

# Effects on projectivity ratings by Embedding Operator and Trigger — Data Analysis

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## Contents

<b>1</b>	<b>Introducing the dataset</b>	<b>1</b>
<b>2</b>	<b>Data Overview and Statistical Summaries</b>	<b>4</b>
2.1	Distribution of projectivity ratings by operator: . . . . .	4
2.2	Distribution of projectivity ratings by verb: . . . . .	5
2.3	Means and confidence intervals for projectivity rating by operator . . . . .	6
2.4	Means and confidence intervals for projectivity rating by verb: . . . . .	7
2.5	Means and confidence intervals for projectivity rating by verb and operator: . . . . .	7
<b>3</b>	<b>Analysis</b>	<b>8</b>

## 1 Introducing the dataset

```
> str(data_all)

'data.frame': 57160 obs. of 9 variables:
 $ workerid      : Factor w/ 2682 levels "1","3","4","5",...: 1 1 1 1 1 1 1 1 1 1 ...
 $ content       : Factor w/ 20 levels "charley","danny",...: 1 2 3 4 5 6 7 8 9 10 ...
 $ short_trigger: chr  "acknowledge" "hear" "reveal" "discover" ...
 $ ai_block      : chr  "block1" "block1" "block1" "block1" ...
 $ ai            : num  0.98 0.99 0.99 0.99 0.98 0.98 1 0.99 0.99 0.99 ...
 $ projective    : num  0.3 0.98 0.01 0.99 0.98 0.99 0.01 0.01 0.27 0.01 ...
 $ verb         : Factor w/ 20 levels "acknowledge",...: 1 11 16 9 18 13 17 7 14 8 ...
 $ op           : Factor w/ 4 levels "q","n","m","c": 1 1 1 1 1 1 1 1 1 1 ...
 $ exp_block     : Factor w/ 3 levels "1","2","3": 1 1 1 1 1 1 1 1 1 1 ...

> length(levels(data_all$workerid))

[1] 2682
```

The dataset consists of 57160 observations from 2682 participants (recruited on the online platforms Prolific and Amazon Mechanical Turk), across 12 experiments.

We are interested in how highly participants rate speaker commitment to the truth of an embedded complement clause, coded as projective on a real-numbered sliding scale between 0 – 1.

The complement clause was embedded under an attitude verb, which in turn was embedded under an entailment-cancelling operator. Our fixed effects factors manipulate the following:

1. The choice of attitude verb (coded as verb)
2. The entailment-cancelling operator (coded as op)

The levels for our fixed effects factors are the following:

```

> levels(data_all$verb)

[1] "acknowledge" "admit"      "announce"    "be_annoied"  "be_right"
[6] "confess"     "confirm"    "demonstrate" "discover"    "establish"
[11] "hear"        "inform"     "know"        "pretend"     "prove"
[16] "reveal"      "say"        "see"         "suggest"     "think"

> length(levels(data_all$verb))

[1] 20

> levels(data_all$op)

[1] "q" "n" "m" "c"

> length(levels(data_all$op))

[1] 4

```

We are interested in the effect on projective of verb and op, as well as their interaction, corresponding to a  $20 \times 4$  factorial design, yielding

```

> length(levels(data_all$verb))*length(levels(data_all$op))

[1] 80

```

conditions.

We have 20 items, corresponding to the content of the complement clause.

```

> levels(data_all$content)

[1] "charley" "danny"    "emily"    "emma"     "frank"    "grace"
[7] "isabella" "jackson"  "jayden"   "jon"      "josh"     "josie"
[13] "julian"  "mary"     "mia"      "olivia"   "owen"     "sophia"
[19] "tony"    "zoe"

> length(levels(data_all$content))

[1] 20

