

EVIDENCE FOR A LEARNING BIAS  
AGAINST “SALTATORY”  
PHONOLOGICAL ALTERNATIONS IN  
ARTIFICIAL LANGUAGE LEARNING

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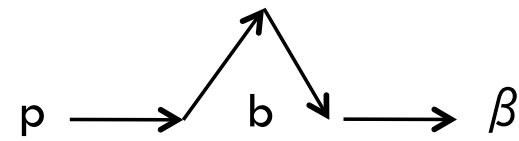
# Saltatory phonological alternations

2

- **Saltatory alternation** = alternation in which an intervening sound is “jumped over”
- **Example** from Campidanian Sardinian<sup>1</sup>:
  - $p \rightarrow \beta$  /  $V$ \_\_\_\_, but b remains unchanged

/p̩ani/ → [s:u βãi] ‘the bread’

/b̩inu/ → [s:u bĩu] ‘the wine’



- This is a productive process that occurs at the other places of articulation as well.



# Research question

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- Thus, saltatory alternations are possible, but cross-linguistically rare (at least relative to non-saltatory ones).
- **Question:** Do learners have a **bias** against learning saltatory alternations?
  - I will present 4 artificial language experiments with interesting results indicating that they do.

# Overview (Experiments 1-4)

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- Artificial language learning ( $n = 20$  for all experiments)
- **Basic design strategy:** Withhold certain information during exposure (**ambiguous input**), then test on the withheld cases to see which assumptions participants make<sup>1</sup>
- Same basic method for Exp 1-4, but types of items in training varies
- 3 phases:
  - Exposure
  - Verification of learning
  - Generalization

1. E.g., see Wilson, 2006; Finley, 2008; and others

# Experiment 1 - Method

6

- Artificial language learning (Auditory)
- **Exposure phase:** Train on  $p \rightarrow v, t \rightarrow \delta / v\_v$

# Experiment 1

7

- Artificial language learning (Auditory)
- **Exposure phase:** Train on  $p \rightarrow v, t \rightarrow \delta / v\_v$



# Experiment 1

8

- Artificial language learning (Auditory)
- **Exposure phase:** Train on  $p \rightarrow v, t \rightarrow \delta / v\_v$



“lanap”



# Experiment 1

9

- Artificial language learning (Auditory)
- **Exposure phase:** Train on  $p \rightarrow v, t \rightarrow \delta / v\_v$



# Experiment 1

10

- Artificial language learning (Auditory)
- **Exposure phase:** Train on  $p \rightarrow v, t \rightarrow \delta / v\_v$



“lanavi”

# Experiment 1

11

- **Exposure phase:** Train on  $p \rightarrow v, t \rightarrow \delta / V\_V$ 
  - All singular words are CVCVC, sound inventory drawn from a subset of English phonemes
  - 36 changing items ending in /p/ or /t/
    - lanap ~ lanavi (18 of this type)
    - bunat ~ bunađi (18 of this type)
  - 36 non-changing Filler items
    - Ending in /m, n, l, r, s, Ń/
    - Example: kasam ~ kasami
  - Crucially, **no words** ending in intervening /b, d, f, 0 /

# Experiment 1

12

- **Verification phase:** Did they learn the pattern?
- **Task:** Hear a previously heard singular form and choose the correct plural form
  - ▣ 2-alternative forced choice test → Choose between two options: **changing** and **non-changing**.
  - ▣ 32 words from Exposure phase (8 p, 8 t, 16 fillers)
  - ▣ Must get at least 80% to move on – so that I know they have learned the pattern

# Experiment 1

13

- **Verification phase:** Did they learn the pattern?
- **Task:** Hear a previously heard singular form and choose the correct plural form



# Experiment 1

14

- **Verification phase:** Did they learn the pattern?
- **Task:** Hear a previously heard singular form and choose the correct plural form



“lanap”

# Experiment 1

15

- **Verification phase:** Did they learn the pattern?
- **Task:** Hear a previously heard singular form and choose the correct plural form



# Experiment 1

16

- **Verification phase:** Did they learn the pattern?
- **Task:** Hear a previously heard singular form and choose the correct plural form



“lanapi”...“lanavi”

????????????????



# Experiment 1

17

- **Verification phase:** Did they learn the pattern?
- **Task:** Hear a previously heard singular form and choose the correct plural form

Note: Changing option for fillers:  
/m, r, ʃ/ → v (kasami ... kasavi)  
/n, l, s/ → ð



“lanapi”...“lanavi”

????????????????

# Experiment 1 - Method

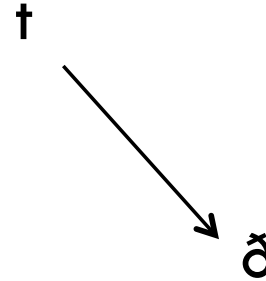
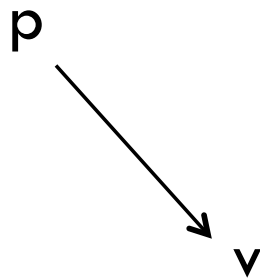
18

- **Generalization phase:** Same task as verification phase, but with **novel words**.
  - 24 words ending in /p, t/
  - 24 fillers
  - But **crucially** also 24 words ending in the untrained, intervening sounds /b, d, f, θ /

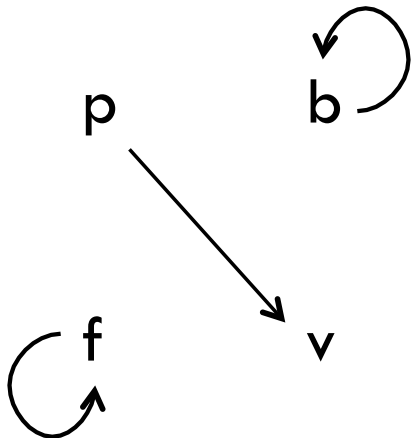
# Experiment 1

19

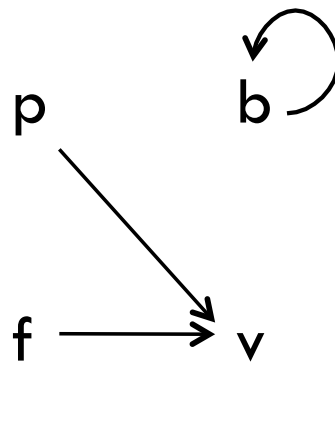
Input:



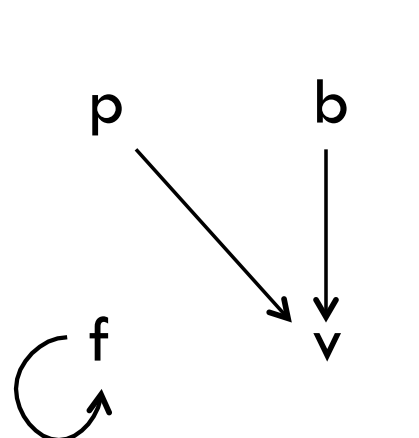
Possible interpretations of input: (Coronals analogous)



Saltatory



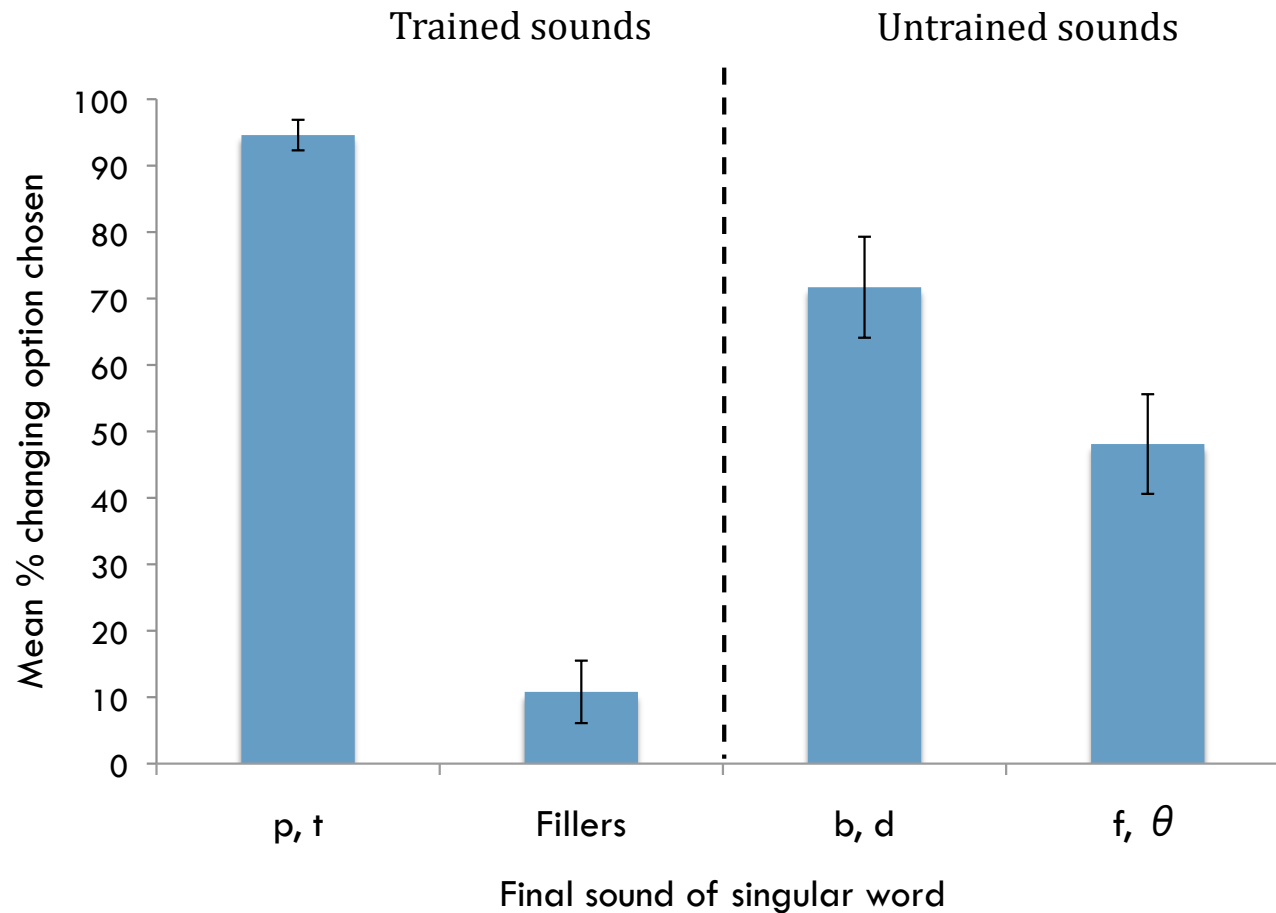
Partially saltatory



Non-saltatory

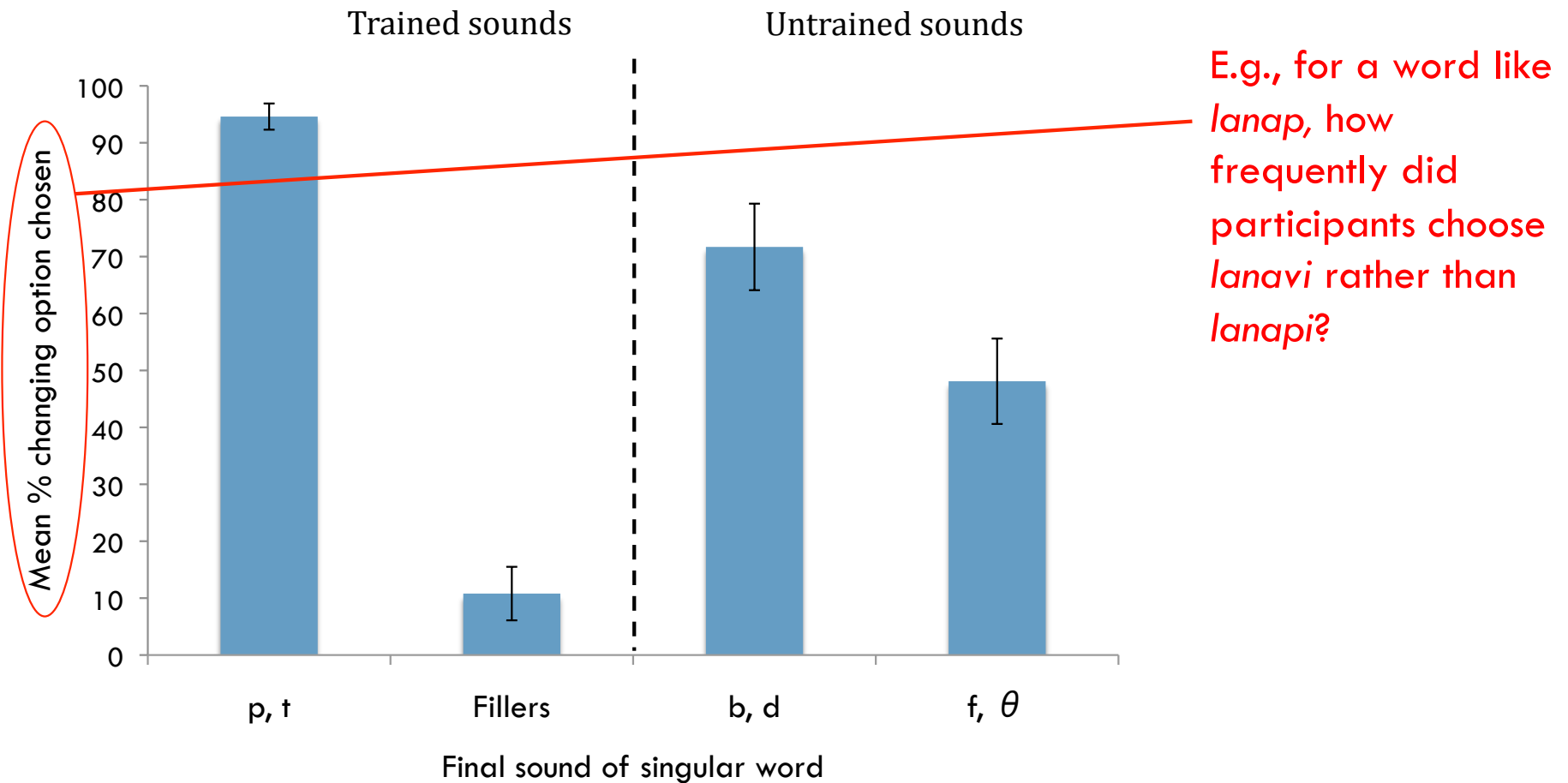
# Experiment 1 – Results (all words are novel)

