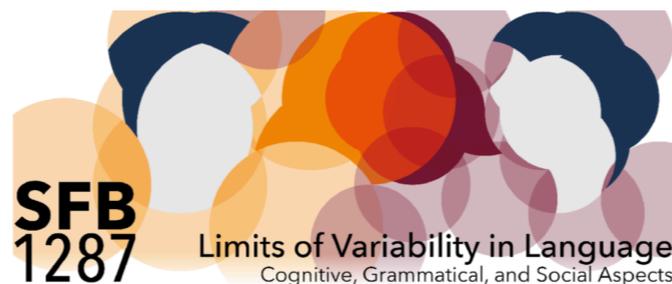


# A cross-linguistic investigation of similarity-based interference

Daniela Mertzen, Anna Laurinavichyute, Brian Dillon & Shravan Vasishth

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33rd Annual CUNY Human Sentence Processing Conference



UMass  
Amherst

# Cue-based retrieval theories (McElree, 2000; Van Dyke & Lewis, 2003; Lewis & Vasishth, 2005)

- Language comprehension requires rapid formation of dependencies

<b>encoding</b>			<b>storage</b>			<b>retrieval</b>
The journalist	who	saw	the thief	yesterday		lied

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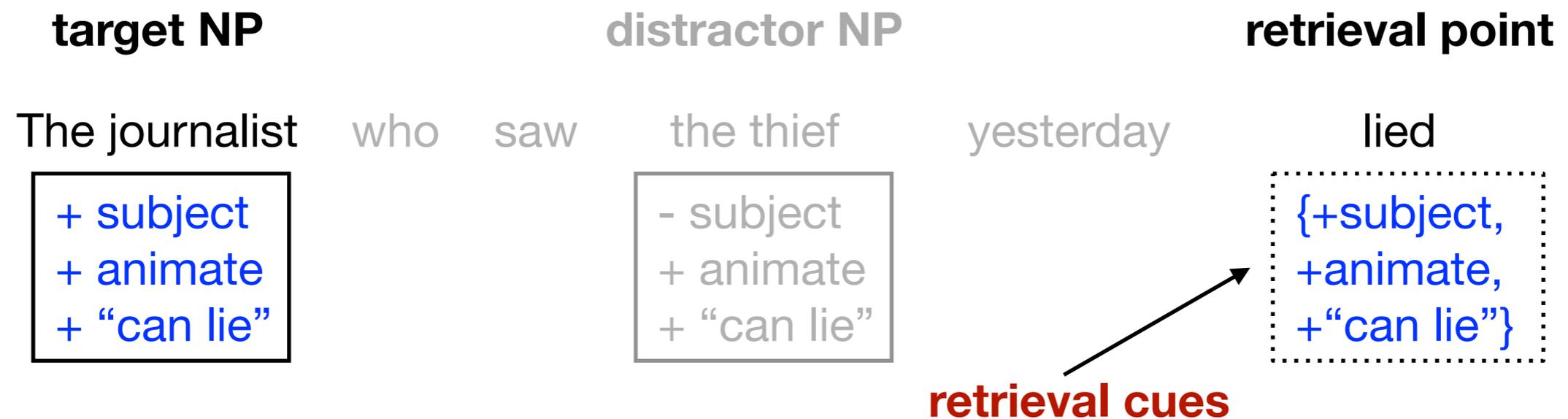
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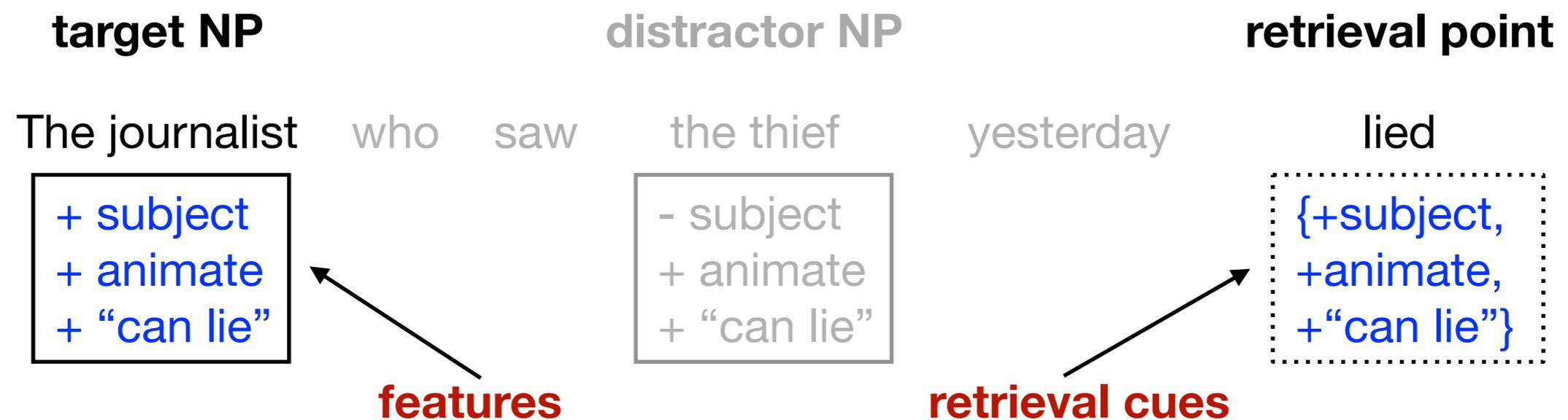
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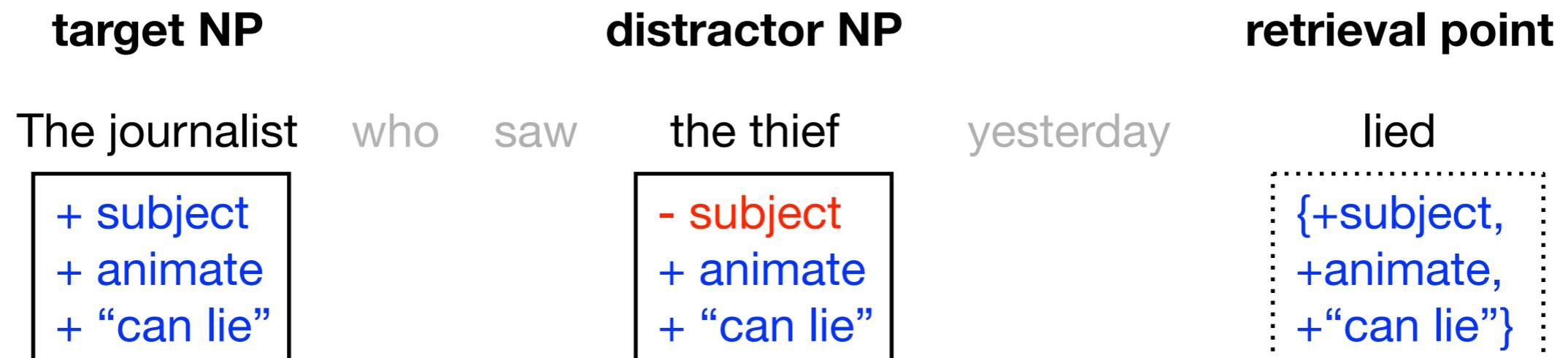
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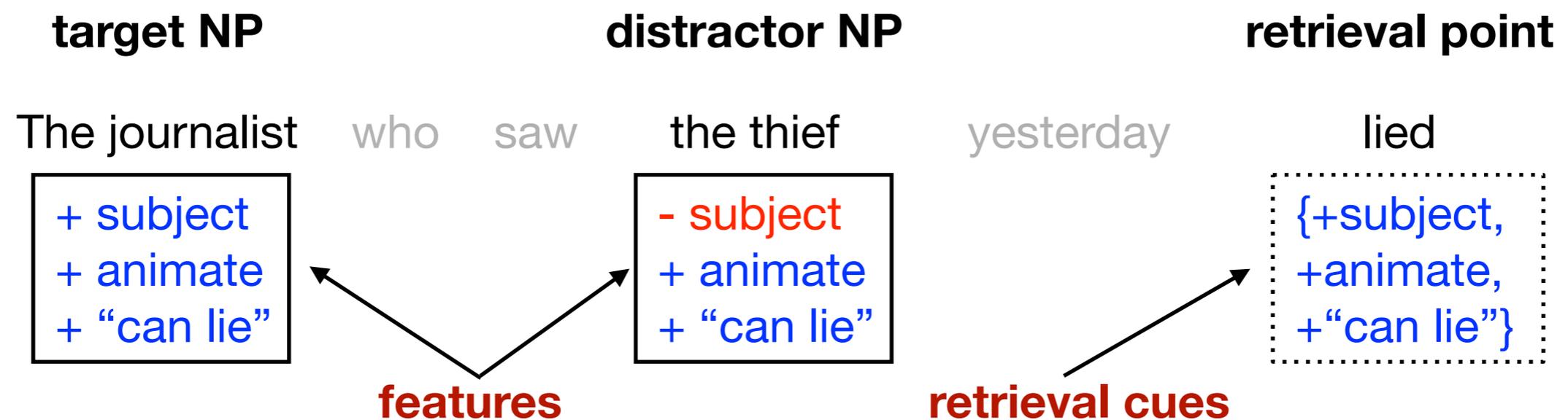
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# Research questions