```

We have roughly 36 observations by item and condition. This is an approximate number, because the op manipulation is a between-studies manipulation, and the number of participants differs by experiment:

```

> # n observations
> length(data_all[,1])

[1] 57160

> # observations by item
> length(data_all[,1])/length(levels(data_all$content))

[1] 2858

> table(data_all$content)

charley  danny  emily  emma  frank  grace isabella  jackson
 2858    2858  2858  2858   2858   2858   2858    2858
 jayden   jon   josh  josie  julian  mary   mia   olivia
 2858    2858  2858  2858   2858   2858   2858    2858
  owen  sophia  tony   zoe
 2858    2858  2858  2858

```

```

> # observations by verb
> length(data_all[,1])/length(levels(data_all$verb))

[1] 2858

> table(data_all$verb)

acknowledge      admit      announce  be_annoyed   be_right    confess
      2858       2858       2858       2858       2858       2858
confirm demonstrate  discover   establish     hear      inform
      2858       2858       2858       2858       2858       2858
know      pretend     prove      reveal      say        see
      2858       2858       2858       2858       2858       2858
suggest      think
      2858       2858

> # observations by operator
> length(data_all[,1])/length(levels(data_all$op))

[1] 14290

> table(data_all$op)

      q      n      m      c
13740 14340 14680 14400

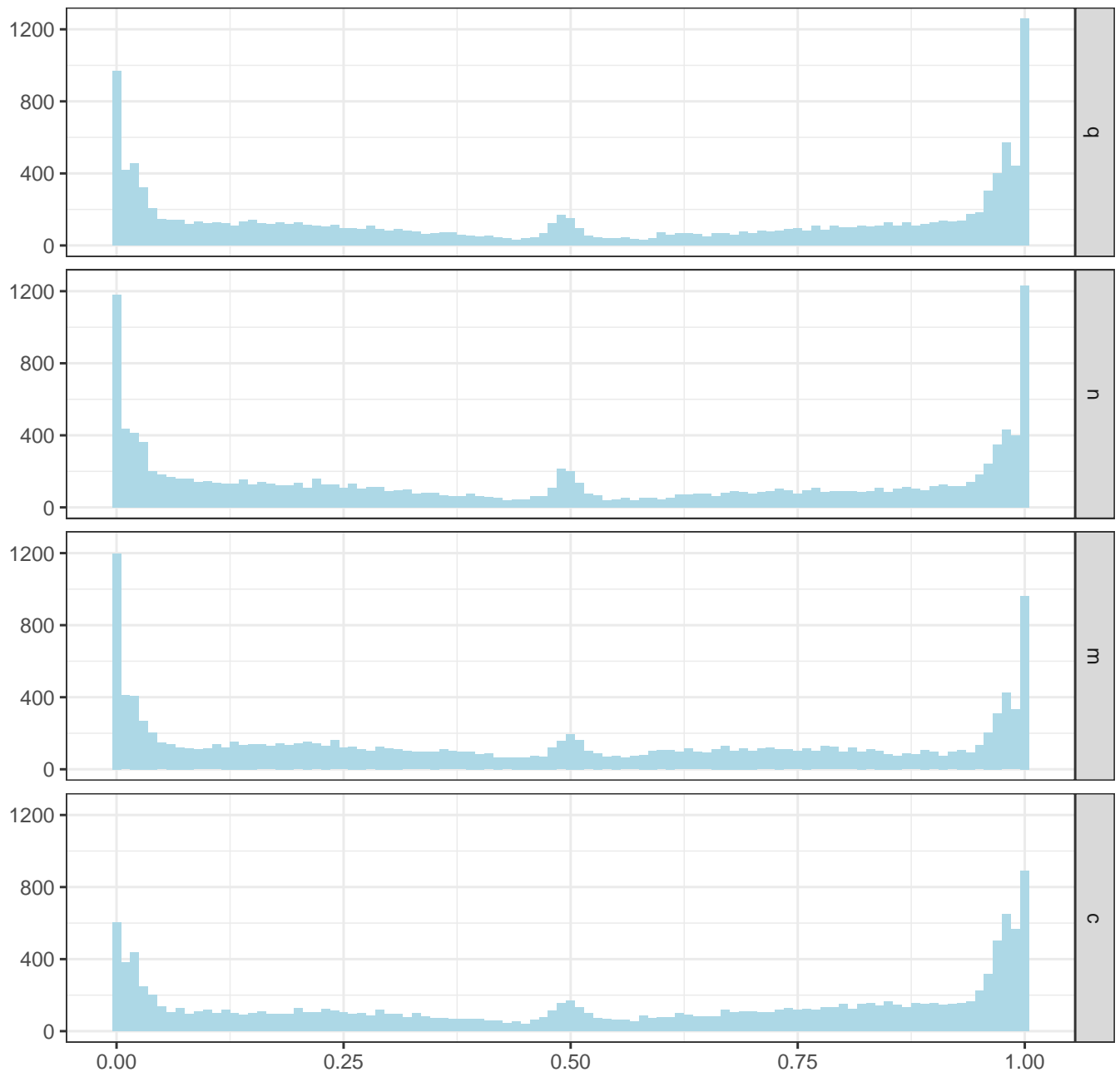
> # observations by item and condition
> length(data_all[,1])/length(levels(data_all$content))/
+   (length(levels(data_all$verb))*length(levels(data_all$op)))

[1] 35.725