20



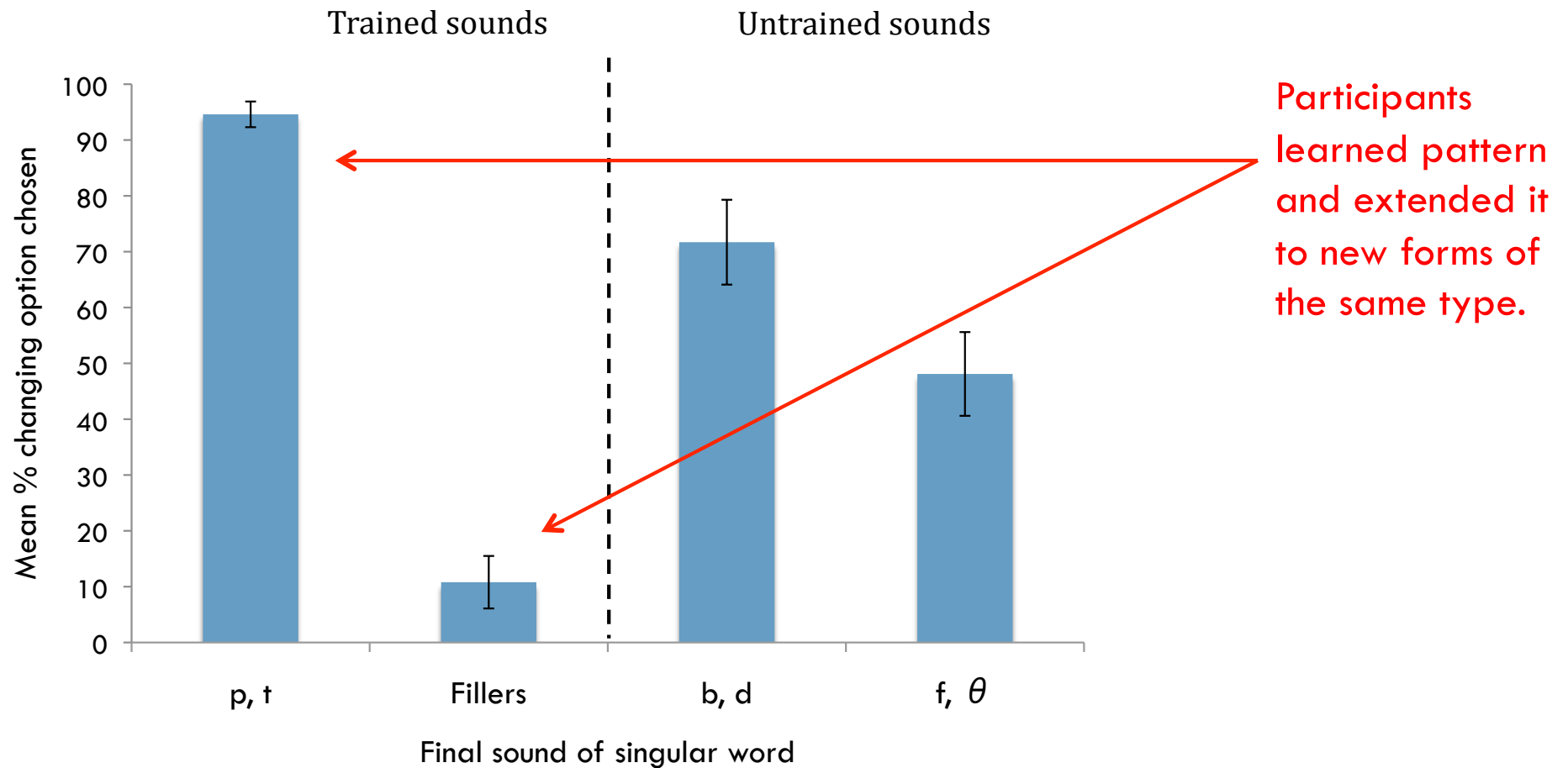
# Experiment 1 – Results (all words are novel)

21



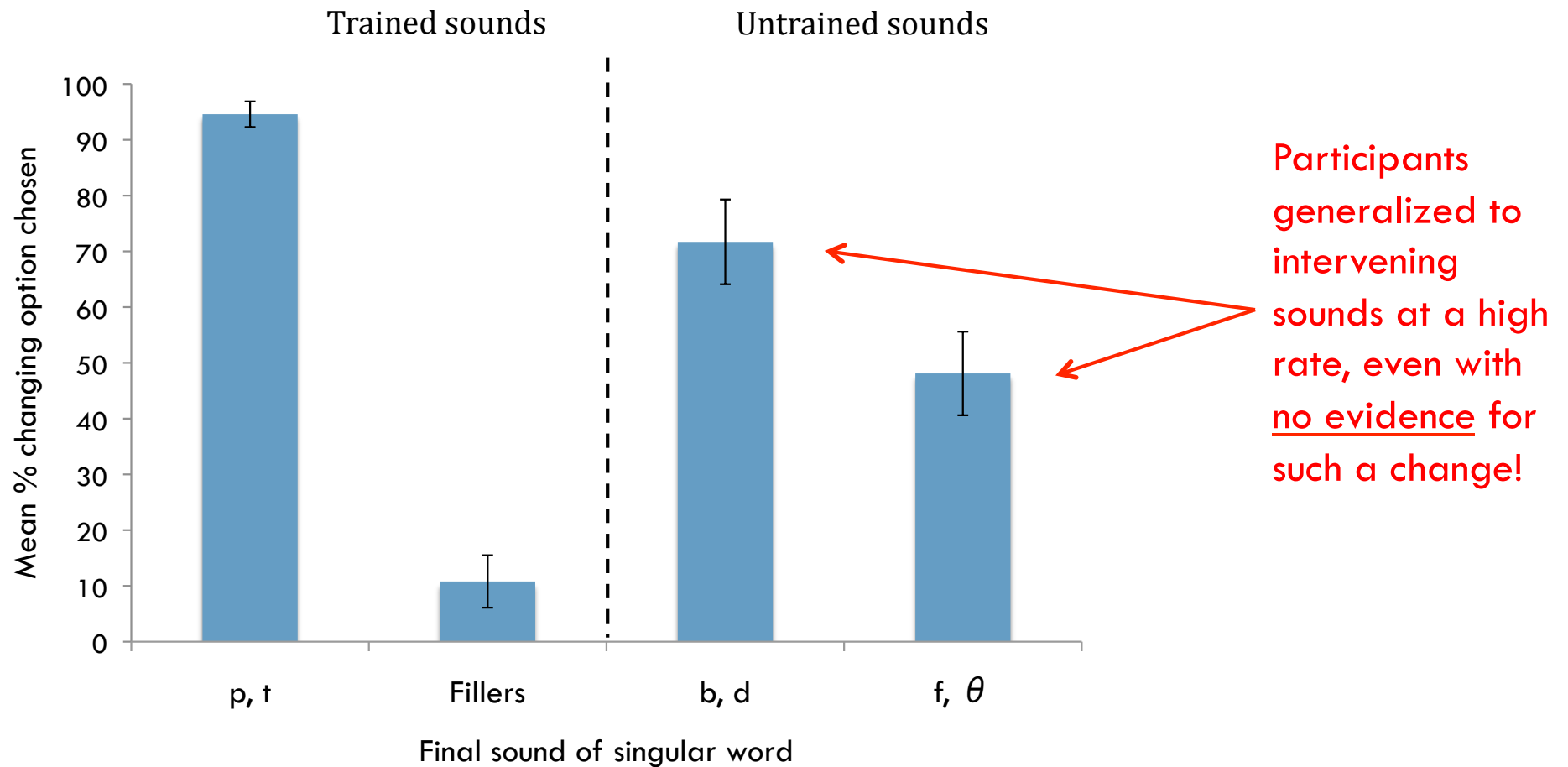
# Experiment 1 – Results (all words are novel)

22



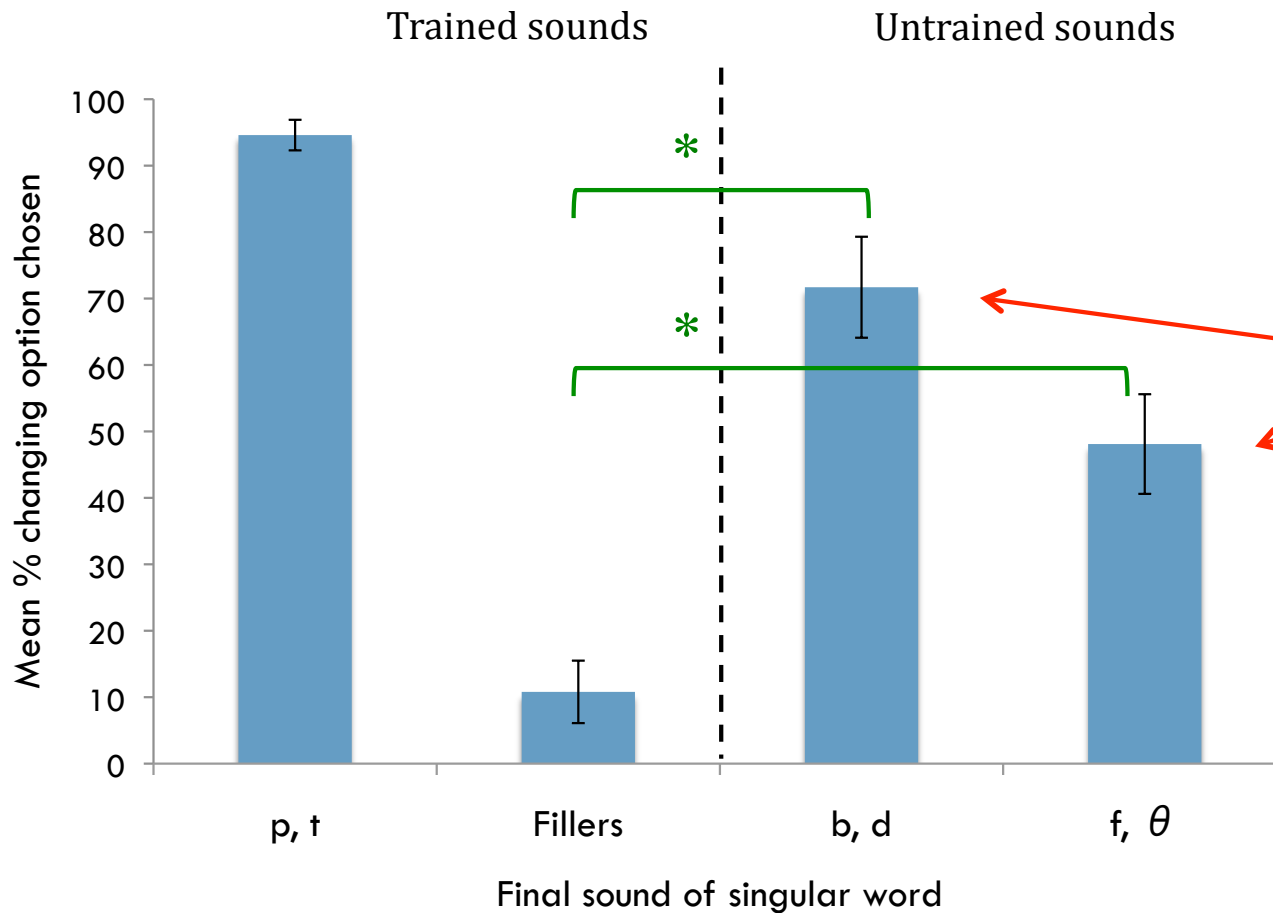
# Experiment 1 – Results (all words are novel)