- What are the memory mechanisms that subserve sentence comprehension?
- Can semantic similarity-based interference effects during real-time sentence comprehension be observed cross-linguistically?

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# Van Dyke & McElree (2006) Self-paced reading + recall task

## Memory load conditions

table sink truck

### **No interference**

It was **the boat** that the guy who lived by the sea **sailed** in two sunny days.

### **Interference**

It was **the boat** that the guy who lived by the sea **fixed** in two sunny days.

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# Van Dyke & McElree (2006)

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table sink truck

+ FIXABLE

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# Van Dyke & McElree (2006)

## Memory load conditions

table sink truck

- SAILABLE

No interference

+ SAILABLE

It was **the boat** that the guy who lived by the sea **sailed** in two sunny days.

Interference

It was **the boat** that the guy who lived by the sea **fixed** in two sunny days.

# Van Dyke & McElree (2006)

## Memory load conditions

table   sink   truck

### **No interference**

It was **the boat** that the guy who lived by the sea **sailed** in two sunny days.

### **Interference**

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## No memory load conditions

—   —   —

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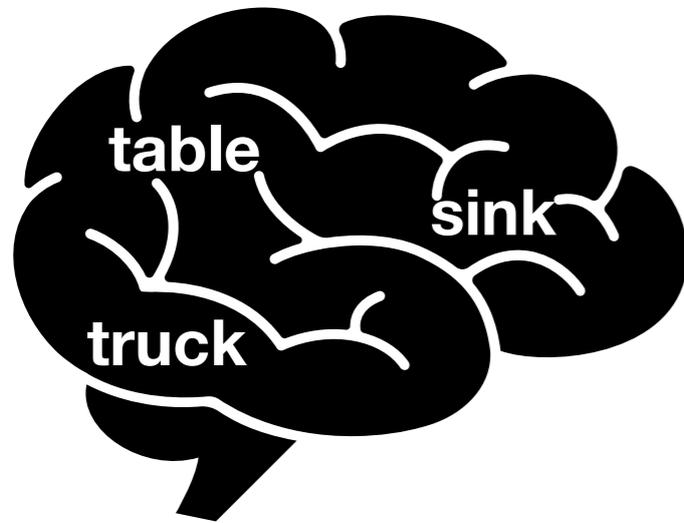
**Comprehension question:** *Did the guy live by the sea?*

**Recall:** \_\_\_\_\_

# Van Dyke & McElree (2006) results

## Memory load x Interference interaction (critical verb)

Load conditions:



fixed > sailed

No load conditions:



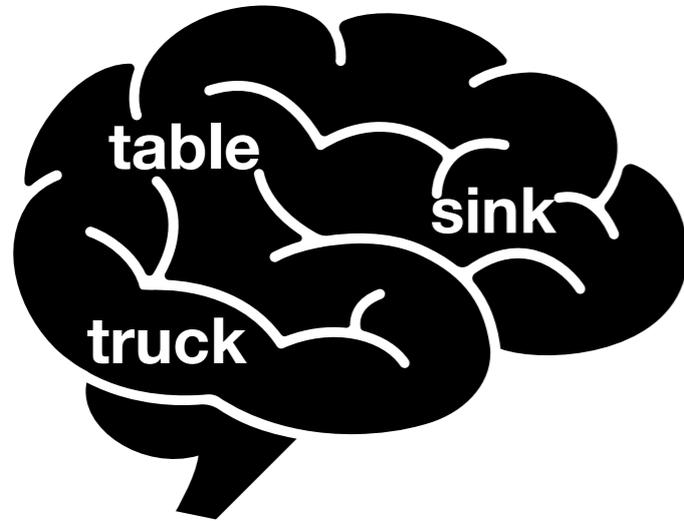
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→ Pattern consistent with cue-dependent retrieval interference

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No load conditions:



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## Van Dyke, Johns & Kukona (2014)

No evidence of Memory load x Interference interaction

# Our study

Eye-tracking + recall task

- re-examined similarity-based interference

## English



# Our study

Eye-tracking + recall task

- re-examined similarity-based interference

## English



## German



## Russian



- Investigated similarity-based interference cross-linguistically

# Design

For each



2 x 2 fully-crossed factorial design

Factor 1: Memory load (*load vs. no load*)

Factor 2: Interference (*no interference vs. interference*)