```

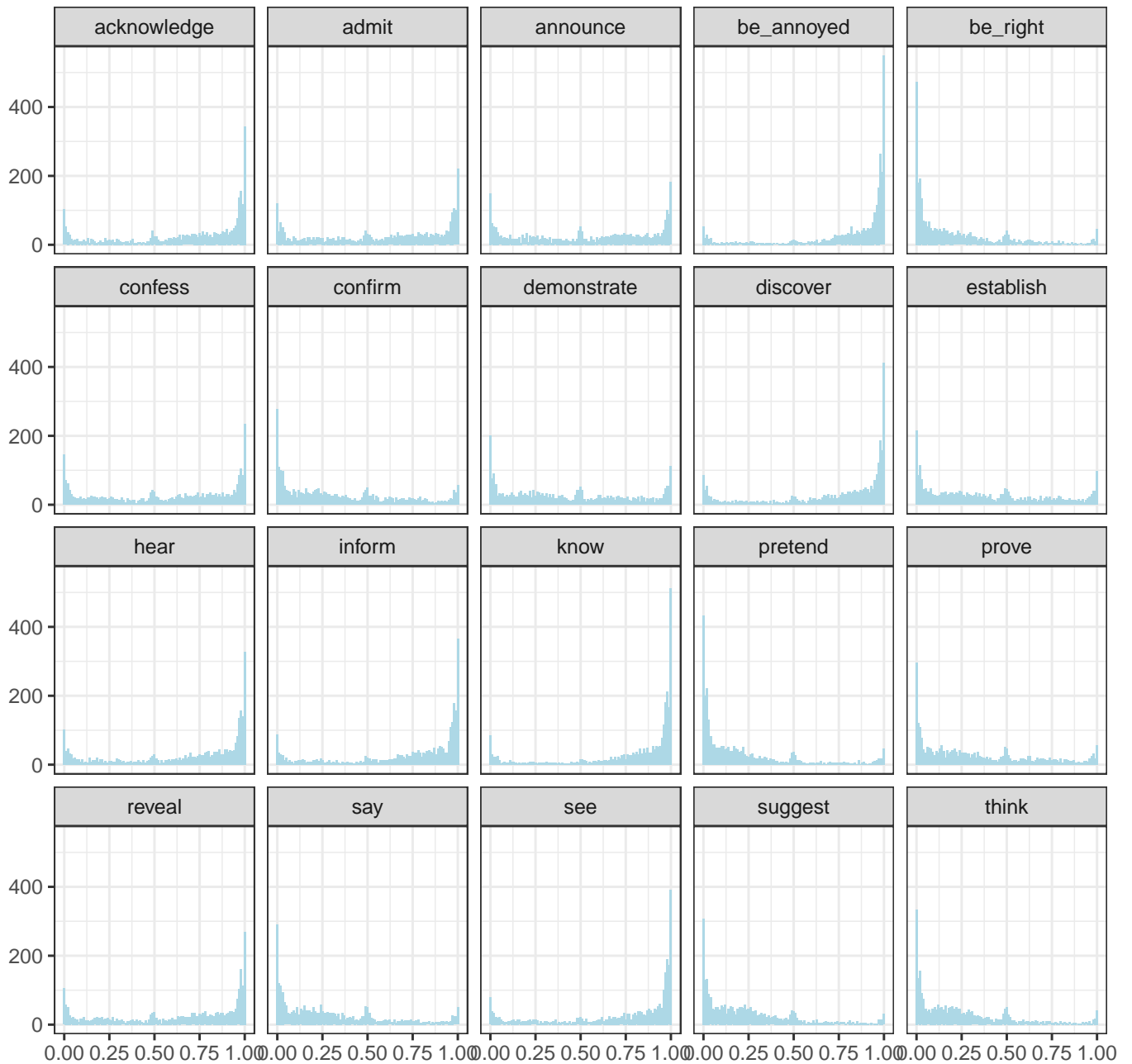
## 2 Data Overview and Statistical Summaries