23



# Experiment 1 – Results (all words are novel)

24

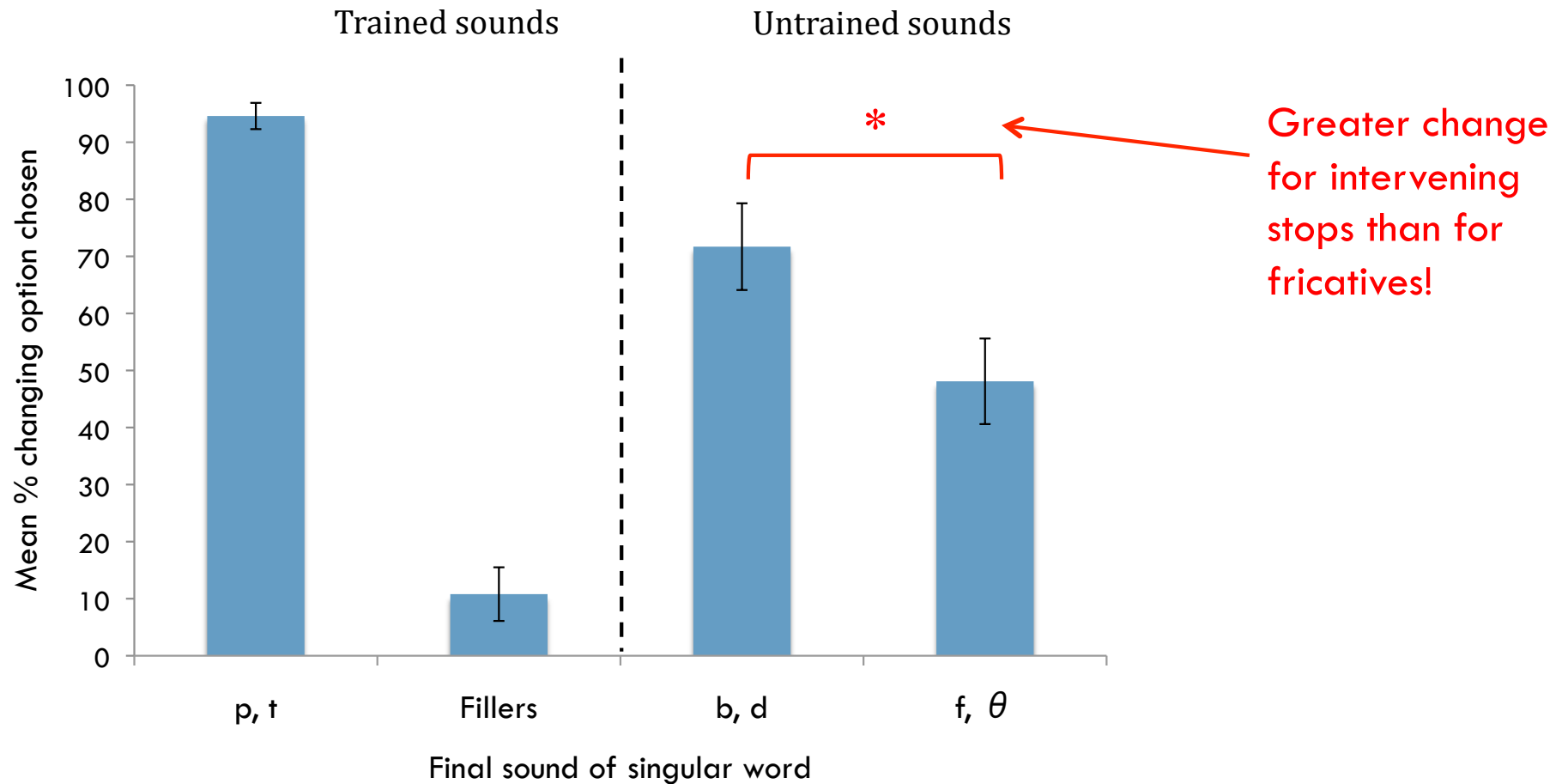


Participants generalized to intervening sounds at a high rate, even with no evidence for such a change.



# Experiment 1 – Results (all words are novel)

25



# Observations so far

26

- Given ambiguous input, learners generalize to make learned alternations non-saltatory.
- There is a preference towards changing voiced stops more than voiceless fricatives.
  - ▣ Binary abstract features cannot account for this difference
  - ▣ Perhaps perceptual similarity is important

	Sounds	Confusability/ Similarity
Labials	b ~ v	.153
	f ~ v	.039
Coronals	d ~ ð	.103
	θ ~ ð	.029

# Observations so far

27

- Given ambiguous input, learners generalize to make learned alternations non-saltatory.
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	Sounds	Confusability/ Similarity	
Labials	b ~ v	.153	→ = avg. of (rate that b is mistaken for v and rate that v is mistaken for b) (from confusion matrix data <sup>1</sup> )
	f ~ v	.039	
Coronals	d ~ ð	.103	
	θ ~ ð	.029	

# Observations so far

28

- Given ambiguous input, learners generalize to make learned alternations non-saltatory.
- There is a preference towards changing voiced stops more than voiceless fricatives.
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	Sounds	Confusability/ Similarity
Labials	b ~ v	.153
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	θ ~ ð	.029

Indeed, voiced stops [b, d] are more confusable with voiced fricative targets [v, ð] than voiceless fricatives [f, θ].

# Two alternate explanations

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- They just learned a more general rule: all stops become voiced fricatives between vowels
  
- Product-oriented responses:<sup>1</sup> large number of [-vi] and [-ð̥i] plural endings resulted in a bias towards choosing those endings for new cases
  - 1/2 of the plurals ended in [-vi] or [-ð̥i]
  - 1/12 ended in each of [-mi], [-ni], [-li], [-ri], [-si], [-ʃi]

# Experiment 2 - Control

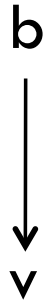
30

- Train on  $b \rightarrow v$  and  $d \rightarrow \delta$ , withhold  $p, t, f, \theta$ .
- Designed to address alternate explanations:
  - ▣ If learning a more general rule or responding based on product-oriented schema, then **effect should remain**.
  - ▣ If it is really something about the **intervening sound**, then the **effect should be greatly reduced**.

# Experiment 2 - Control

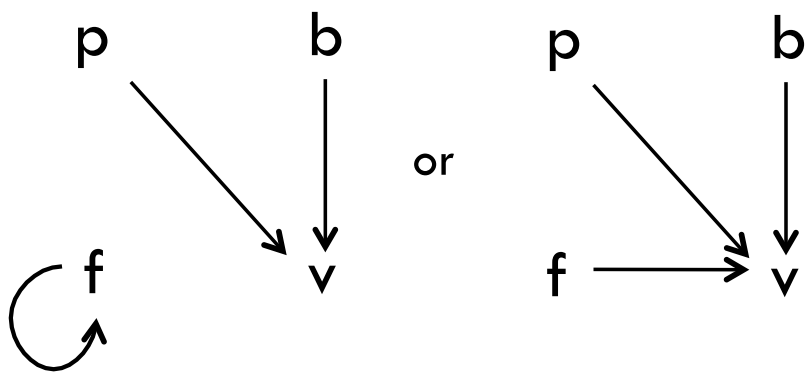
31

Input:

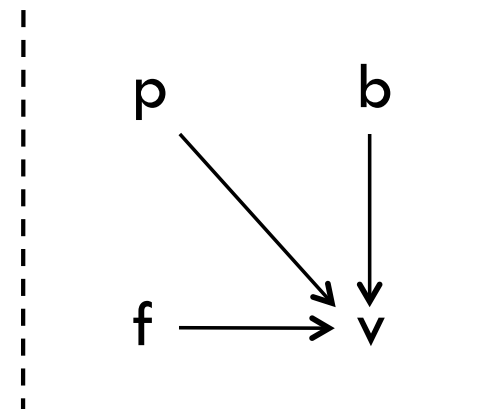


Expected behavior:

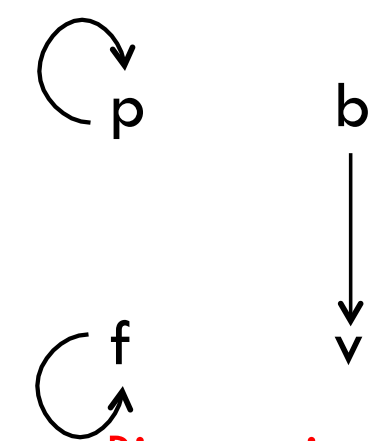
(Coronals analogous)



More general rule  
(Similar to Exp 1)



Product-oriented  
responses  
(Similar to Exp 1)



Bias against  
saltations  
(Different from Exp 1)

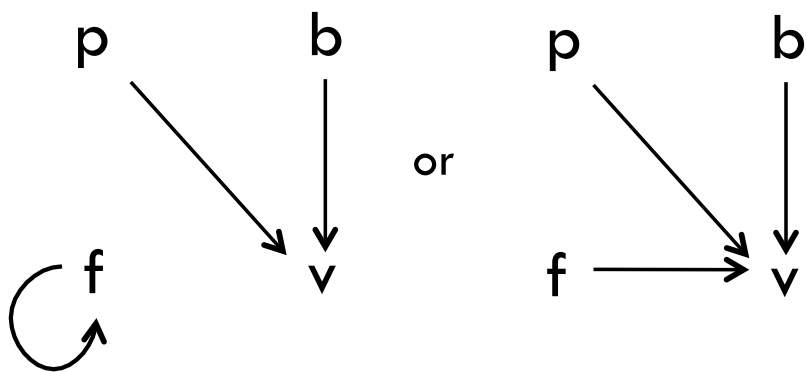
# Experiment 2 - Control

32

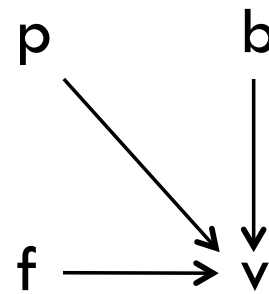
Input:



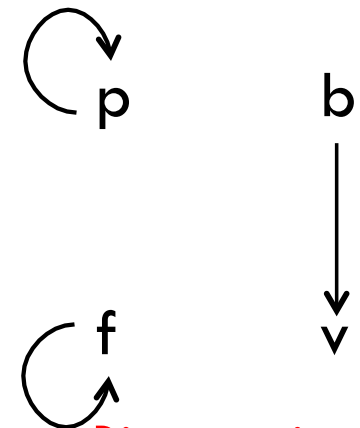
Expected behavior:



More general rule  
(Similar to Exp 1)



Product-oriented  
responses  
(Similar to Exp 1)



Bias against  
saltations  
(Different from Exp 1)