# Design

## Memory load conditions

table   sink   truck

### No interference

**The boat** that the guy who lived by the sea **sailed** in the morning seemed to be very old.

### Interference

**The boat** that the guy who lived by the sea **fixed** in the morning seemed to be very old.

## No memory load conditions

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# Design

## Memory load conditions

table   sink   truck

**- SAILABLE**   **+ FIXABLE**

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Language	Memory load	Sentence (schematic)
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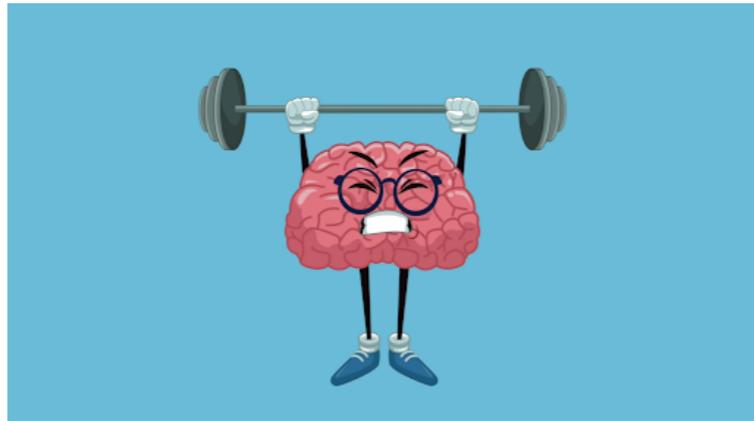
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## Depth of processing manipulation (within-subjects)

Version 1: 40 items

- **difficult questions**  
inducing deep processing



*Did the guy live by the sea?*

## Depth of processing manipulation (within-subjects)

Version 1: 40 items

- **difficult questions**  
inducing deep processing



*Did the guy live by the sea?*

Version 2: 40 new items

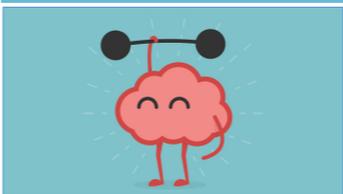
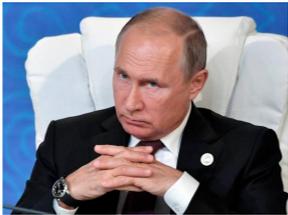
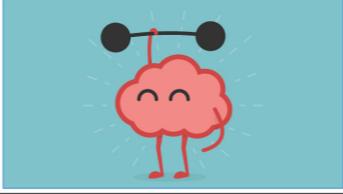
- **simple questions**  
inducing shallow processing



*Did the word sea appear in this sentence?*

# Our study

Eye-tracking + recall task

Language	Version	Subjects	Items
		66	40
			40
		122	40
			40
		109	40
			40

# Pre-registered predictions

For each



**Memory load x Interference** interaction at the critical verb (fixed/sailed) in total reading time

# Predictions: Language

Memory load x interference interaction



V



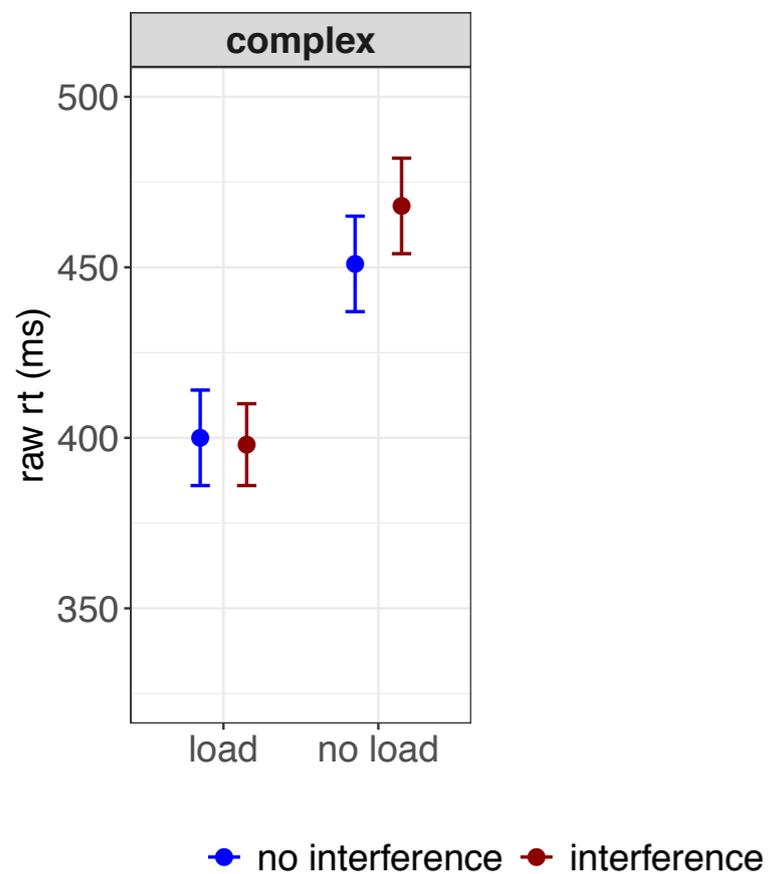
≈



# Raw data (Total fixation times)



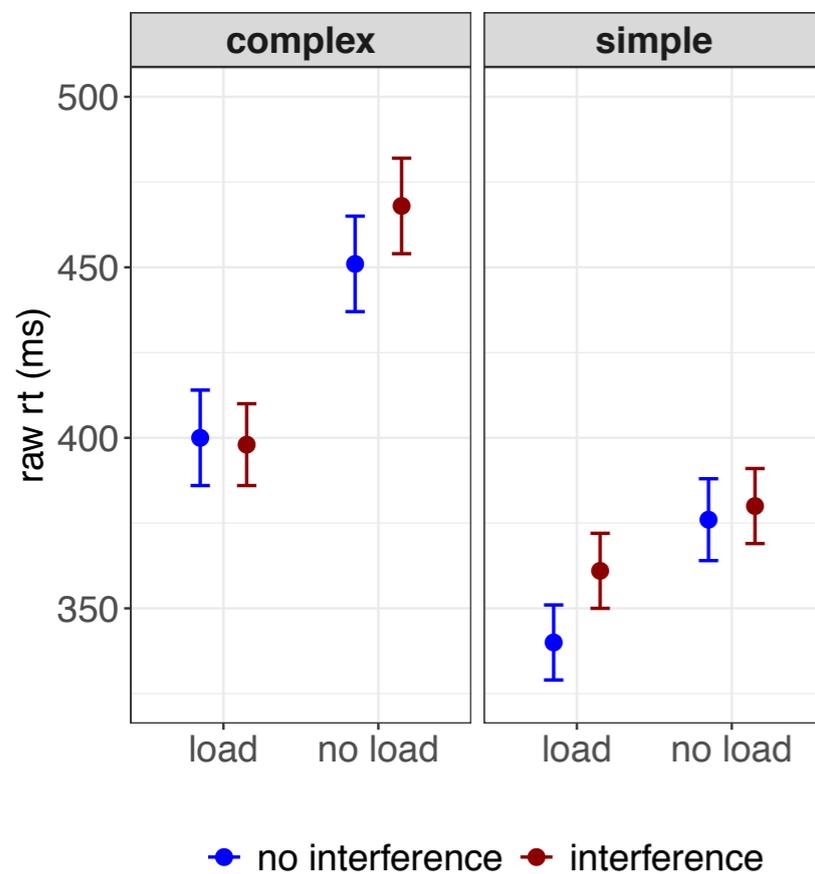
English: raw TFT condition means and 95% CIs (critical verb)



