),
             alpha = 0.8) +
  stat_summary(fun.data = "mean_cl_boot",
              position = position_dodge(width = 0.8),
              geom = "linerange",
              size = 1,
              alpha = 0.5) +
  stat_summary(fun.y = "mean",
              position = position_dodge(width = 0.8),
              geom = "point",
              shape = 21,
              color = "black",
              size = 4) +
  scale_fill_brewer(palette = "Set1") +
  scale_y_continuous(limits = c(0, 1))
```

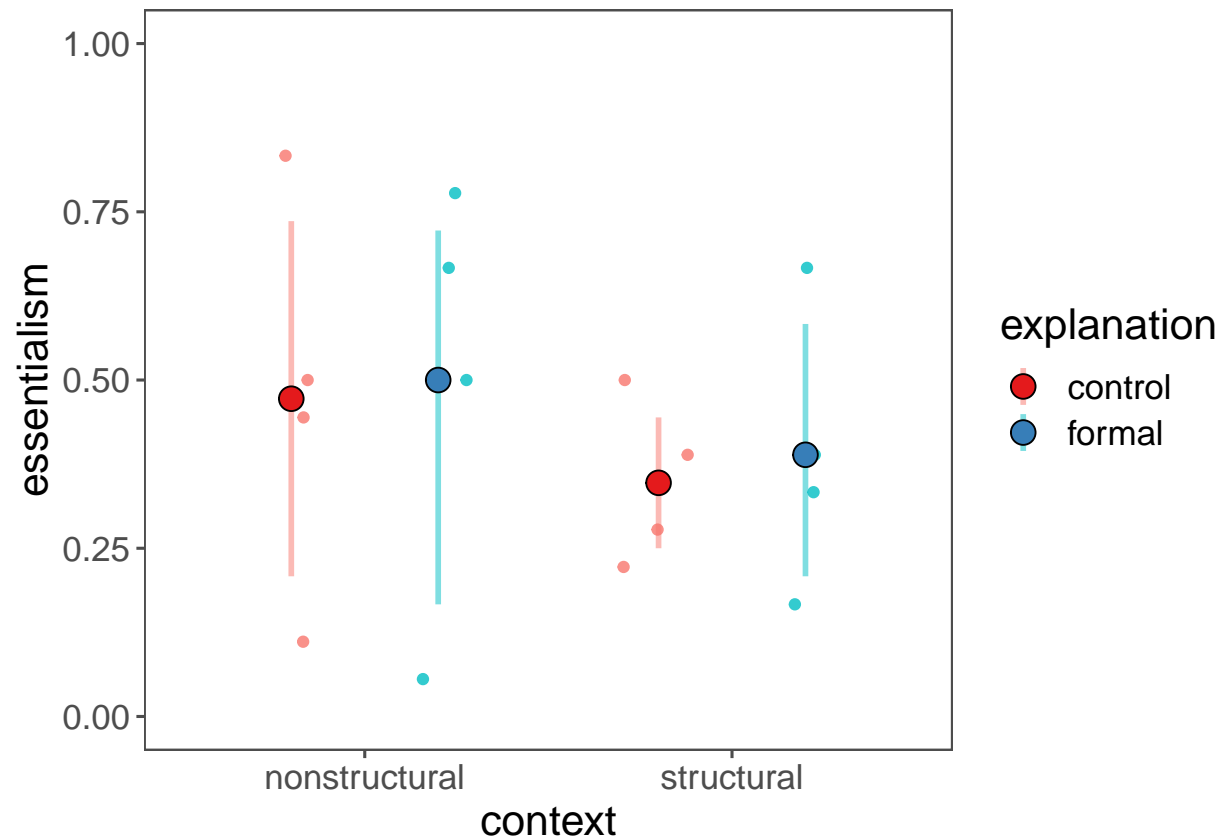




```
ggsave("FYP_pilot_children_2.1_2.2_2.3_contextExpl_innatenessSwitch.png", width = 5)
```