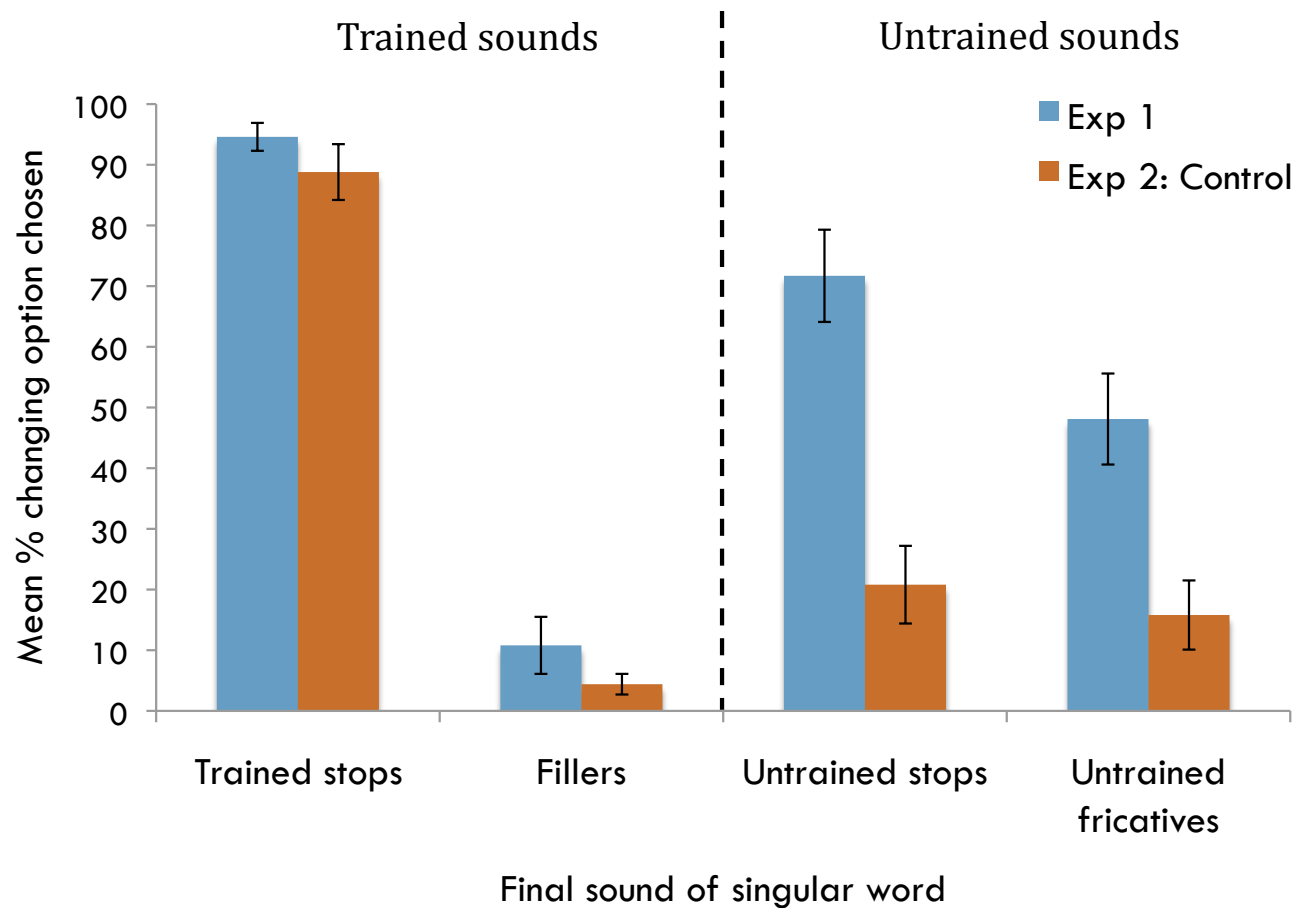
Little generalization  
to other sounds





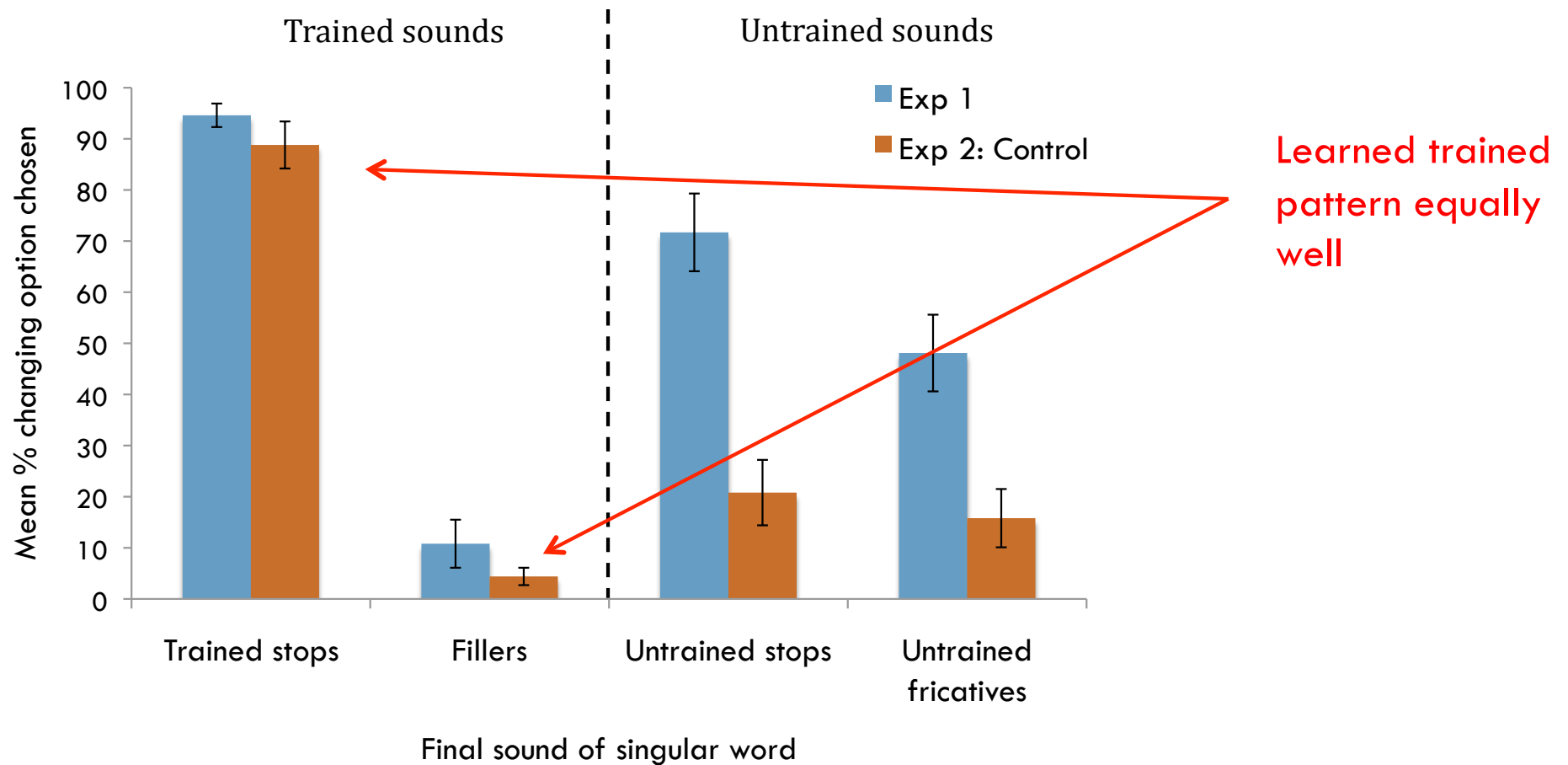
# Experiment 2 – Results

33



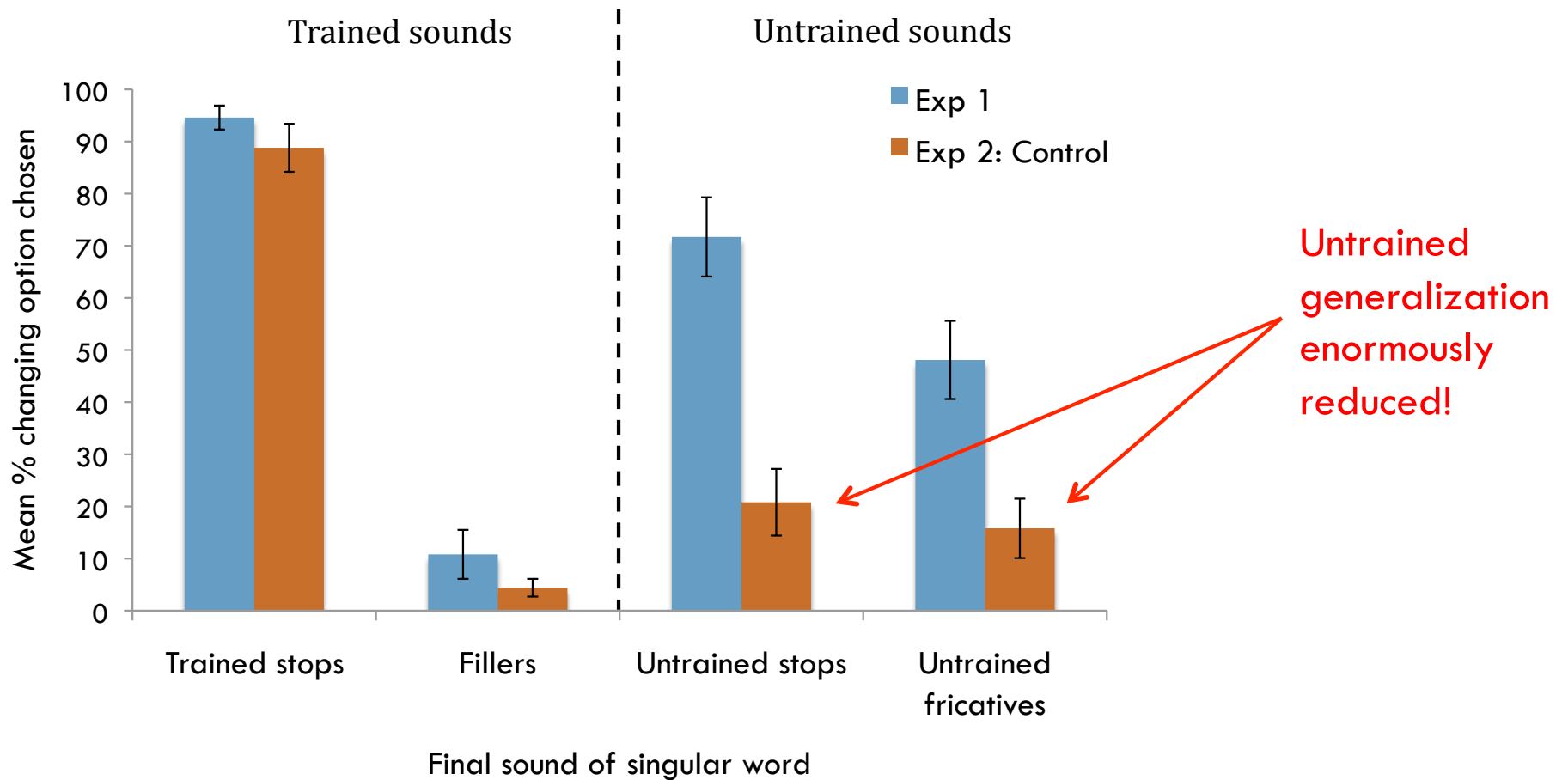
# Experiment 2 – Results

34



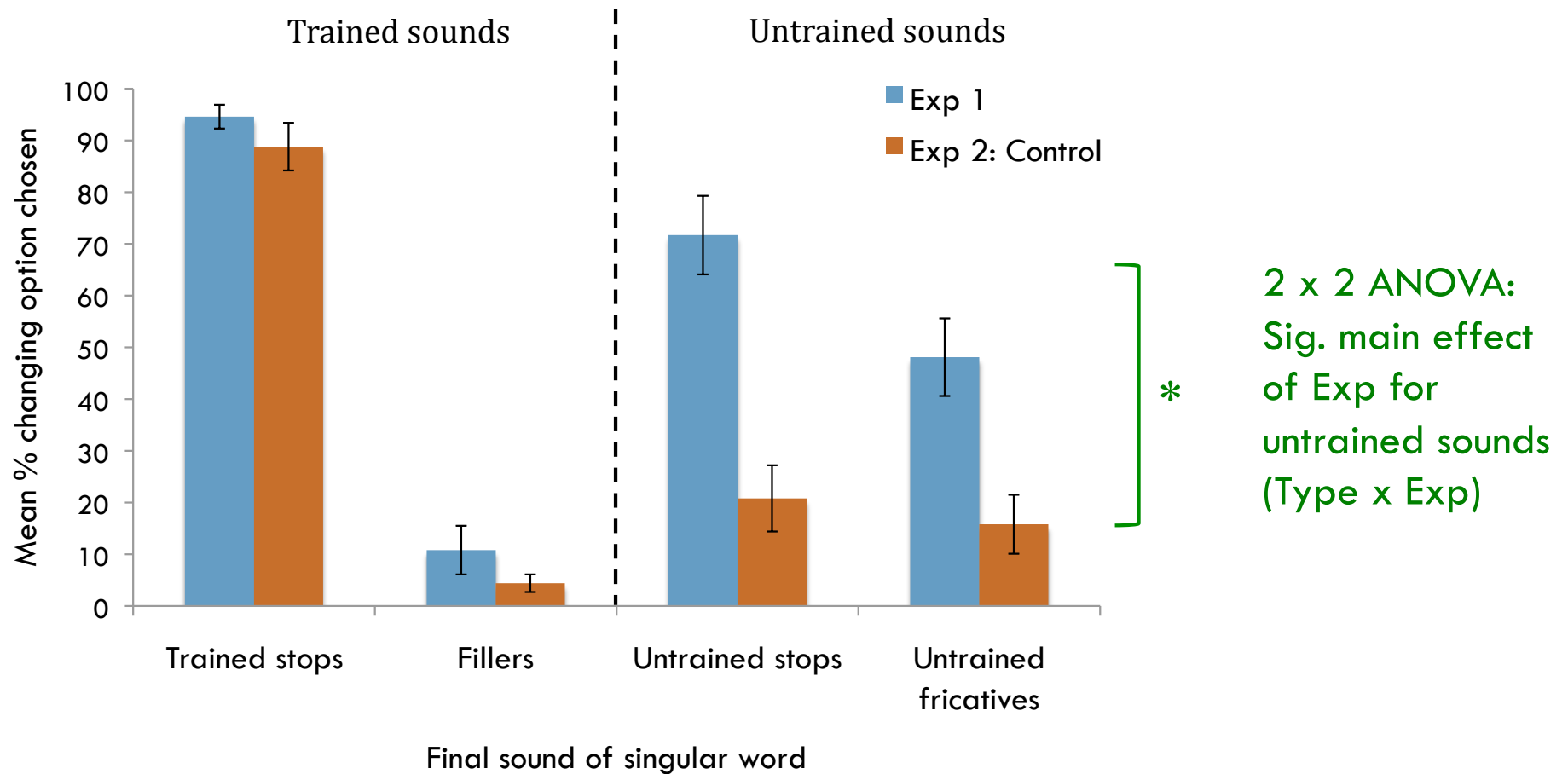
# Experiment 2 – Results

35



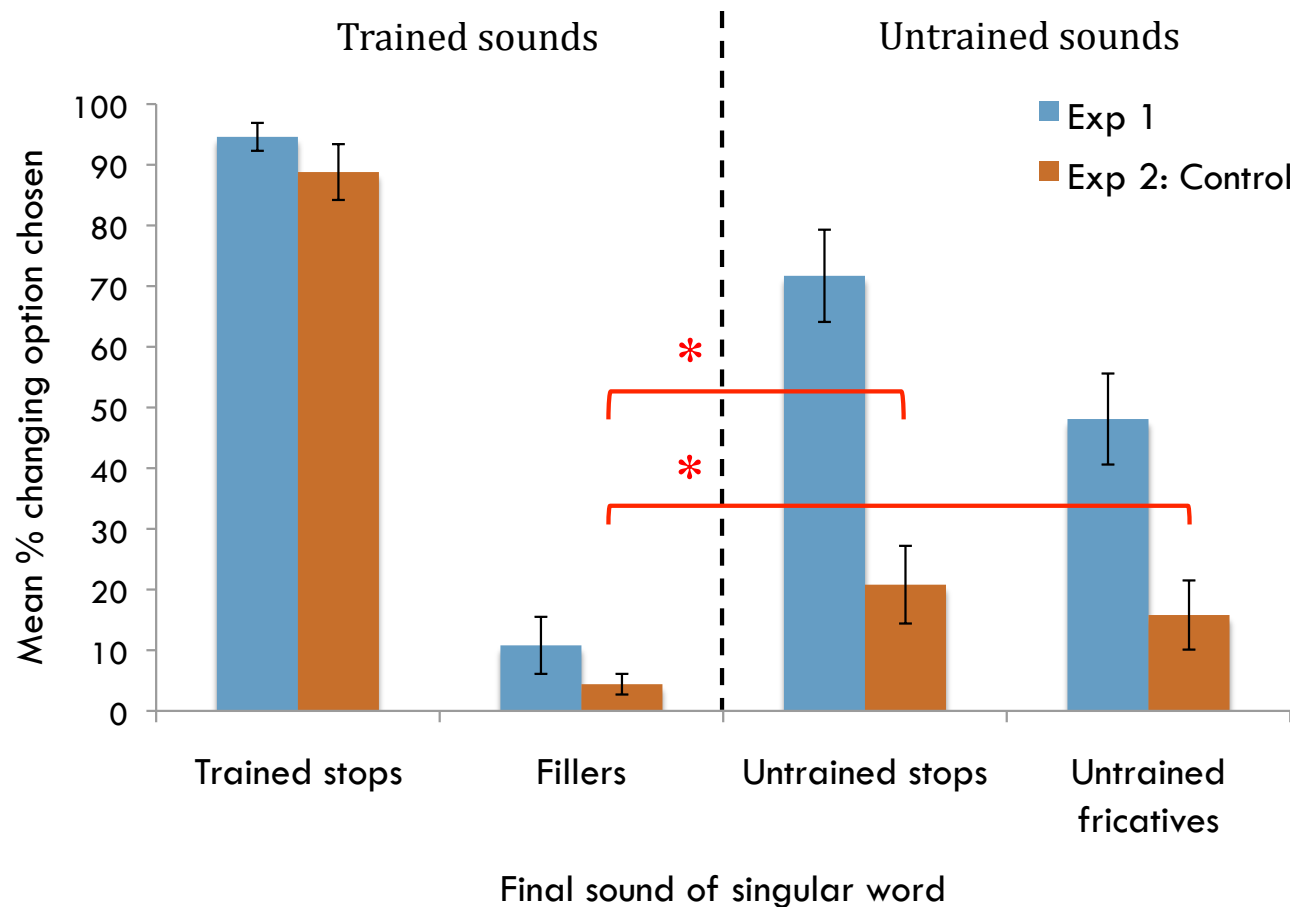
# Experiment 2 – Results

36



# Experiment 2 – Results

37



Still sig.  
different than  
trained fillers  
→ can think of  
this as the basic  
effect of being  
trained vs.  
untrained

# Observations so far

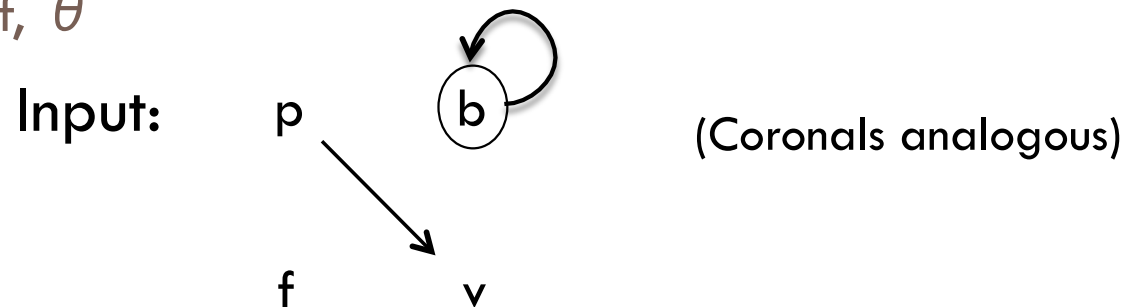
38

- Given ambiguous input, learners generalize to make learned alternations non-saltatory.
  - ▣ This effect cannot be explained by participants learning a general rule or by product-oriented responses.
- There is a preference towards changing voiced stops more than voiceless fricatives.
  - ▣ Binary abstract features cannot account for this difference
  - ▣ Perhaps perceptual similarity is important