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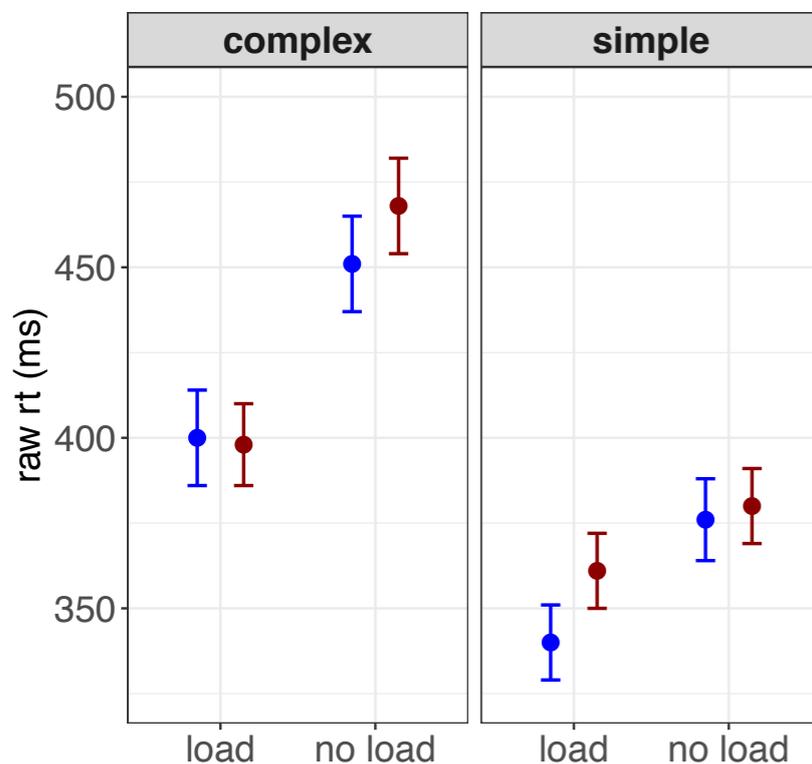
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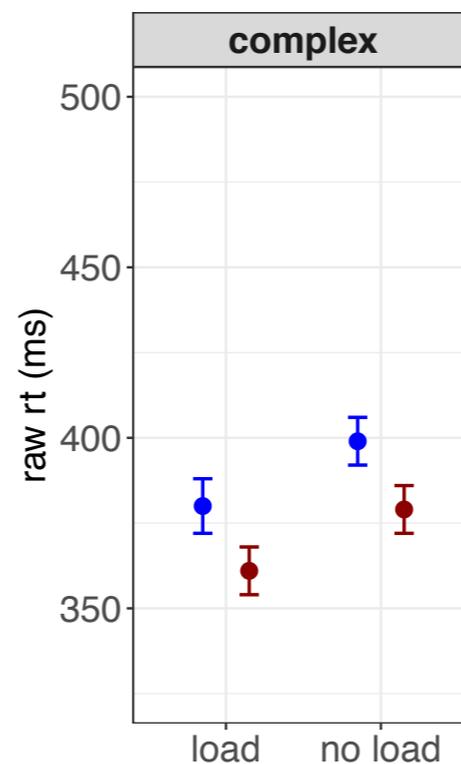


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● no interference ● interference

German: raw TFT condition means and 95% CIs (critical verb)

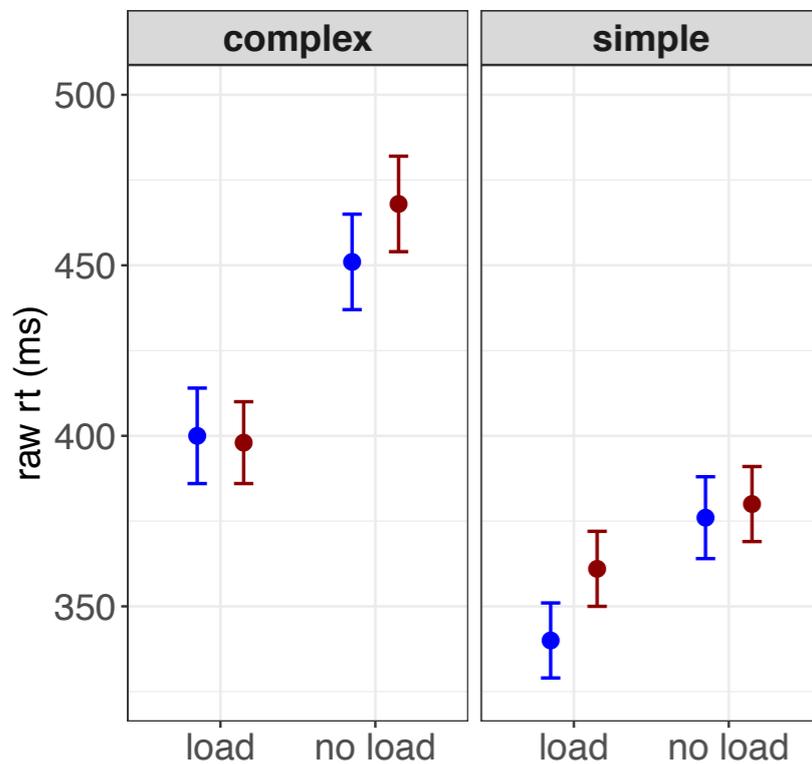


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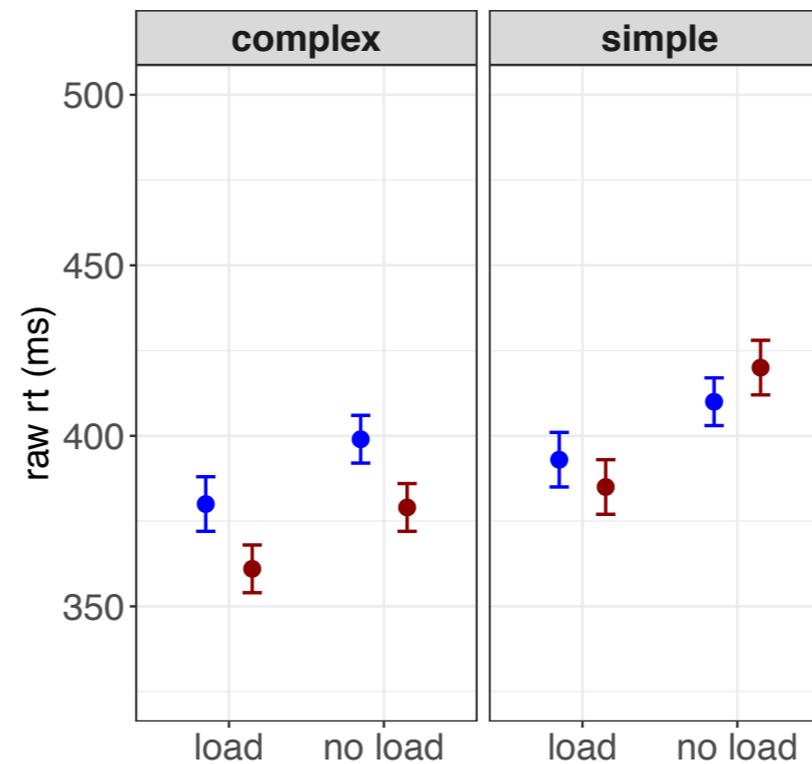


