# Mispronunciation MetaAnalysis for CogSci

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## Loading tidyverse: ggplot2 ## Loading tidyverse: tibble ## Loading tidyverse: tidyr ## Loading tidyverse: readr ## Loading tidyverse: purrr ## Loading tidyverse: dplyr						
## Conflicts with tidy packages	 	 	 	-		
## filter(): dplyr, stats ## lag(): dplyr, stats						
## Loading required package: Matrix						
## ## Attaching package: 'Matrix'						
<pre>## The following object is masked from 'package:tidyr': ##</pre>						
## expand						
<pre>## Loading 'metafor' package (version 1.9-9). For an over ## and introduction to the package please type: help(metage)</pre>						
## Loading 'meta' package (version 4.9-0). ## Type 'help(meta)' for a brief overview.						
## ## Attaching package: 'meta'						

```
## The following objects are masked from 'package:metafor':
##

## baujat, forest, funnel, funnel.default, labbe, radial,
## trimfill
```

### Preparation

Read in data and tidy up dataset

### Systematic Study Collection

The database contains data from 32 papers consisting of data from 2010 infants.

The next table shows what type of publications were included in our meta-analysis

publication_status	n_unique
dissertation	2
gray paper	2
paper	27
proceedings	1

### **Effect Size Calculation**

#### Type of Dependent Variable

The table below summarized the type of dependent variable and subsequent comparison reported in each paper.

within_measure_descriptive	n_unique
post-naming compared to pre-naming phase	10
post-naming phase compared with chance $(=50\%)$	9
post-pre difference score compared with chance $(=0)$	13

#### Data Used to Calculate Effect Sizes

The table below shows based on which data we calculated effect sizes. If both raw means/standard deviations as well as t-values were available, we used raw means/standard deviations to calculate effect sizes.

es_method	n_unique
group_means_one	18
group_means_two	7
t_one	4
$t\_two$	5

### Meta-Analysis

#### Object Identification

#### Correct words

Meta-analytic effect for correctly pronounced words in object identification.

```
##
## Multivariate Meta-Analysis Model (k = 104; method: REML)
##
      logLik
               Deviance
                               AIC
                                          BIC
                                                     AICc
## -111.8857
                          229.7713
               223.7713
                                     237.6755
                                                 230.0137
## Variance Components:
##
## outer factor: short_cite (nlvls = 32)
  inner factor: collapse
                           (nlvls = 52)
##
##
               estim
                        sqrt fixed
## tau^2
              0.4483 0.6696
                                 no
## rho
              0.8886
                                 nο
##
## Test for Heterogeneity:
## Q(df = 103) = 625.6267, p-val < .0001
##
## Model Results:
##
## estimate
                         zval
                                  pval
                                          ci.lb
                                                   ci.ub
                  se
                                <.0001
                                         0.6730
##
    0.9078
              0.1198
                       7.5784
                                                   1.1426
                                                               ***
##
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

#### Mispronounced words

Meta-analytic effect for mispronounced words in object identification.

```
## Multivariate Meta-Analysis Model (k = 147; method: REML)
##
                                      BIC
                                               AICc
##
    logLik Deviance
                            AIC
## -70.1217 140.2434 146.2434 155.1942 146.4124
## Variance Components:
##
## outer factor: short_cite (nlvls = 32)
## inner factor: collapse
                            (nlvls = 52)
##
##
               estim
                        sqrt fixed
## tau^2
              0.1192 0.3453
                                 no
## rho
              0.5924
                                 no
##
## Test for Heterogeneity:
```

```
## Q(df = 146) = 462.5143, p-val < .0001
##
## Model Results:
##
## estimate
                  se
                         zval
                                  pval
                                          ci.lb
                                                   ci.ub
    0.2498
                       4.1835
                                <.0001
                                         0.1328
                                                  0.3668
##
             0.0597
                                                              ***
##
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

#### Mispronunciation Sensitivity

Meta-analytic effect for mispronunciation senstivity.

```
## Multivariate Meta-Analysis Model (k = 251; method: REML)
##
##
                               AIC
                                          BIC
                                                    AICc
      logLik
               Deviance
## -252.9095
               505.8189
                          513.8189
                                     527.8887
                                                513.9829
##
## Variance Components:
##
## outer factor: short_cite (nlvls = 32)
## inner factor: collapse
                           (nlvls = 52)
##
##
               estim
                        sqrt fixed
## tau^2
              0.1371 0.3703
                                 no
              0.7381
## rho
##
## Test for Residual Heterogeneity:
## QE(df = 249) = 1088.1411, p-val < .0001
## Test of Moderators (coefficient(s) 2):
## QM(df = 1) = 215.7609, p-val < .0001
##
## Model Results:
##
              estimate
                                   zval
                                           pval
                                                  ci.lb
                                                           ci.ub
                            se
                0.2792
                                 4.2827
                                         <.0001
                                                 0.1514
                                                         0.4069
## intrcpt
                        0.0652
## condition
                0.4953
                        0.0337
                                14.6888 <.0001 0.4293
                                                         0.5614
##
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

#### Age Moderator Effects

#### Object identification correct words

Age moderator effects for object identification for correctly pronounced words.