```
## Saving 5 x 4.5 in image
```

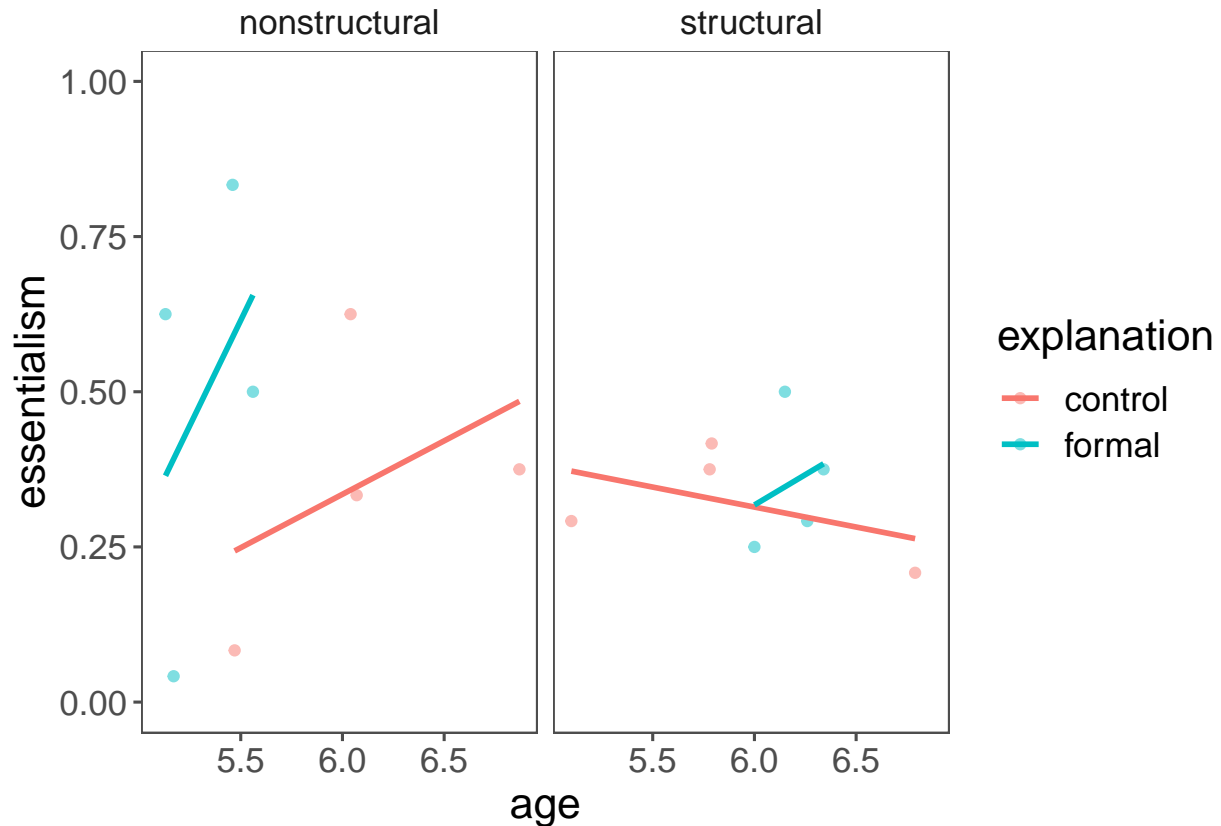
```
# Pilot 2.2 + 2.3 (no normative): essentialism by context and explanation
ggplot(df.means_subj.2.3.noNormative, aes(x = context, y = essentialism, fill = explanation, color = explanation)) +
  geom_point(position = position_jitterdodge(jitter.width = 0.2, dodge.width = 0.8),
            alpha = 0.8) +
  stat_summary(fun.data = "mean_cl_boot",
              position = position_dodge(width = 0.8),
              geom = "linerange",
              size = 1,
              alpha = 0.5) +
  stat_summary(fun.y = "mean",
              position = position_dodge(width = 0.8),
              geom = "point",
              shape = 21,
              color = "black",
              size = 4) +
  scale_fill_brewer(palette = "Set1") +
  scale_y_continuous(limits = c(0, 1))
```



```
ggsave("FYP_pilot_children_2.2_2.3_contextExpl_noNormative.png", width = 5)
```