# Experiment 3 – Blocked stops

39

- Train participants on  $p \rightarrow v$  and  $t \rightarrow \delta$ , but also that **b and d do not change**
- In training:
  - 18  $p \rightarrow v$
  - 18  $t \rightarrow \delta$
  - 18 non-changing b, d (9 of each)
  - 18 non-changing fillers
  - Nothing about f,  $\theta$



# Experiment 3 – Blocked stops

40

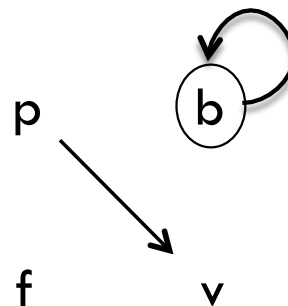
- Train participants on  $p \rightarrow v$  and  $t \rightarrow \delta$ , but also that  $b$  and  $d$  do not change

- In training:

- 18  $p \rightarrow v$
- 18  $t \rightarrow \delta$
- 18 non-changing  $b, d$  (9 of each)
- 18 non-changing fillers
- Nothing about  $f, \theta$

Equal # of non-changing fillers and non-changing  $b, d$

Input:



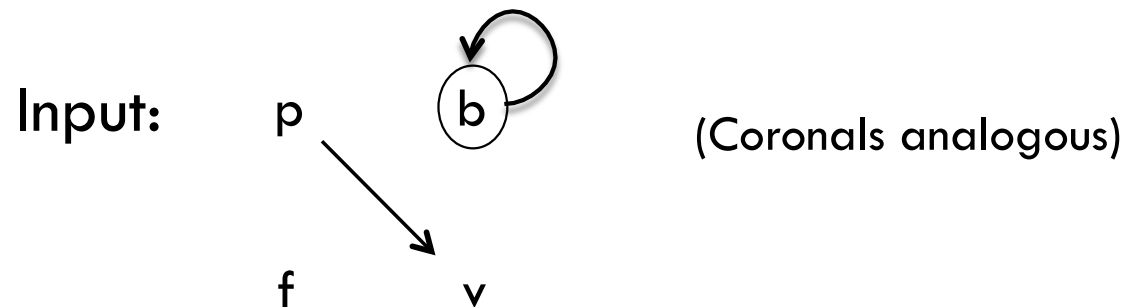
(Coronals analogous)



# Experiment 3 – Blocked stops

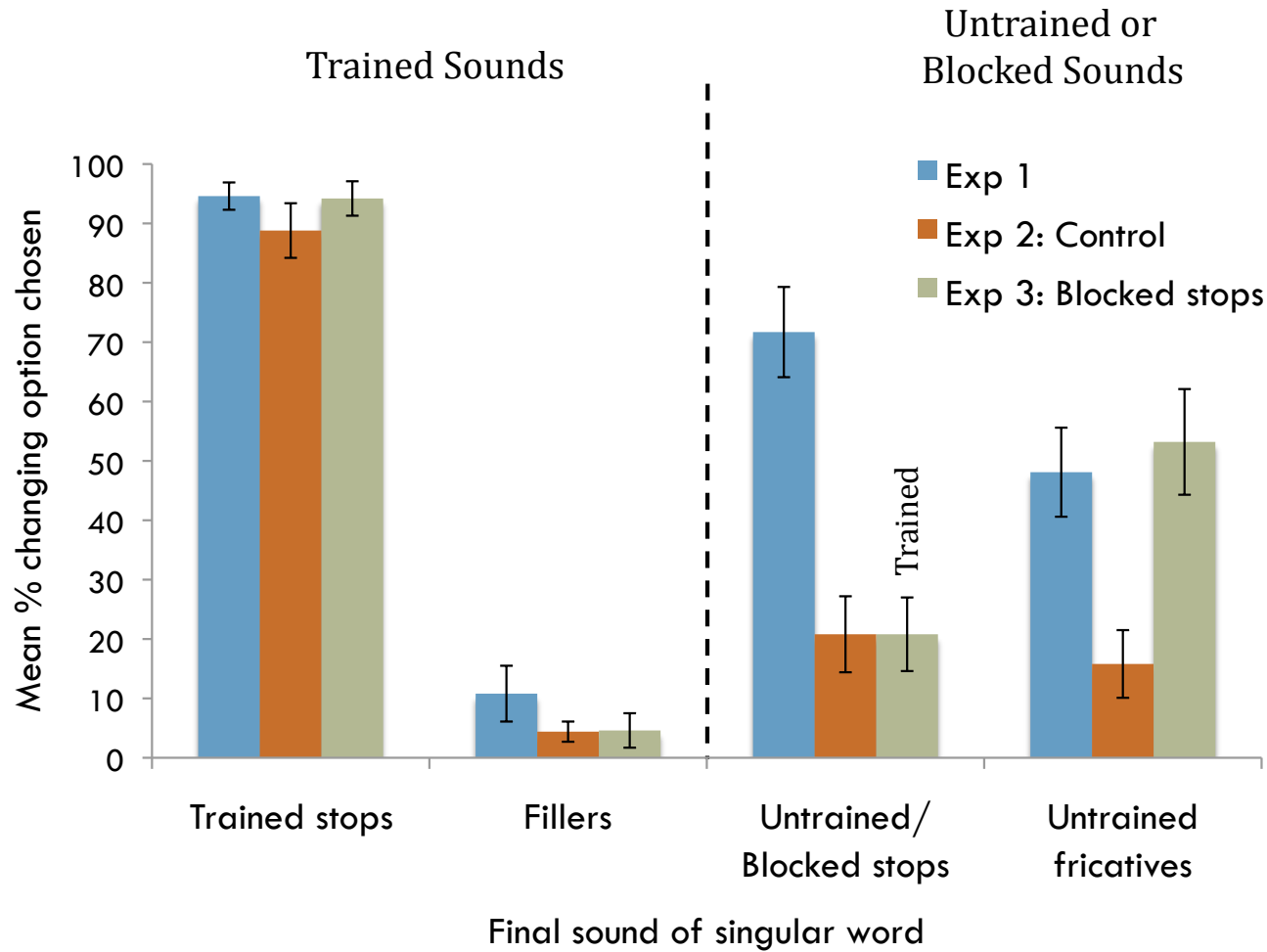
41

- Prediction: If there is bias against saltatory alternations
  - ▣ % changing option for fricatives /f, θ / should remain high