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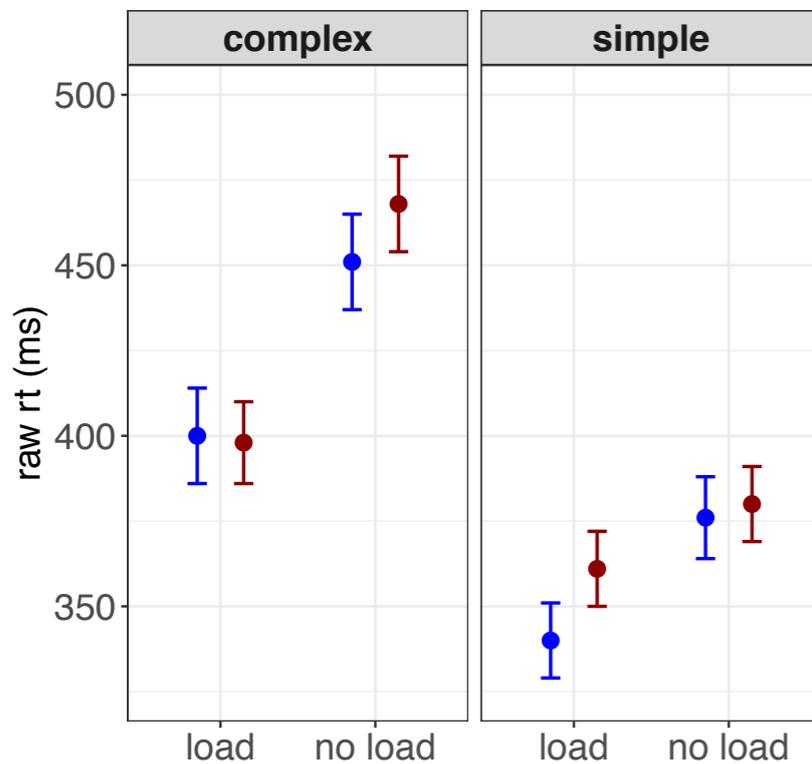


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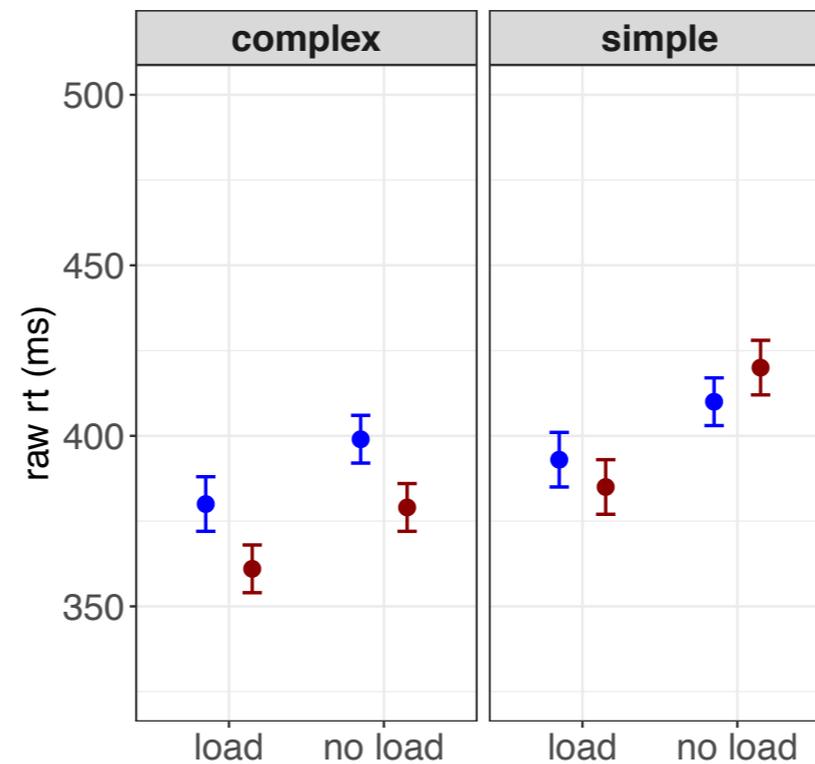


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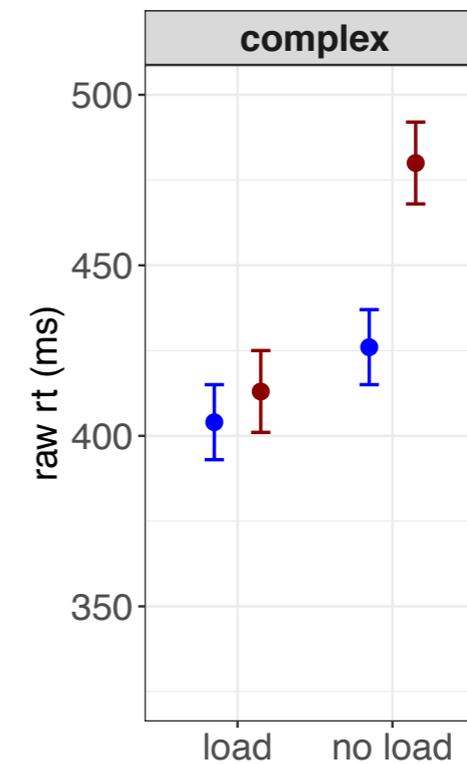
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● no interference ● interference

Russian: raw TFT condition means and 95% CIs (critical verb)