```
## Saving 5 x 4.5 in image
```

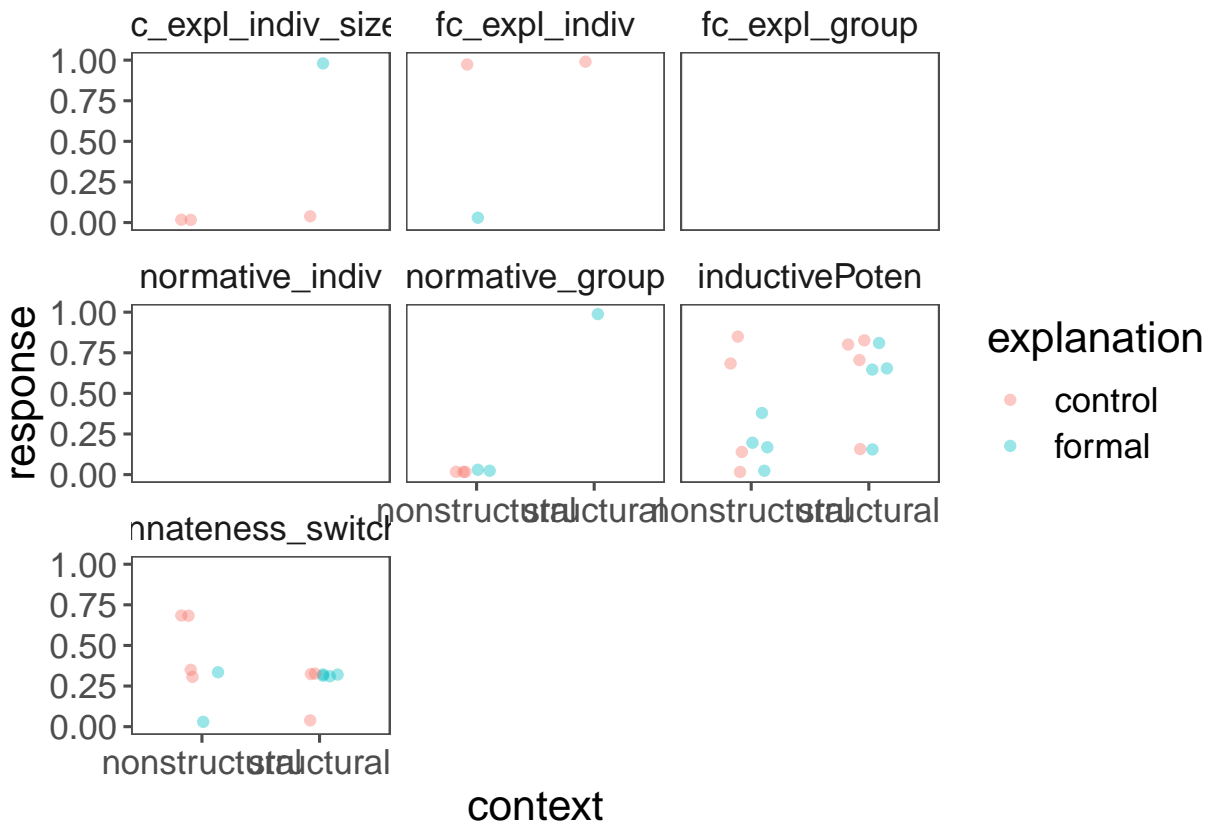
```
# Essentialism by explanation over age, faceted by context
ggplot(df.means_subj.2.3, aes(x = age, y = essentialism, fill = explanation, color = explanation)) +
  facet_wrap(~ context) +
  geom_point(alpha = 0.5) +
  geom_smooth(method = "lm", se = FALSE) +
  scale_fill_brewer(palette = "Set1") +
  scale_y_continuous(limits = c(0, 1))
```



```
# Essentialism by context and explanation, faceted by DV
ggplot(df.tidy.2.3, aes(x = context, y = response, fill = explanation, color = explanation)) +
  facet_wrap(~ question) +
  geom_point(alpha = 0.4,
             position = position_jitterdodge(jitter.width = 0.2, jitter.height = 0.05, dodge.width = 0.2)) +
  scale_fill_brewer(palette = "Set1") +
  scale_y_continuous(limits = c(0, 1))
```

```
## Warning in min(x): no non-missing arguments to min; returning Inf
## Warning in max(x): no non-missing arguments to max; returning -Inf
## Warning in min(x): no non-missing arguments to min; returning Inf
## Warning in max(x): no non-missing arguments to max; returning -Inf
## Warning in min(x): no non-missing arguments to min; returning Inf
## Warning in max(x): no non-missing arguments to max; returning -Inf
## Warning in min(x): no non-missing arguments to min; returning Inf
## Warning in max(x): no non-missing arguments to max; returning -Inf
```