### 2.1 Distribution of projectivity ratings by operator:



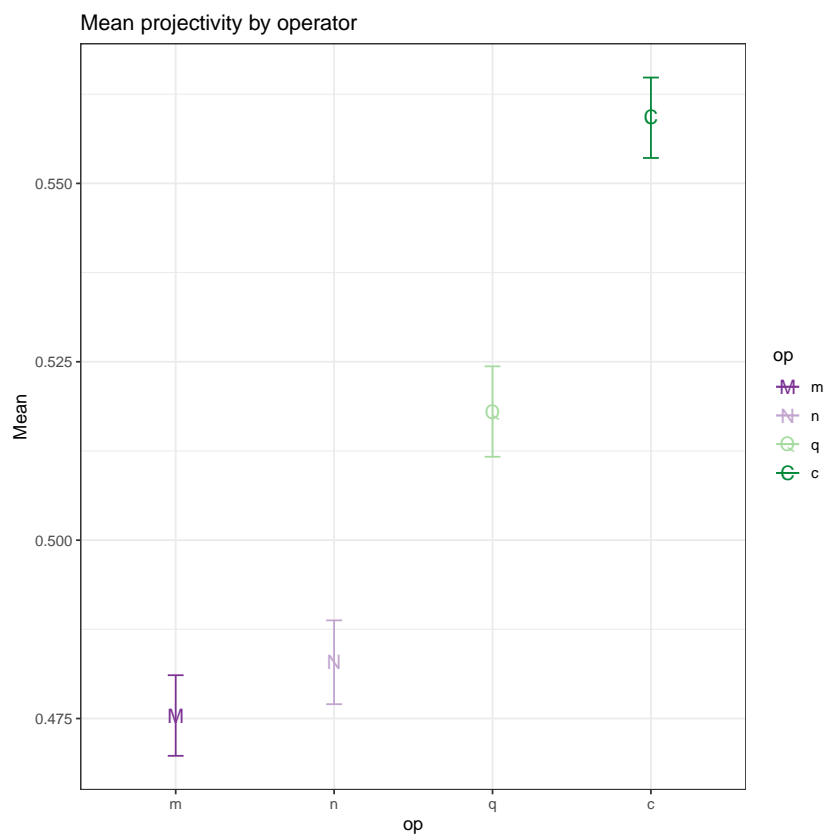
- These definitely do not look normal
- Maybe a beta-regression would be useful?
- But even that would be relying on some simplifying assumptions, since we might be ignoring the little bump in the middle

## 2.2 Distribution of projectivity ratings by verb:



- Some of these also show a higher mass around the middle of the scale
- but it looks the beta-distribution could be a useful approximation