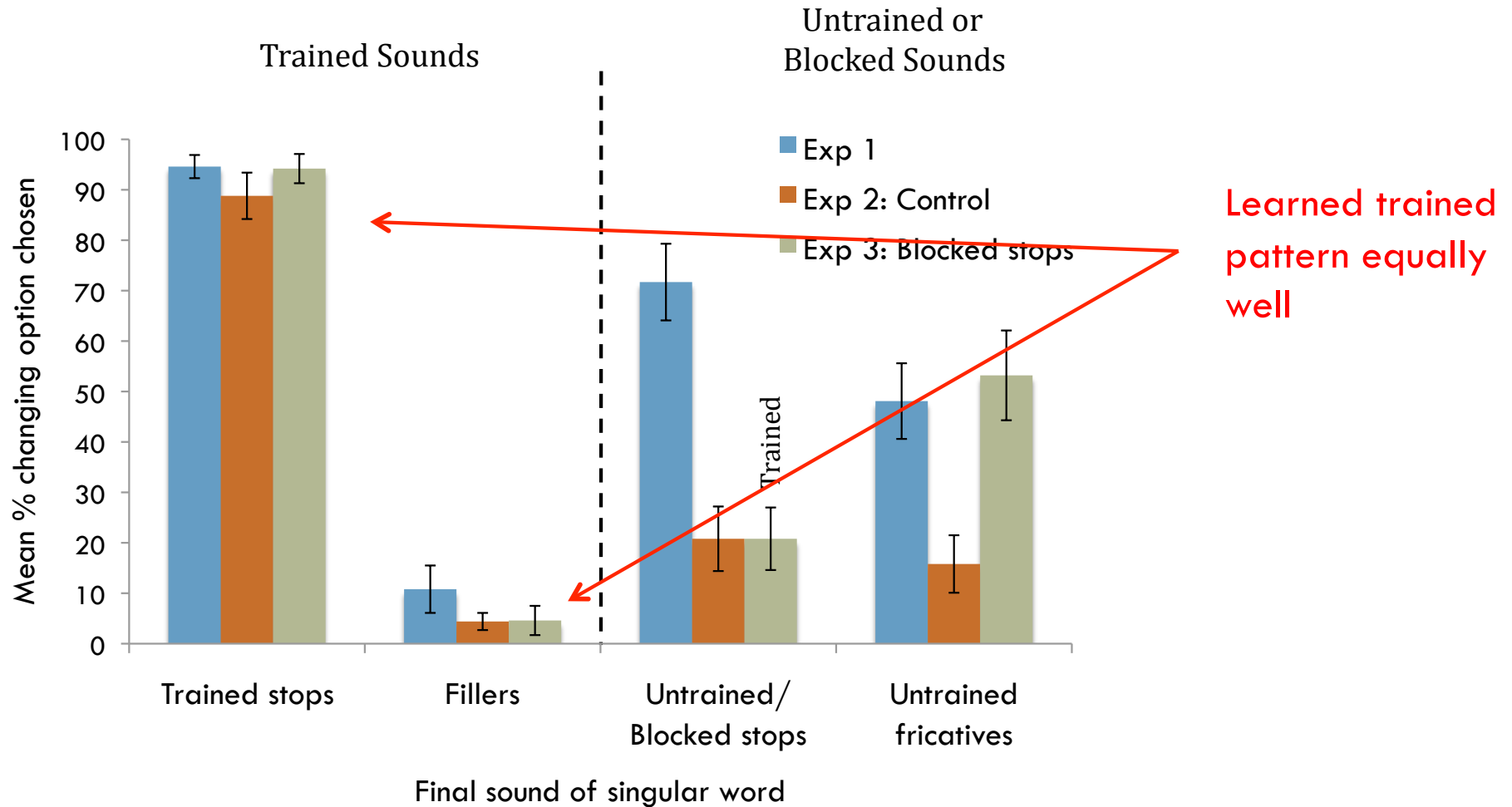
# Experiment 3 – Results

42

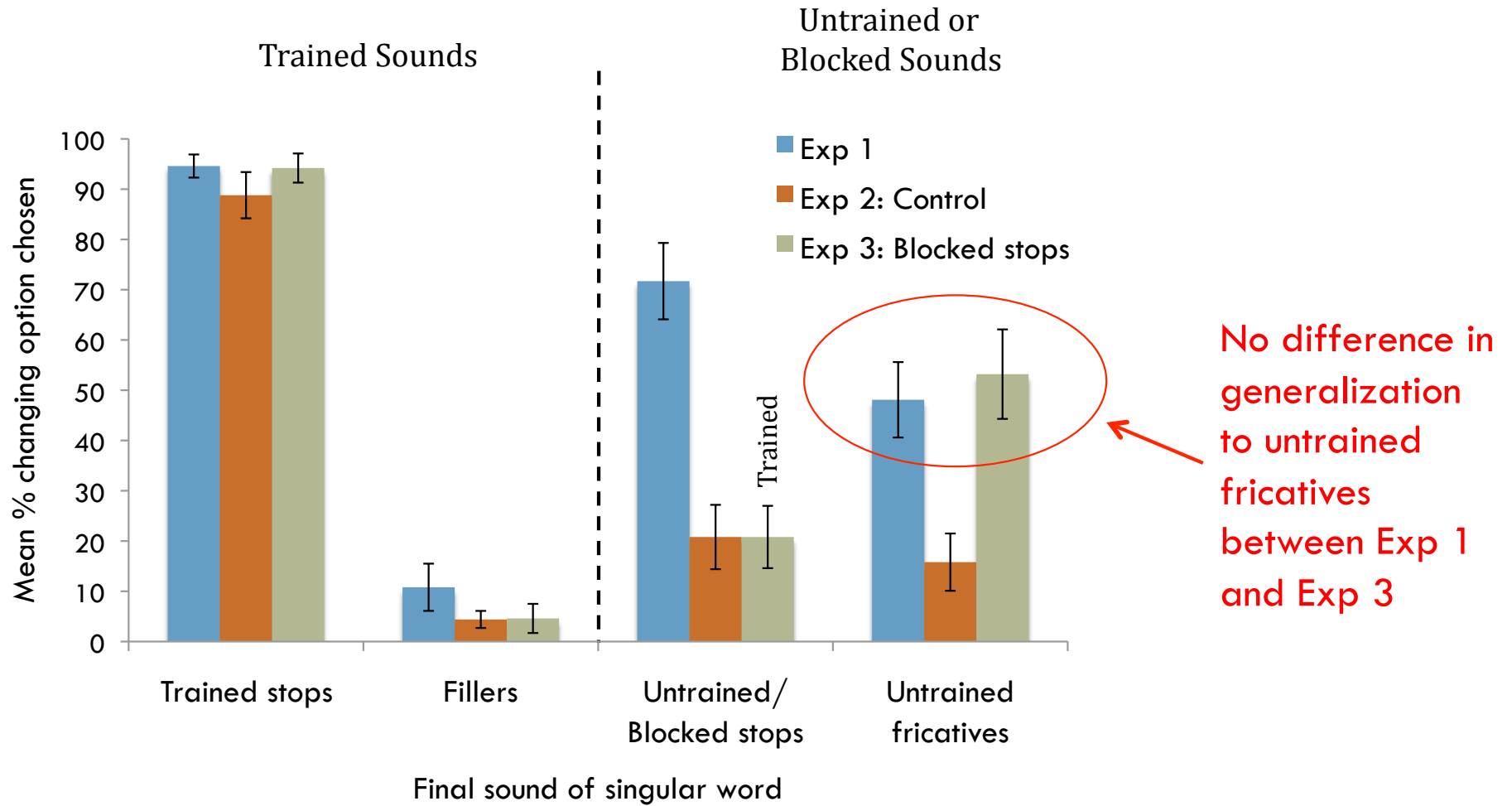


# Experiment 3 – Results

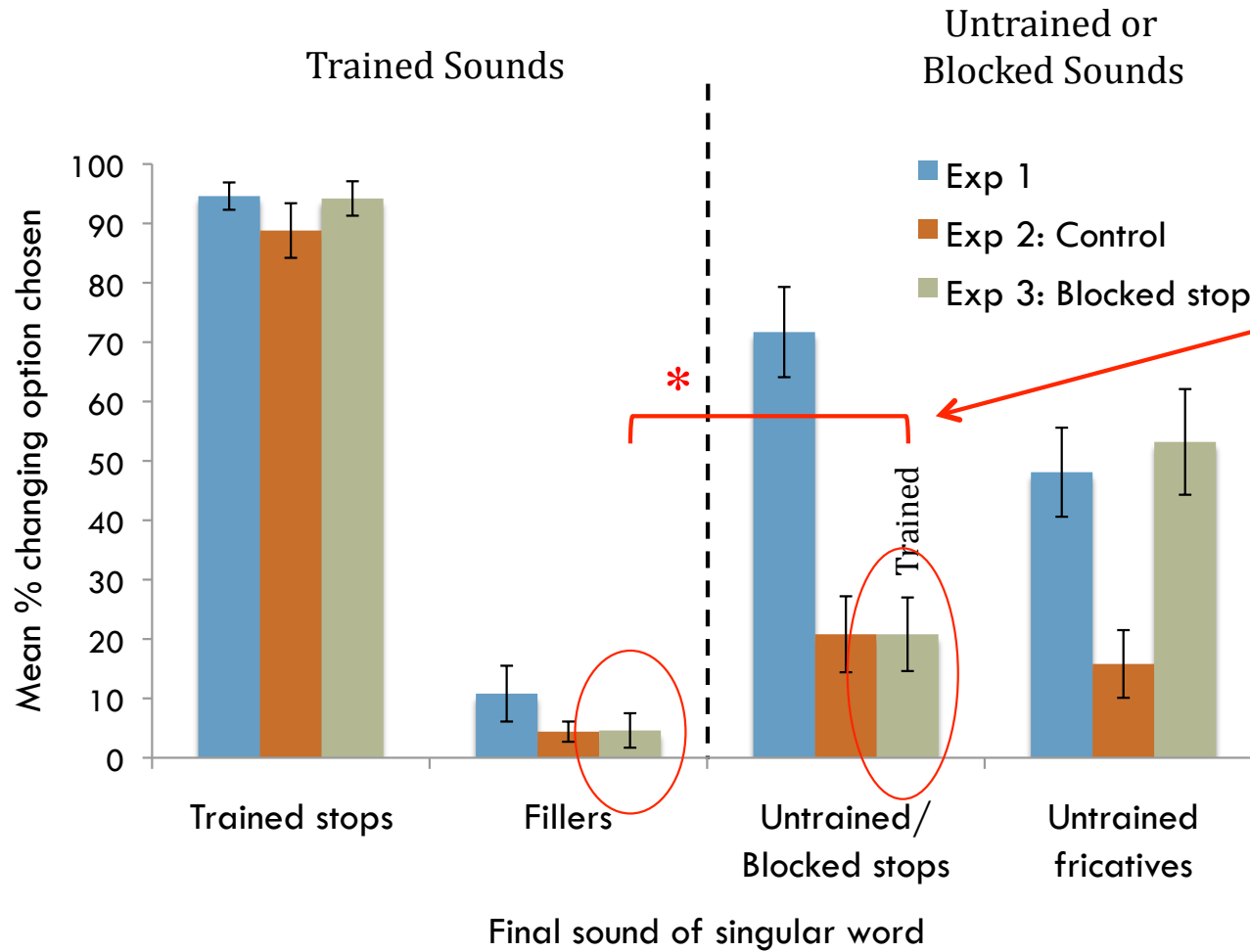
43



# Experiment 3 – Results

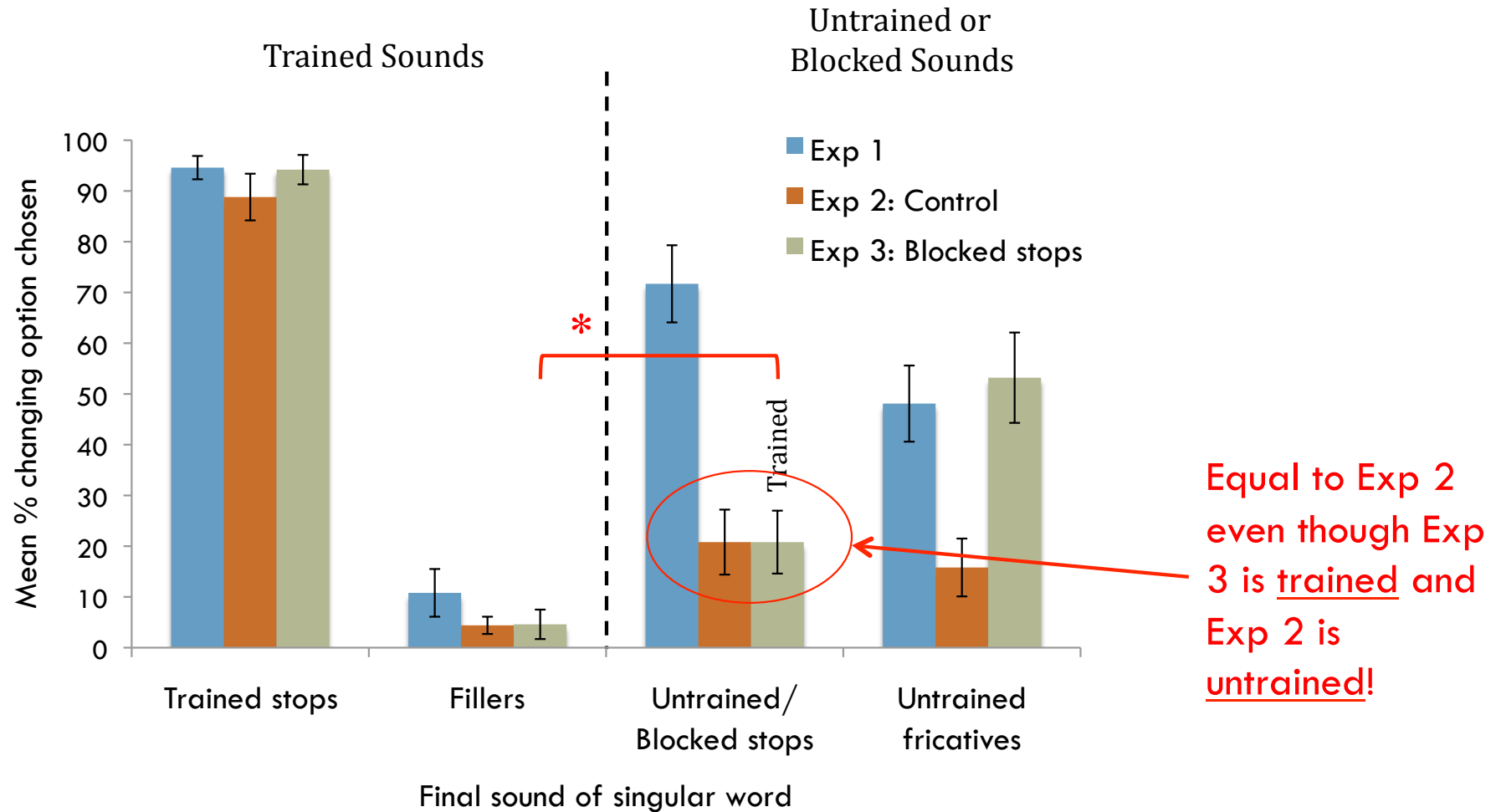


# Experiment 3 – Results



**Sig. more mistakes on blocked stops