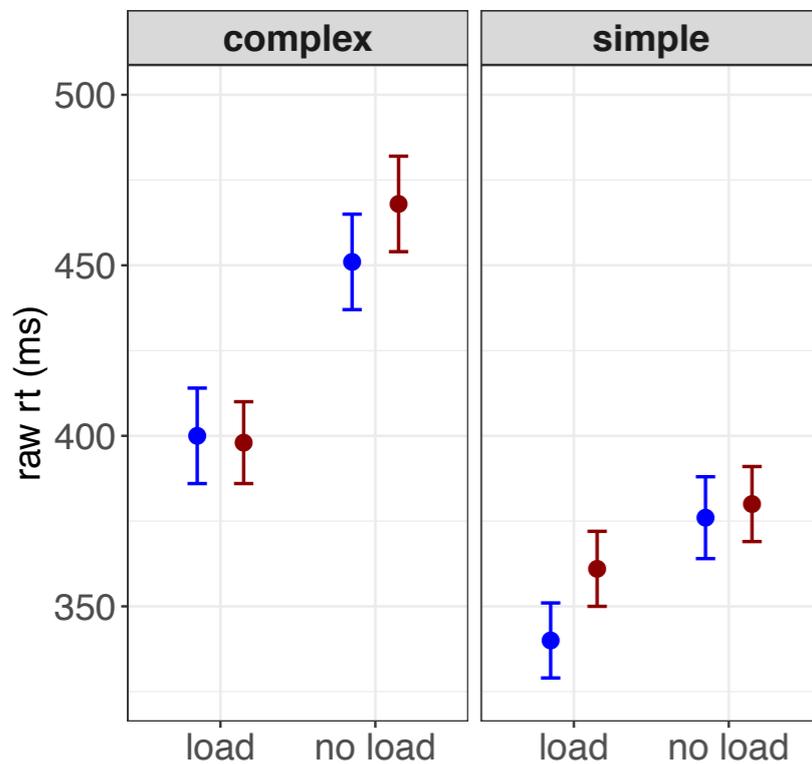


● no interference ● interference

# Raw data (Total fixation times)

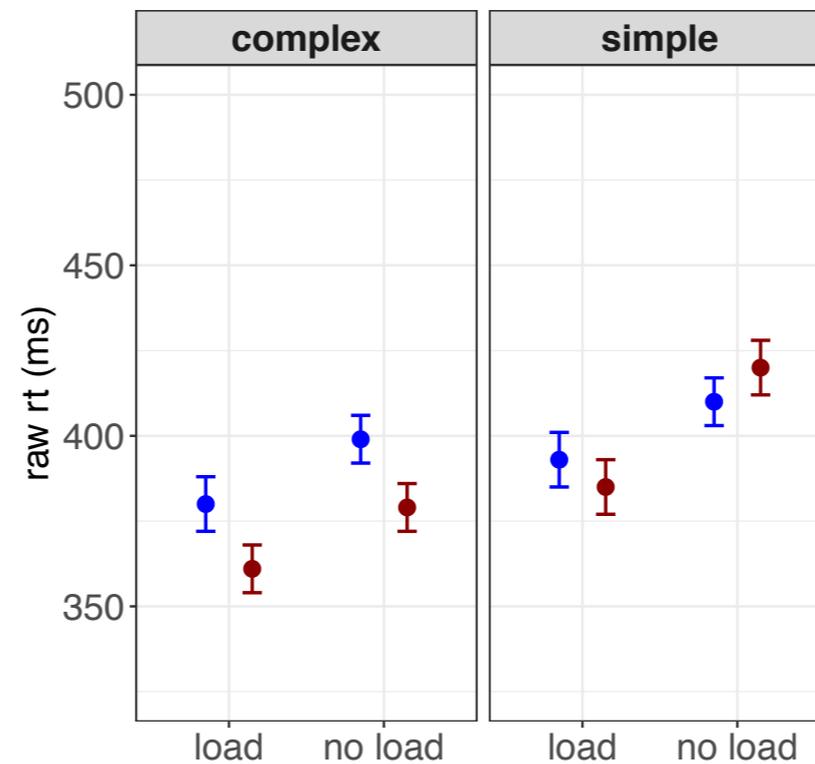


English: raw TFT condition means and 95% CIs (critical verb)



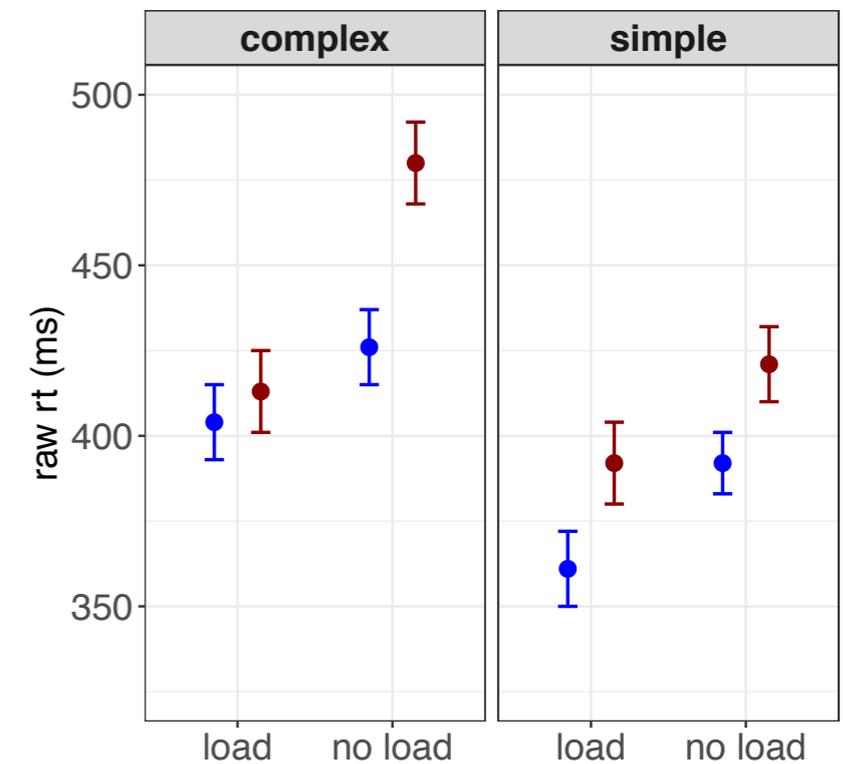
● no interference ● interference

German: raw TFT condition means and 95% CIs (critical verb)



● no interference ● interference

Russian: raw TFT condition means and 95% CIs (critical verb)