```
##
## Multivariate Meta-Analysis Model (k = 104; method: REML)
##
```

```
##
     logLik
              Deviance
                             AIC
                                       BIC
                                                 AICc
## -110.8134
              221.6268
                        229.6268
                                   240.1267
                                             230.0392
##
## Variance Components:
## outer factor: short_cite (nlvls = 32)
## inner factor: collapse
                          (nlvls = 52)
##
##
                      sqrt fixed
              {\tt estim}
## tau^2
             0.4458
                    0.6677
                               no
## rho
             0.8835
                               no
## Test for Residual Heterogeneity:
## QE(df = 102) = 619.1502, p-val < .0001
## Test of Moderators (coefficient(s) 2):
## QM(df = 1) = 0.6778, p-val = 0.4103
##
## Model Results:
##
##
           estimate
                              zval
                                      pval
                                             ci.lb
                                                     ci.ub
                        se
             0.9202 0.1203 7.6515
                                   <.0001
                                            0.6845
                                                   1.1559
## intrcpt
             ## age.C
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

#### Object identification mispronounced words

Age moderator effects for object identification for mispronounced words.

```
## Multivariate Meta-Analysis Model (k = 147; method: REML)
##
##
    logLik Deviance
                            AIC
                                      BIC
                                               AICc
## -68.8541 137.7083 145.7083 157.6152 145.9940
## Variance Components:
## outer factor: short_cite (nlvls = 32)
## inner factor: collapse
                            (nlvls = 52)
##
               estim
                        sqrt fixed
## tau^2
              0.1181 0.3437
                                 no
## rho
              0.5830
##
## Test for Residual Heterogeneity:
## QE(df = 145) = 449.1871, p-val < .0001
## Test of Moderators (coefficient(s) 2):
## QM(df = 1) = 1.7151, p-val = 0.1903
## Model Results:
##
```

```
##
            estimate
                                  zval
                                          pval
                                                   ci.lb
                                                           ci.ub
                           se
## intrcpt
                       0.0599
                               4.3583
                                        <.0001
                                                  0.1438
                                                          0.3788
               0.2613
                                                                   ***
  age.C
                                1.3096
               0.0149
                       0.0114
                                        0.1903
                                                 -0.0074
                                                          0.0372
##
##
                    0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Signif. codes:
```

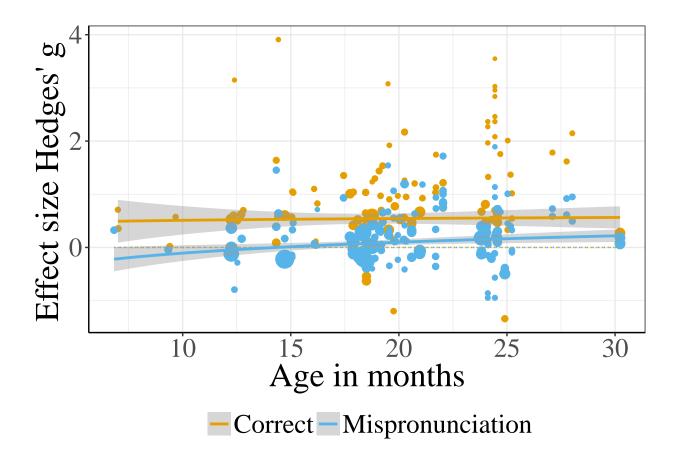
#### Mispronunciation sensitivity

Age moderator effects for mispronunciation sensitivity

```
##
## Multivariate Meta-Analysis Model (k = 251; method: REML)
##
##
      logLik
               Deviance
                                 AIC
                                            BIC
                                                       AICc
   -251.2299
               502.4597
                           514.4597
                                       535.5160
                                                   514.8097
##
##
## Variance Components:
##
## outer factor: short_cite (nlvls = 32)
   inner factor: collapse
                             (nlvls = 52)
##
##
               estim
                         sqrt fixed
  tau^2
              0.1331
                       0.3648
                                   no
              0.7254
##
  rho
                                   no
##
## Test for Residual Heterogeneity:
## QE(df = 247) = 1068.3373, p-val < .0001
## Test of Moderators (coefficient(s) 2,3,4):
  QM(df = 3) = 218.6210, p-val < .0001
##
## Model Results:
##
##
                     estimate
                                           zval
                                                    pval
                                                            ci.lb
                                                                     ci.ub
                                    se
                       0.2935
                                                 <.0001
                                                           0.1666
                                                                   0.4204
## intrcpt
                               0.0648
                                         4.5324
## age.C
                       0.0171
                               0.0113
                                         1.5136
                                                 0.1301
                                                          -0.0051
                                                                   0.0393
                                                 <.0001
  condition
                       0.4984
                               0.0344
                                        14.4930
                                                           0.4310
                                                                   0.5658
   age.C:condition
                       0.0026
                               0.0076
                                         0.3436
                                                 0.7312
                                                          -0.0123
                                                                   0.0175
##
##
                   0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Signif. codes:
```