than on fillers despite being trained to not change stops!**

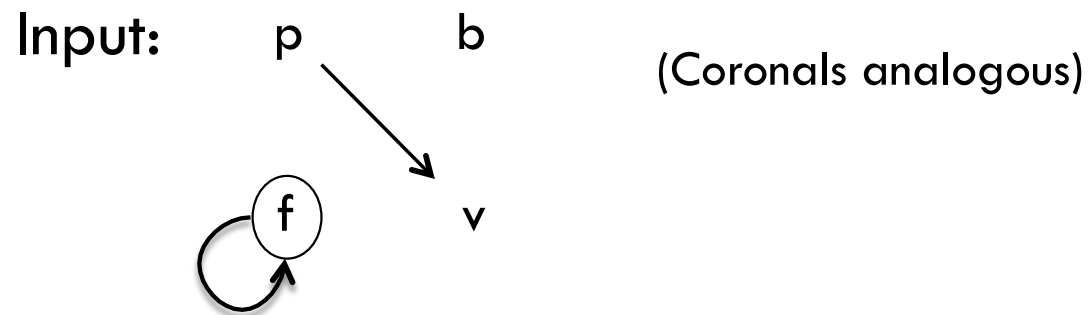
# Experiment 3 – Results



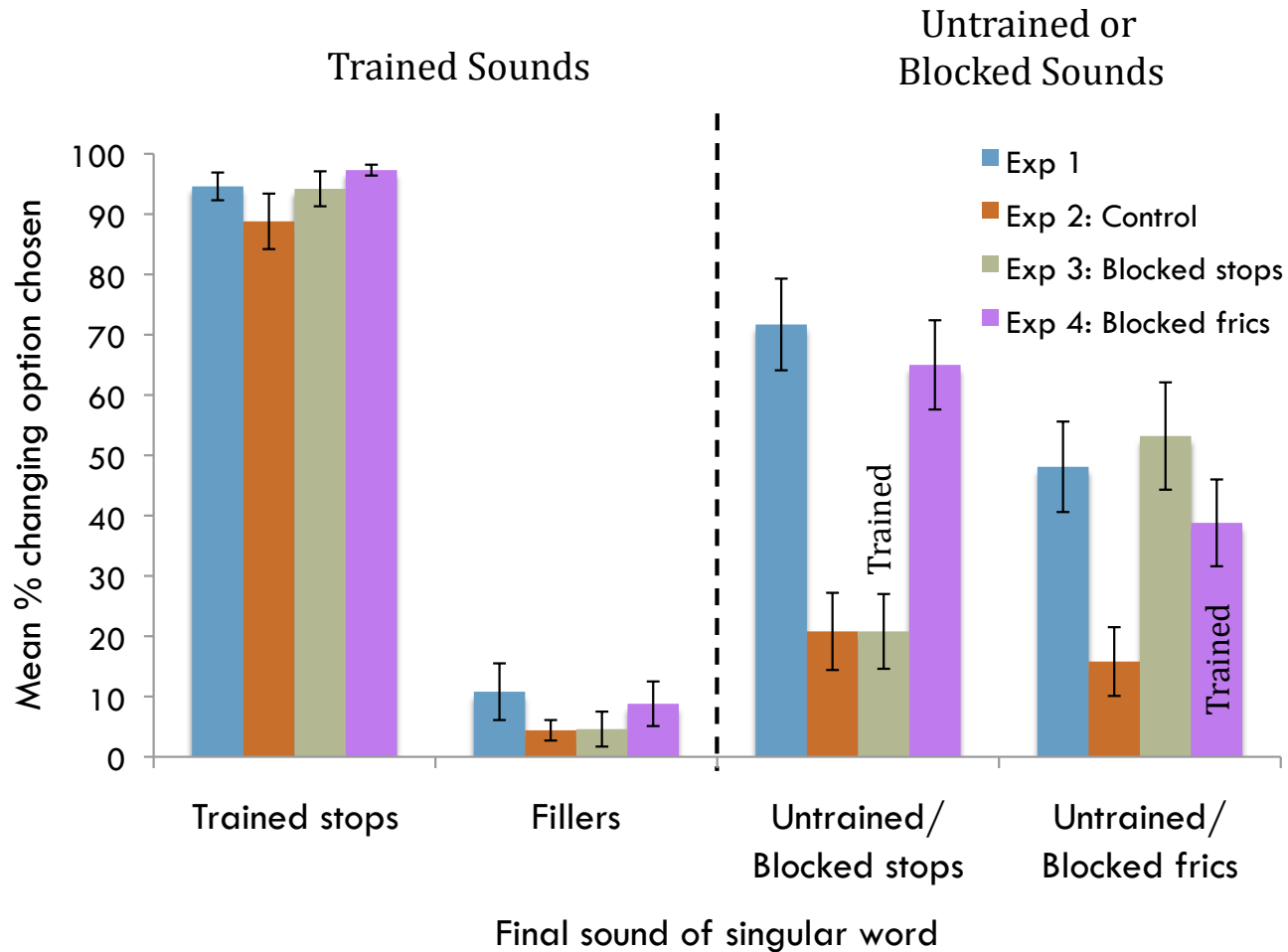
# Experiment 4 – Blocked Fricatives

47

- Same as Exp 3, but the fricatives are blocked instead of the stops
- Will we see the same pattern?