## 2.3 Means and confidence intervals for projectivity rating by operator

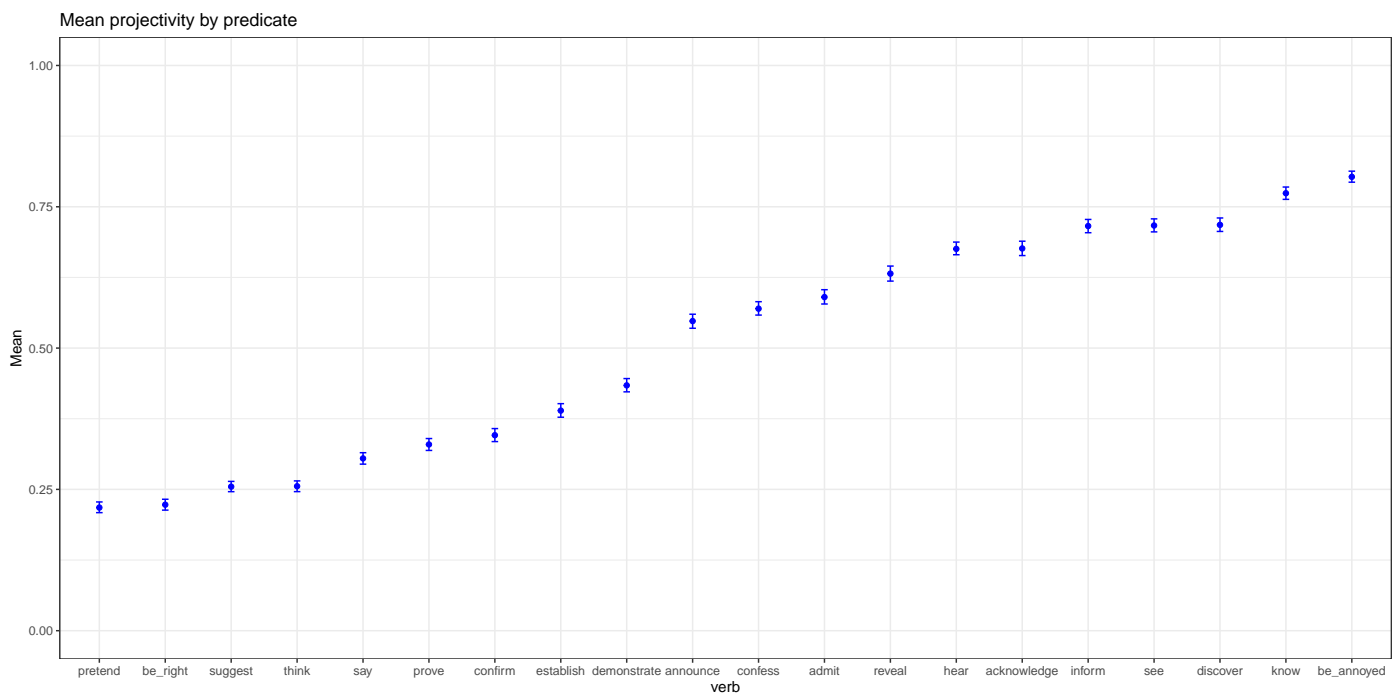


The following generalizations emerge:

- Conditionals have the highest projectivity ratings
- Projectivity ratings for questions are higher than those for modals and negation, but lower than those for conditionals
- Modals and negation have the lowest projectivity ratings
- The ratings for negation look a little higher than for modals, but error bars overlap