# Plotting Mispronunciation Sensitivity by Age

This is the plot used in Figure 2. Effect sizes for correct pronunciations (yellow) and mispronunciations (blue) by participant age. Point size is inverse variance. The dashed line indicates zero.



# Supplementary Analyses for Discussion

This section includes supplementary analyses discussed in the Discussion section

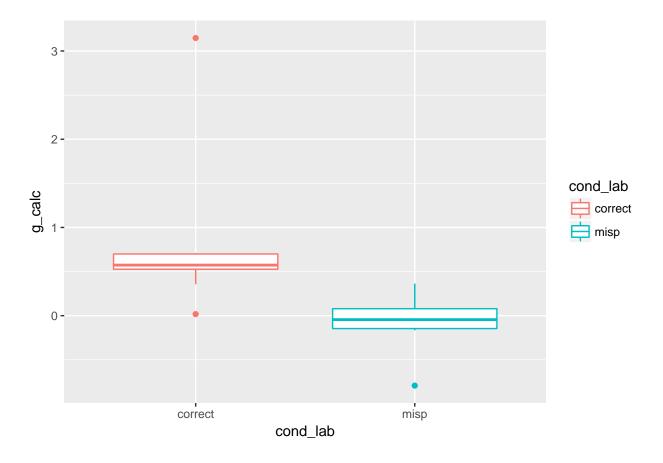
#### Vocabulary Data Available

This table summarizes which papers also measured vocabulary in the infants they tested.

has_vocab	count
comprehension & production	5
just comprehension	1
just production	1
none	25

### Mispronunciation Sensitivity at Youngest Ages

Mispronunciation sensitivity in the papers in our dataset with the youngest ages (< 12-months-of-age; Bergelson & Swingley, 2017; Mani & Plunkett, 2007; Zesiger et al., 2012).



#### Known vs Novel Distractor Images

This table summarizes which papers used a known or novel distractor image.

object_pair	count
familiar familiar	23
familiar_novel	10

#### Does distractor familiarity (known vs. novel) impact mispronunciation sensitivity?

Preliminary moderator test examining the influence of distractor familiarity on mispronunciation sensitivity

```
##
## Multivariate Meta-Analysis Model (k = 251; method: REML)
##
      logLik
                                AIC
                                           BIC
                                                     AICc
##
               Deviance
   -250.6056
               501.2111
                          513.2111
                                      534.2675
                                                 513.5611
##
## Variance Components:
##
## outer factor: short_cite (nlvls = 32)
## inner factor: collapse
                             (nlvls = 52)
##
##
               estim
                        sqrt fixed
```

```
## tau^2
              0.1410 0.3754
                                no
## rho
              0.7375
                                nο
##
## Test for Residual Heterogeneity:
## QE(df = 247) = 1085.1211, p-val < .0001
##
## Test of Moderators (coefficient(s) 2,3,4):
## QM(df = 3) = 219.4592, p-val < .0001
##
## Model Results:
##
##
                                                   estimate
                                                                       zval
                                                                se
## intrcpt
                                                    0.3230 0.0757
                                                                     4.2641
## condition
                                                    0.4629 0.0384 12.0679
## as.factor(object_pair)familiar_novel
                                                   -0.1523 0.1300 -1.1711
## condition:as.factor(object_pair)familiar_novel
                                                    0.1411 0.0806
                                                                     1.7510
##
                                                            ci.lb
                                                                    ci.ub
                                                    pval
## intrcpt
                                                   <.0001
                                                            0.1745 0.4714
## condition
                                                   <.0001
                                                          0.3877 0.5381
## as.factor(object_pair)familiar_novel
                                                   0.2416 -0.4072 0.1026
## condition:as.factor(object_pair)familiar_novel 0.0799 -0.0168 0.2991
## intrcpt
                                                   ***
## condition
                                                   ***
## as.factor(object_pair)familiar_novel
## condition:as.factor(object_pair)familiar_novel
##
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
```

## Plotting Influence of Distractor Familiarity