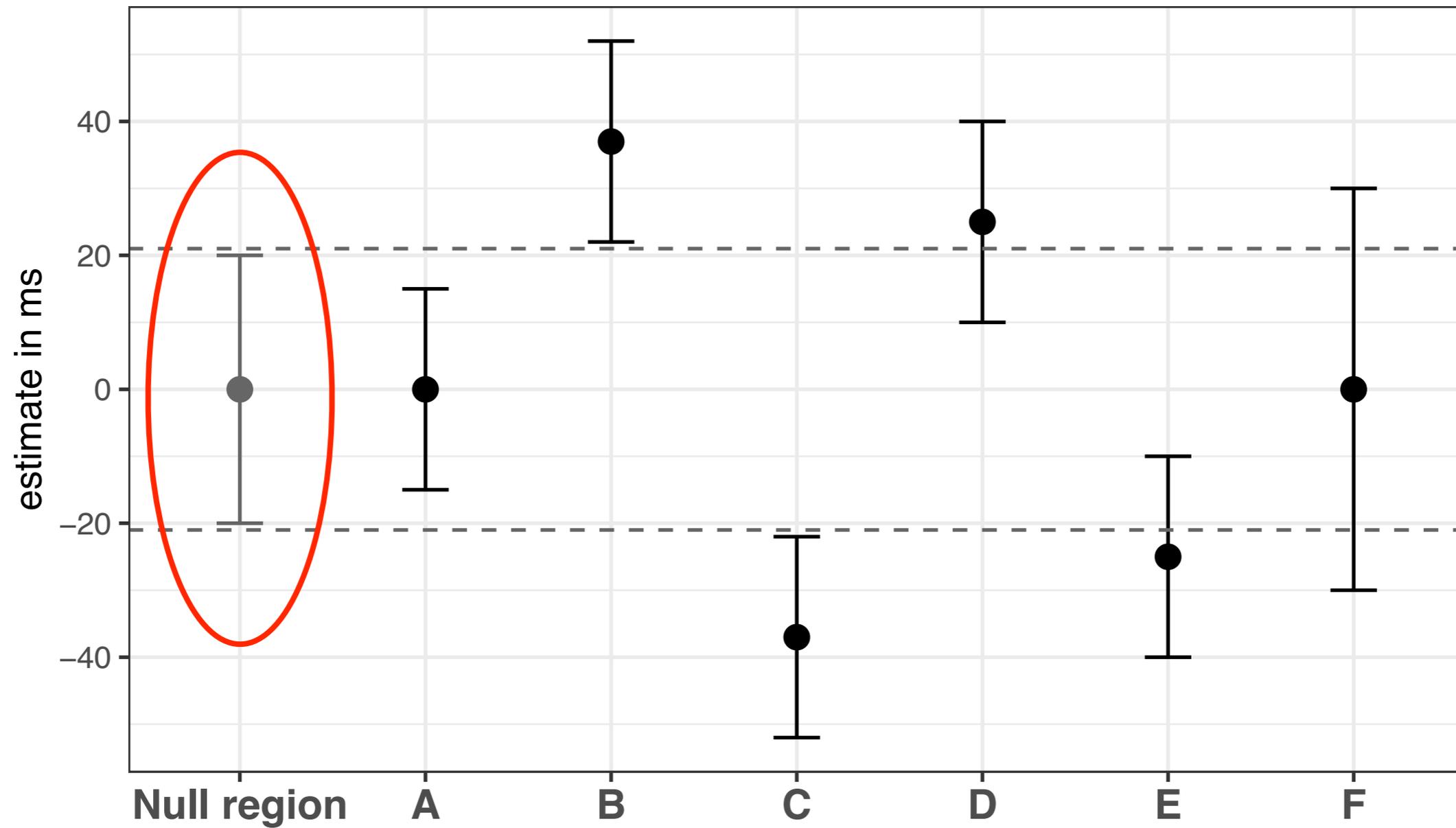
● no interference ● interference

# Region of practical equivalence (ROPE)

(Freedman, Lowe, & Macaskill, 1984; Spiegelhalter, Freedman, & Parmar, 1994; Hobbs & Carlin, 2008; Kruschke, 2015)

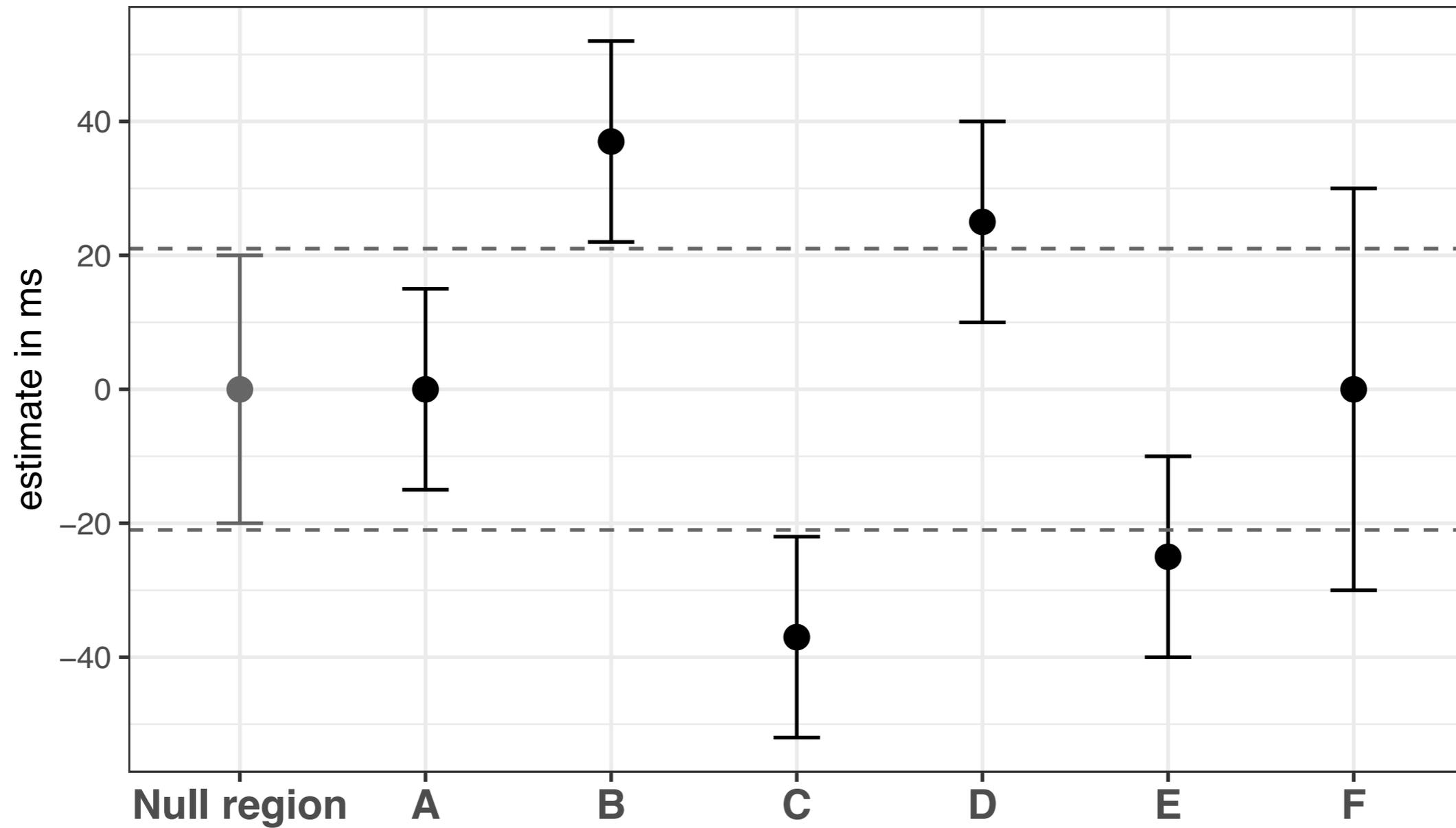
# Region of practical equivalence (ROPE)