```
## Warning: Removed 70 rows containing missing values (geom_point).
```



```
ggsave("FYP_pilot_children_2_contextExpl_DV.png")
```

```
## Saving 6.5 x 4.5 in image
```

```
## Warning in min(x): no non-missing arguments to min; returning Inf
```

```
## Warning in max(x): no non-missing arguments to max; returning -Inf
```

```
## Warning in min(x): no non-missing arguments to min; returning Inf
```

```
## Warning in max(x): no non-missing arguments to max; returning -Inf
```

```
## Warning in min(x): no non-missing arguments to min; returning Inf
```

```
## Warning in max(x): no non-missing arguments to max; returning -Inf
```

```
## Warning in min(x): no non-missing arguments to min; returning Inf
```

```
## Warning in max(x): no non-missing arguments to max; returning -Inf
```

```
## Warning: Removed 70 rows containing missing values (geom_point).
```

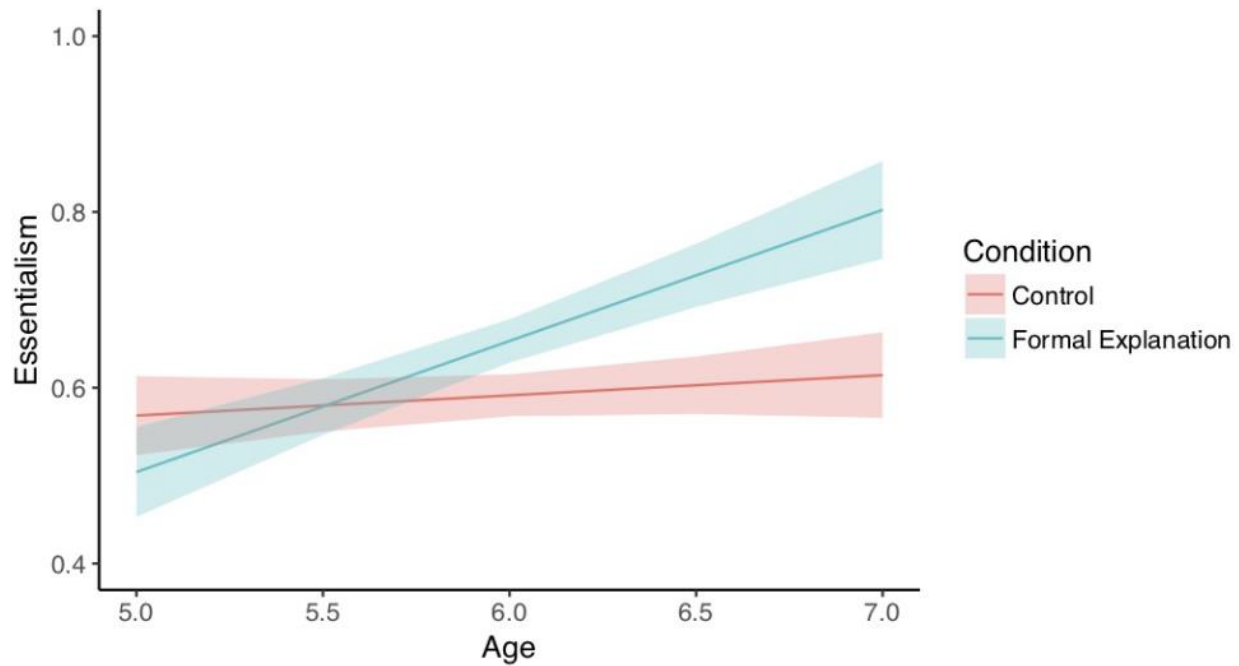


Figure 1: Muradoglu et al 2019 Exp 2 explanation on essentialism results

## Target analysis

The analyses as specified in the analysis plan.