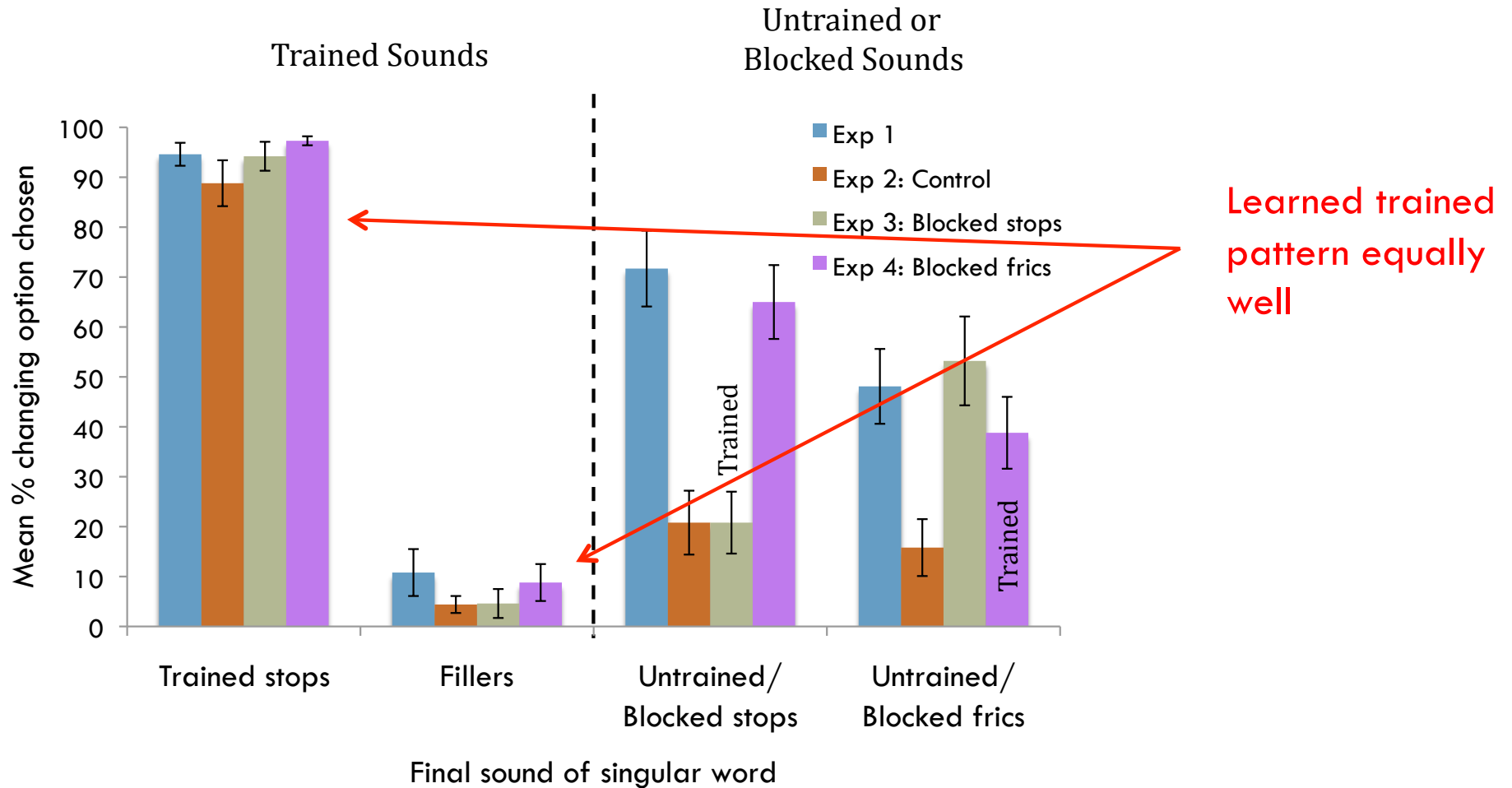
# Experiment 4 – Results





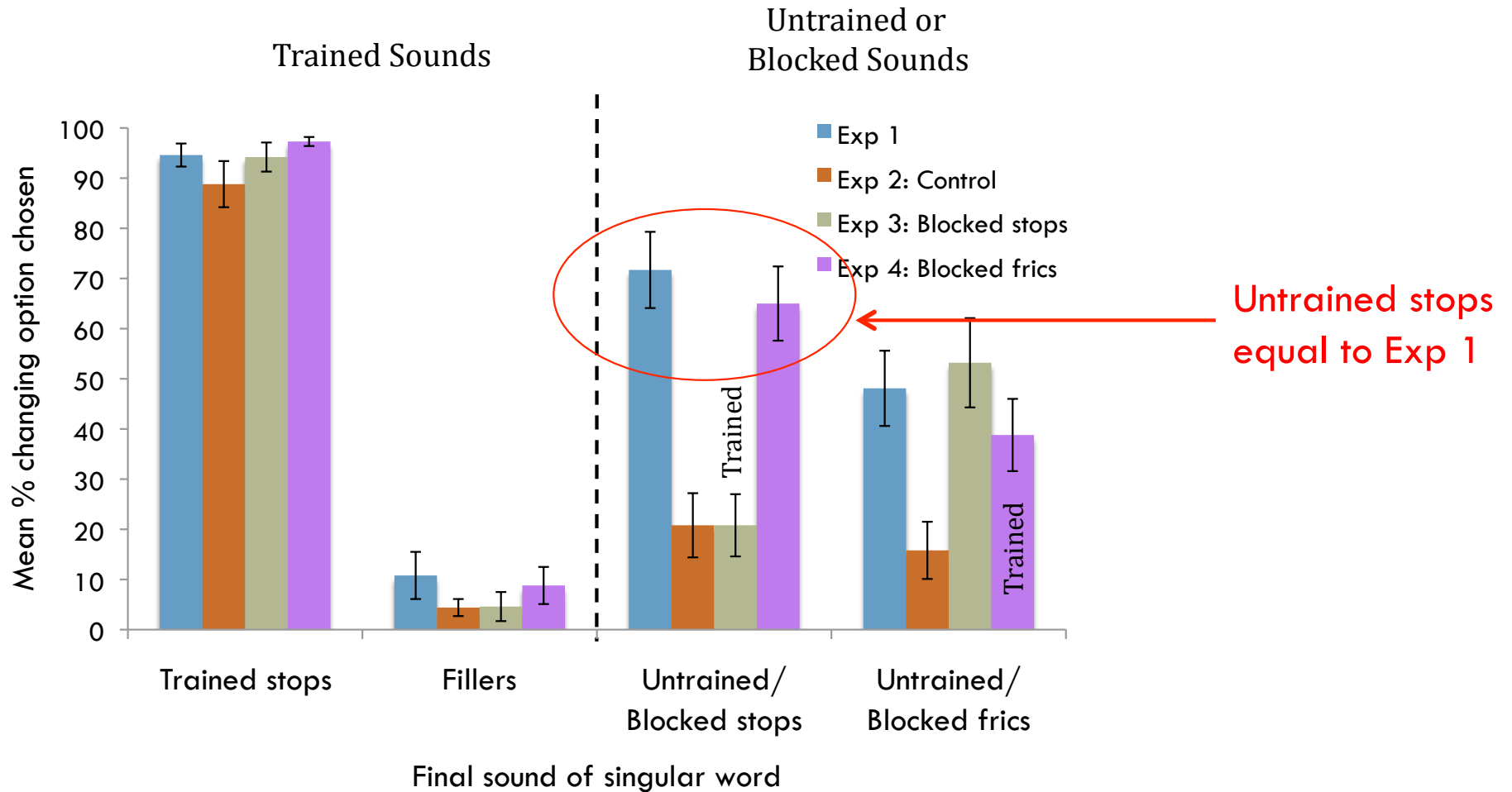
# Experiment 4 – Results

49



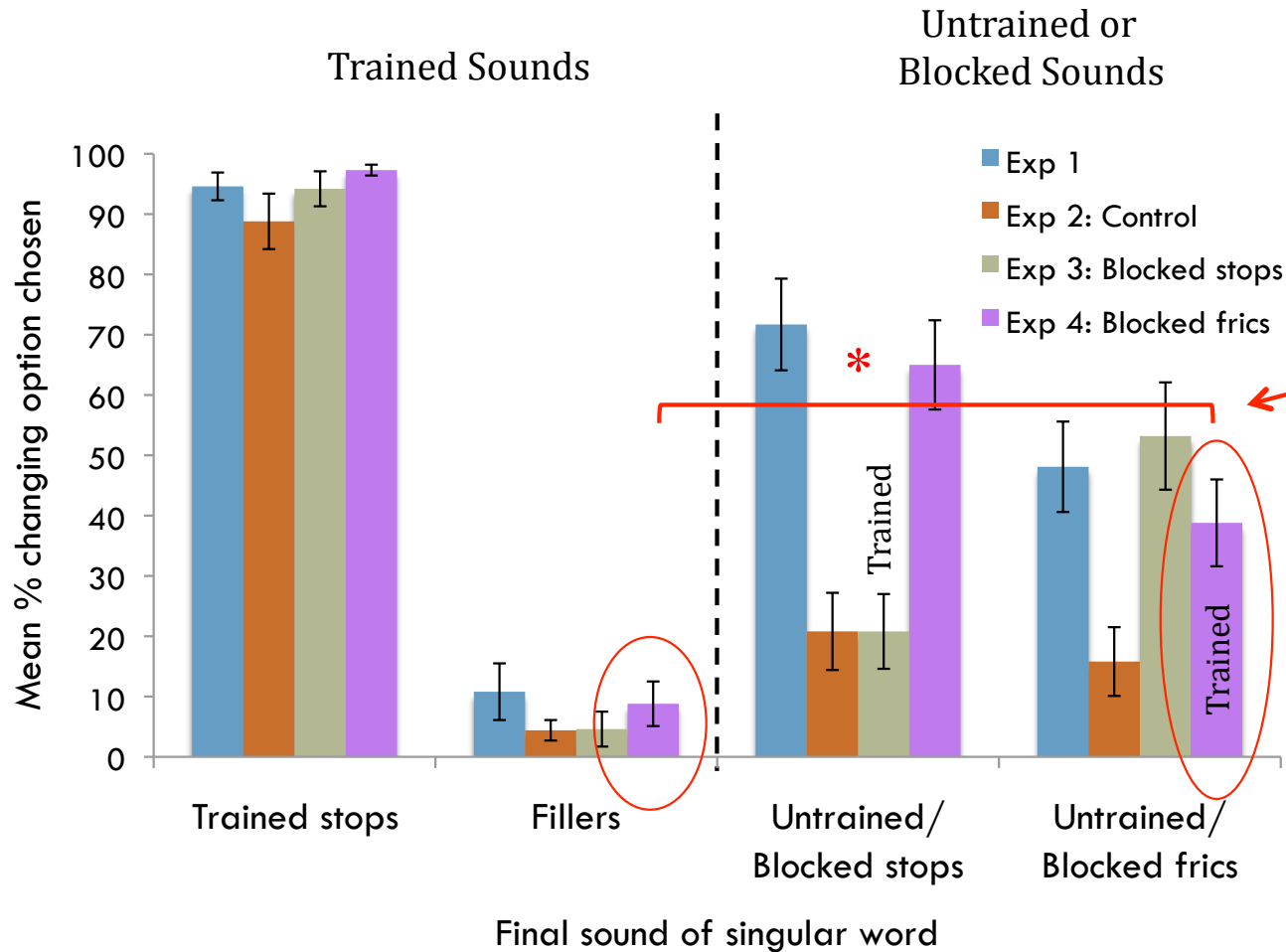
# Experiment 4 – Results

50



# Experiment 4 – Results

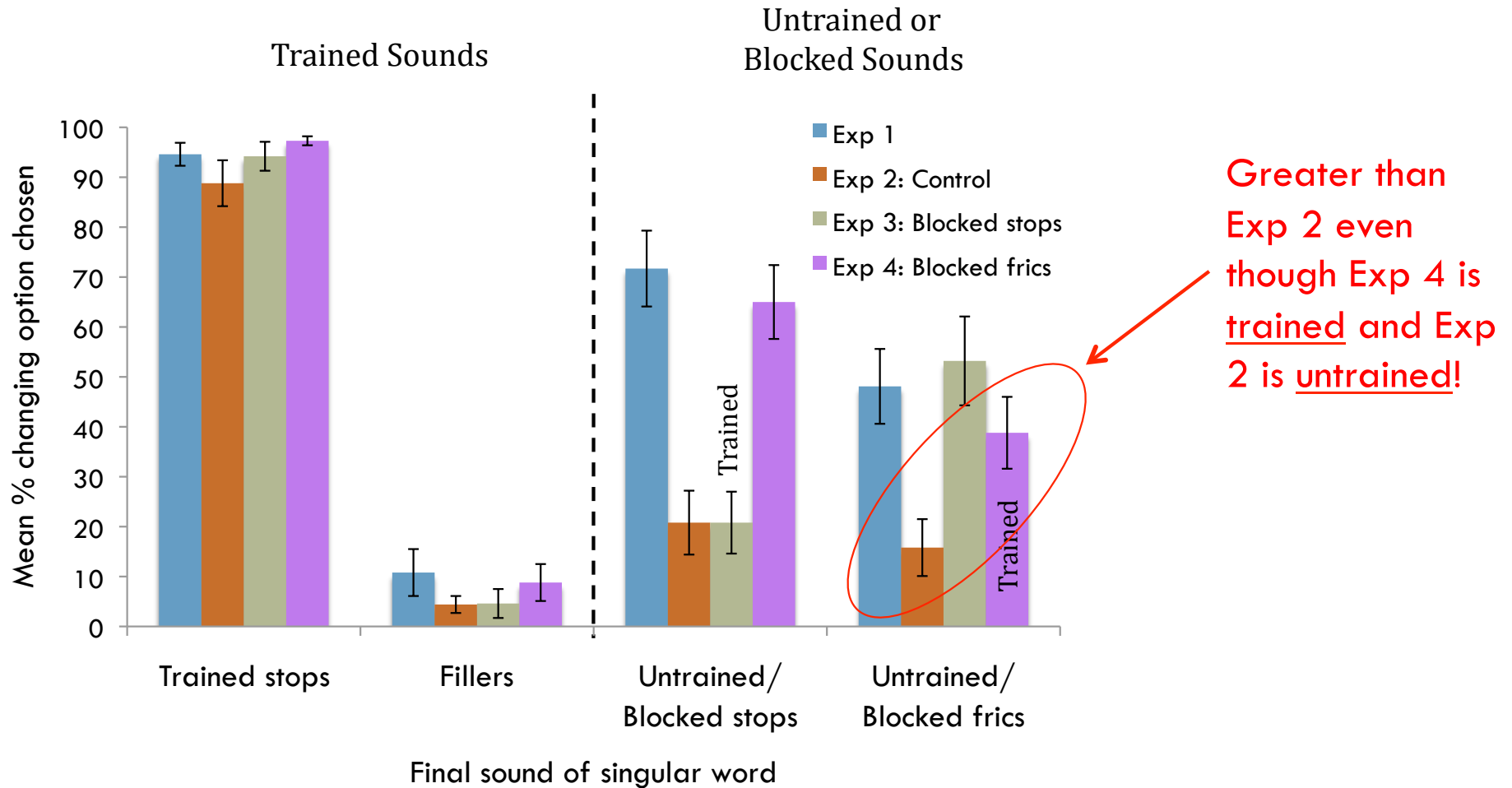
51



**Sig. more errors on blocked frics than on fillers despite being trained to not change frics!**

# Experiment 4 – Results

52



# Observations so far

- Given ambiguous input, learners generalize to make learned alternations non-saltatory.
  - ▣ This effect cannot be explained by participants learning a general rule or by product-oriented responses.
- There is a preference towards changing voiced stops more than voiceless fricatives.
  - ▣ Binary abstract features cannot account for this difference
  - ▣ Perhaps perceptual similarity is important
- Even when learners are trained that intervening sounds should not change, they have a *tendency* to change them to make the alternation non-saltatory.

# Theoretical Implications

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What do we know?

# Theoretical Implications

55

## What do we know?

- Natural languages exist with saltatory alternations.
  - ▣ So phonological theory must be able to generate grammars that allow saltatory alternations.
  - ▣ Even this is not totally straightforward (e.g., classical OT<sup>1</sup> cannot handle them).

1. Prince & Smolensky, 1993/2004

# Theoretical Implications

56

## What do we know?

- Natural languages exist with saltatory alternations.
  - ▣ So phonological theory must be able to generate grammars that allow saltatory alternations.
  - ▣ Even this is not totally straightforward (e.g., standard OT<sup>1</sup> cannot handle them).
- Saltatory alternations are relatively rare and I have shown that learners are biased against learning a system containing them.
  - ▣ So our theories of phonological learning should account for why these alternations are dispreferred in learning

1. Prince & Smolensky, 1993/2004



# Nature of the bias

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- Substantive bias<sup>1</sup>
  - ▣ Steriade's P-map<sup>2</sup> principle seems to be a good basis for such a bias in this case (at least for a starting point)
    - P(erceptual)-map → Humans are aware of perceptual relationships between sounds (in a given context) and alternations should minimize perceptual changes
    - Accounts for a preference for short distance changes over long distance changes
    - Also accounts nicely for the preference in Exp 1 to change  $b \rightarrow v$  more than  $f \rightarrow v$  ( $b$  is more perceptually similar to  $v$ ).

# Nature of the bias

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- Preliminary computational modeling looks promising for the P-map:
  - ▣ Maximum Entropy grammar learning<sup>1</sup> with weighted constraints banning relevant alternating pairs (e.g., \*p~v)
  - ▣ Input/test items based on experiments
  - ▣ With a prior (= bias) based on the P-map, the model does pretty well; the unbiased model fails
- Is P-map sufficient?
  - ▣ Further experiments/modeling will help determine whether something else has a role (e.g., general dispreference for saltation that is more than just perceptual distance)

# Future directions

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- More computational modeling
  - ▣ Will help explore what types of biases work and make predictions for additional experiments
- Open response/production experiments
- Infant study
  - ▣ Do infants display a bias against saltation when learning phonological alternations?
  - ▣ Will help determine if this bias is operational in child language acquisition

# Conclusions

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- Learners are **biased against learning saltatory alternations**
  - ▣ When trained on alternations that are (potentially) saltatory, they make assumptions/errors that make them not saltatory
- **Perceptual similarity** appears to play a role in this bias
- A **substantive bias based on the P-map** seems like a promising starting point for modeling the effect

# Thank you!

## Acknowledgments:

- For much helpful discussion: Bruce Hayes, Megha Sundara, Robert Daland, Kie Zuraw, Sharon Peperkamp, Marc Garellek, Karen Campbell
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- My undergraduate RAs: Kelly Ryan, Kelly Nakawatase, Ariel Quist
- UCLA Language Acquisition Lab RAs
- UCLA Phonology seminar audiences
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