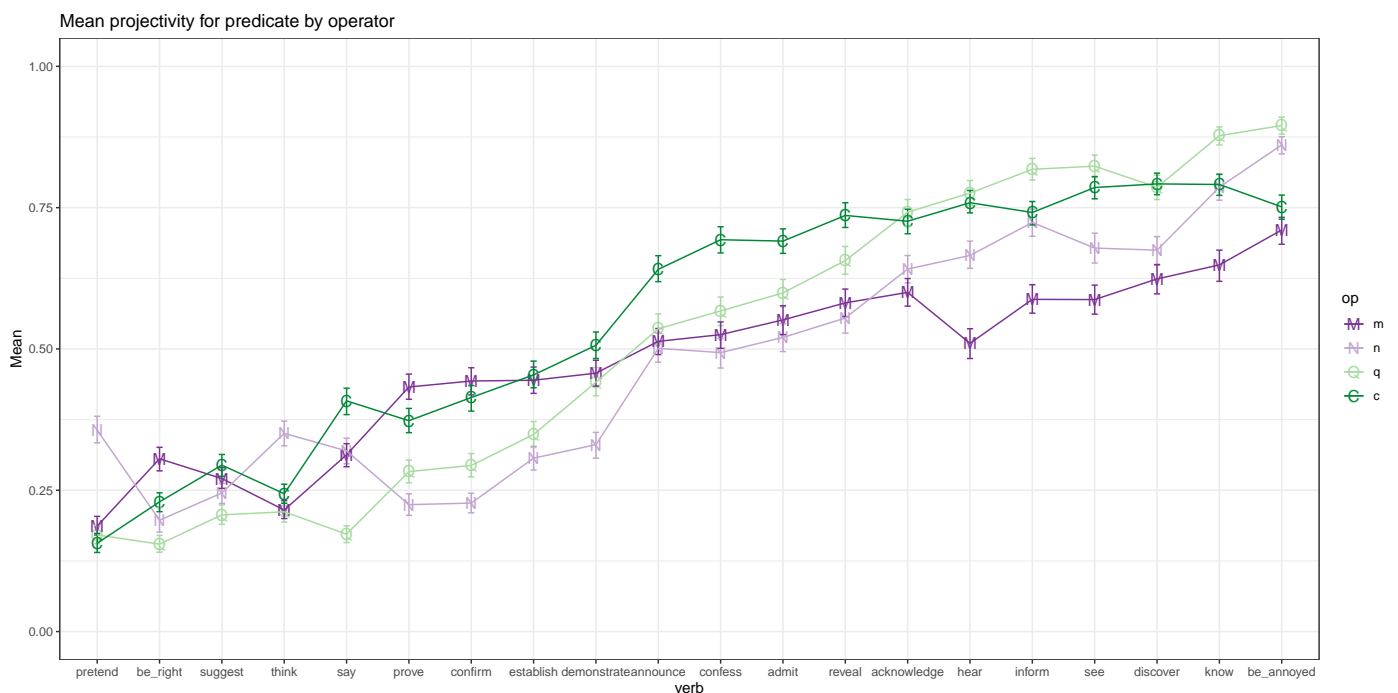
Although these differences appear to be significant, they are quite small.

## 2.4 Means and confidence intervals for projectivity rating by verb:



- We see gradual differences in projectivity between verbs

## 2.5 Means and confidence intervals for projectivity rating by verb and operator:



- We see interactions between verb and operator
- However, we do not see any group of verbs that could be characterized as ‘semi-factive’ in the sense of Karttunen. Specifically, *discover* does not follow the predicted pattern: It is not more projective under negation, but most projective in conditionals and questions.
- Two verbs show highest projectivity under negation: the anti-veridical *pretend*, and the non-veridical *think*. These are verb with relatively low overall projectivity.

- What else...?

### 3 Analysis

We are interested in how the response (projectivity ratings) depends on the verb and embedding operator.

```
> formula <- response ~ op * verb + (1 | workerid) + (1 | item)
> # formula <- response ~ op * verb + (1 + op + verb | workerid) + (1 + op + verb | item)
```

Trying a beta-regression. Our response variable has observations from a sliding scale between (0, 1). For beta regression, we rescale it to [0, 1], using method used in Degen & Tonhauser (2022), from Smithson & Verkuilen (2006).

```
> data_all$response = (data_all$projective*(nrow(data_all)-1) + .5)/nrow(data_all)
```

```
> library(brms)
```

```
Loading required package: Rcpp
Loading 'brms' package (version 2.16.3). Useful instructions
can be found by typing help('brms'). A more detailed introduction
to the package is available through vignette('brms_overview').
```

```
Attaching package: 'brms'
```

```
The following object is masked from 'package:stats':
  ar
```

```
> model1 <- brm(formula = response ~ op * verb + (1 | workerid) + (1 | item), family = )
```

```
Error: Data must be specified using the 'data' argument.
```