```
# contextExpl.2.3 <- df.means_subj.2.3 %>%
# aov(essentialism ~ 1 + context * explanation, .) %>%
# tidy()
```

## Power Analysis

### Power Analysis based on prior studies

Nadya's estimate is 30 to 50 per cell, so  $n = 120$  to  $50 \times 4$  total.

Muradoglu et al 2019 (Exp 2 on gender) ran 93 5-6yo in either a formal explanation or control explanation condition (both basically nonstructural), and measured essentialism using 5 essentialism DVs (coded as 0 to 1, with greater being more essentialist).

Although the main effect of condition was not significant,  $p = .11$ , the condition by age interaction was,  $p = .044$ . Six-year-olds, but not 5-year olds, showed higher essentialism for properties introduced via formal explanations ( $ps = .011$  and  $.999$ , respectively; see Figure 2). Children also gave more essentialist responses with age,  $p = .003$ .

Vasilyeva et al 2018 ran 48 5-6yo (also some 4-5 and adults) in either a structural context or nonstructural context (both basically without giving an explanation), and measured essentialism using 1 essentialism DV (innateness\_switch, which they call mutability, coded as 1, 2, 3, 4, with greater being less essentialist).

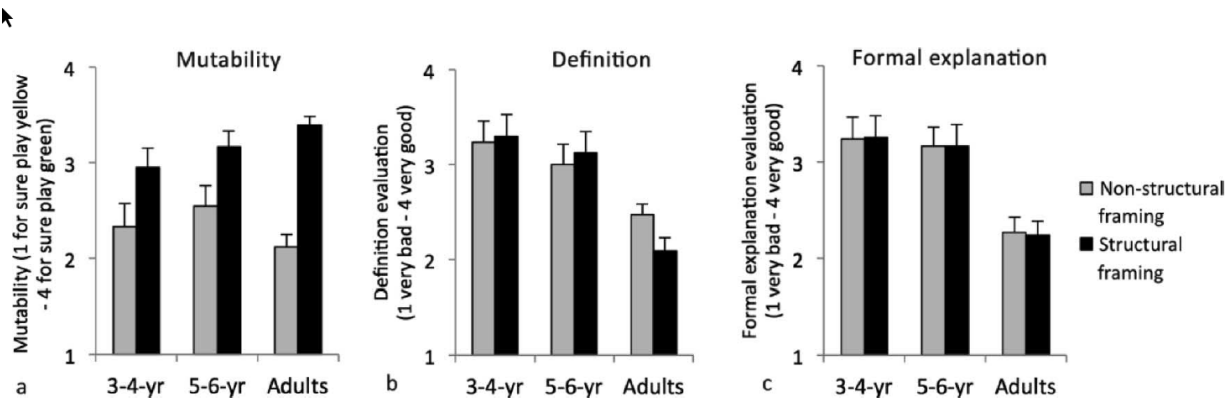


Figure 4. Mutability (a), partial definition (b), and formal explanation ratings (c) as a function of framing condition and age group. Error bars represent 1 SEM.

Figure 2: Vasilyeva et al 2019 context on mutability results

an ANOVA with framing condition and age group as between-subjects factors revealed the predicted main effect of framing,  $F(1, 85) = 8.95$ ,  $p = .004$ ,  $\text{partial\_eta\_p\_sq} = .095$ , with no main effect of age group,  $F(1, 85) = 1.05$ ,  $p = .309$ , nor interaction,  $F(1, 85) = .01$ ,  $p = .984$ . Similarly, adults rated the target property as more mutable under the structural than nonstructural framing,  $t(65) = 8.04$ ,  $p = .001$ ,  $d = 2.00$ .

```
# make reproducible
set.seed(1)

# set predicted values based on prior literature
predicted <- tibble(
  context = c("nonstructural", "nonstructural", "structural", "structural"),
  explanation = c("control", "formal", "control", "formal"),

  # means
  essentialism = c(0.590, # nonstructural control ~ Muradoglu et al control condition (exact mean from data)
                  0.645, # nonstructural formal ~ Muradoglu et al formal condition (exact mean from data)
                  1-(3.17-1)/(4-1), # structural control ~ Vasilyeva et al structural condition (estimated mean)
                  1-(3.17-1)/(4-1)), # structural formal ~ we predict to be the same as structural control

  # where do the SDs come into the power analysis?
  sd = c(0.475, # nonstructural control ~ Muradoglu et al control condition (exact SD from data)
        0.463, # nonstructural formal ~ Muradoglu et al formal condition (exact SD from data)
        (0.65/3.5)/(4-1)*sqrt(24), # structural control ~ Vasilyeva et al structural condition (estimated SD)
        (0.65/3.5)/(4-1)*sqrt(24))
)

# set parameters for linear model:
# essentialism = nonstructural + formal * x1 + structural * x2 + formalStructural * x1 * x2
b0 = predicted$essentialism[1] # b0 = nonstructural_control
b1 = predicted$essentialism[2] - b0 # nonstructural_formal = b0 + b1 -> b1 = nonstructural_formal - b0
b2 = predicted$essentialism[3] - b0 # structural_control = b0 + b2 -> b2 = structural_control - b0
```

```

b3 = predicted$essentialism[4] - b0 - b1 - b2 # structural_formal = b0 + b1 + b2 + b3 -> b3 = structural

# make a function to simulate linear regression
regression_sim <- function(simNum, n, b0, b1, b2, b3) {
  x1 <- sample(0:1, n, replace = TRUE) # formalTRUE is either 0 or 1
  x2 <- sample(0:1, n, replace = TRUE) # structuralTRUE is either 0 or 1

  # essentialism <- b0 + (b1 * formalTRUE) + (b2 * structuralTRUE) + (b3 * formalTRUE * structuralTRUE)
  y <- b0 + (b1 * x1) + (b2 * x2) + (b3 * x1 * x2) +
    # residual error
    rnorm(n, mean = 0, sd = 1) # how to set the mean and sd of residual?

  model <- lm(y ~ x1 * x2)
  summary(model)

  output <- summary(model)$coefficients
  coefs <- output[, 1]
  ps <- output[, 4]

  rsq <- summary(model)$r.squared

  results <- c(coefs, ps, rsq)
  names(results) <- c('b0_coef', 'b1_coef', 'b2_coef', 'b3_coef',
                     'b0_p', 'b1_p', 'b2_p', 'b3_p', 'rsq')
  return(results)
}

# run simulation with different ns, and different b3 (interaction effect sizes)
paramtest_results <- grid_search(regression_sim,
  params = list(n = c(100, 120, 140), # try different n
               b3 = c(b3 * 1.1, b3, b3 * 0.9)), # try different values for b3 (context and explanati
  n.iter=1000,
  output='data.frame',
  parallel='snow',
  ncpus=3,
  b0 = b0, b1 = b1, b2 = b2)

```

```
## Running 9,000 tests...
```

```

# calculate power
power <- paramtest_results$results %>%
  group_by(n.test, b3.test) %>%
  summarize(power = sum(b3_p < .05) / n())
power

```

```

## # A tibble: 9 x 3
## # Groups:   n.test [3]
##   n.test b3.test power
##   <dbl>   <dbl> <dbl>
## 1    100 -0.0605 0.055
## 2    100 -0.055  0.05
## 3    100 -0.0495 0.049

```

```
## 4    120 -0.0605 0.052
## 5    120 -0.055  0.043
## 6    120 -0.0495 0.05
## 7    140 -0.0605 0.061
## 8    140 -0.055  0.06
## 9    140 -0.0495 0.044
```

```
# # set alpha and the number of simulations
# alpha = 0.05
# n_simulations = 1000
#
# # set up the simulation grid
# df.pwr = crossing(n = seq(80, 120, 1),
#                   simulation = 1:n_simulations,
#                   alpha = alpha)
#
# # draw random samples from the normal distributions, save the random samples in lists like so:
# df.pwr = df.pwr %>%
#   group_by(n, simulation) %>% # your simulation counter
#   mutate(nonstructural_control = rnorm(n, mean = predicted$essentialism[1], sd = predicted$sd[1]) %>%
#     nonstructural_formal = rnorm(n, mean = predicted$essentialism[2], sd = predicted$sd[2]) %>%
#     structural_control = rnorm(n, mean = predicted$essentialism[3], sd = predicted$sd[3]) %>%
#     structural_formal = rnorm(n, mean = predicted$essentialism[4], sd = predicted$sd[4]) %>%
#     list())
#
# # calculate anovas for each sample
# ## hint: group by simulation first and then nest the data before using map()
# df.pwr <- df.pwr %>%
#   group_by(n, simulation) %>%
#   nest() %>%
#   mutate(anova = tidy(map(data, ~ aov(~essentialism ~ 1 + context * explanation, .))), #this does
#     p_value = map(anova, ~ $p.value[3]))
#
# # calculate the proportion with which the H0 would be rejected (= power)
# df.pwr %>%
#   group_by(n) %>%
#   summarize(power = sum(p_value < .05) / n())
```

Power is extremely low for all n and b3 tested - what's going on? Does it have to do with the mean/SD of the residual? Do I need to incorporate the SD of the predicted data somehow?

### Power Analysis based on bootstrapping pilot data

```
# pwr.t.test(d = cohensD(essentialism ~ context * explanation, data = df.means_subj),
#            power = 0.8,
#            sig.level = 0.05)
```

### Discussion