Null region with possible outcomes



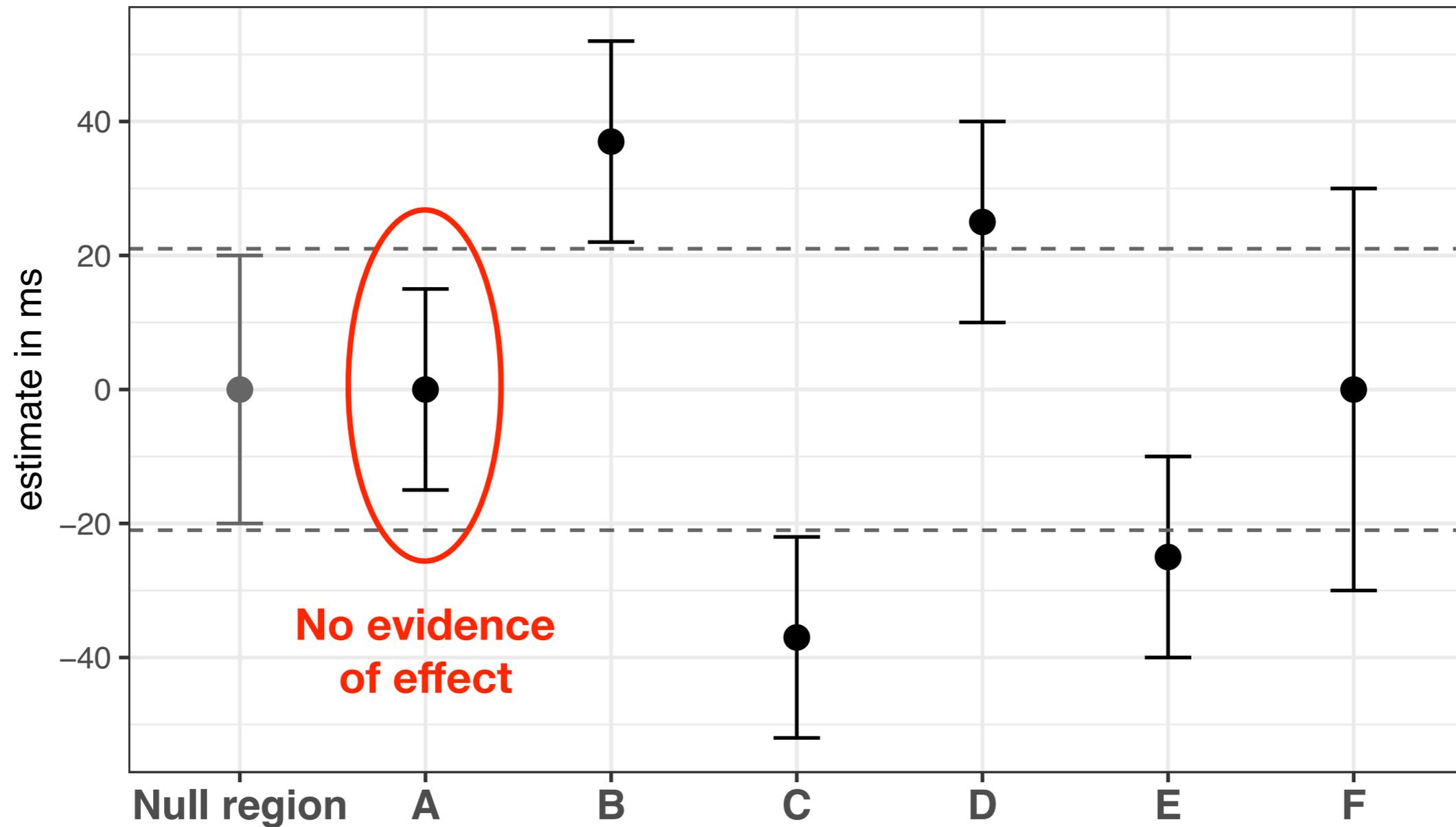
# Region of practical equivalence (ROPE)

Null region with possible outcomes



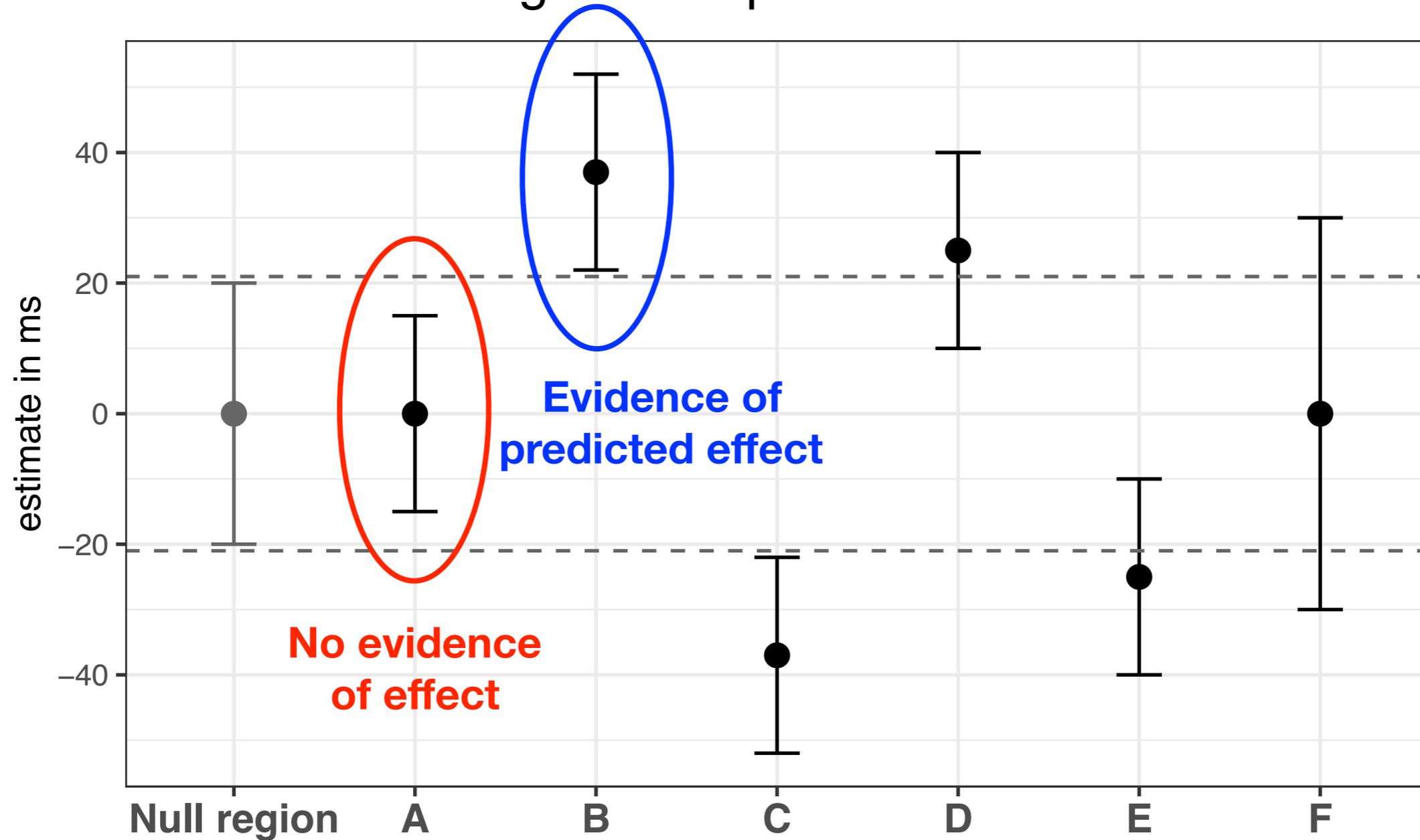
# Region of practical equivalence (ROPE)

Null region with possible outcomes



# Region of practical equivalence (ROPE)

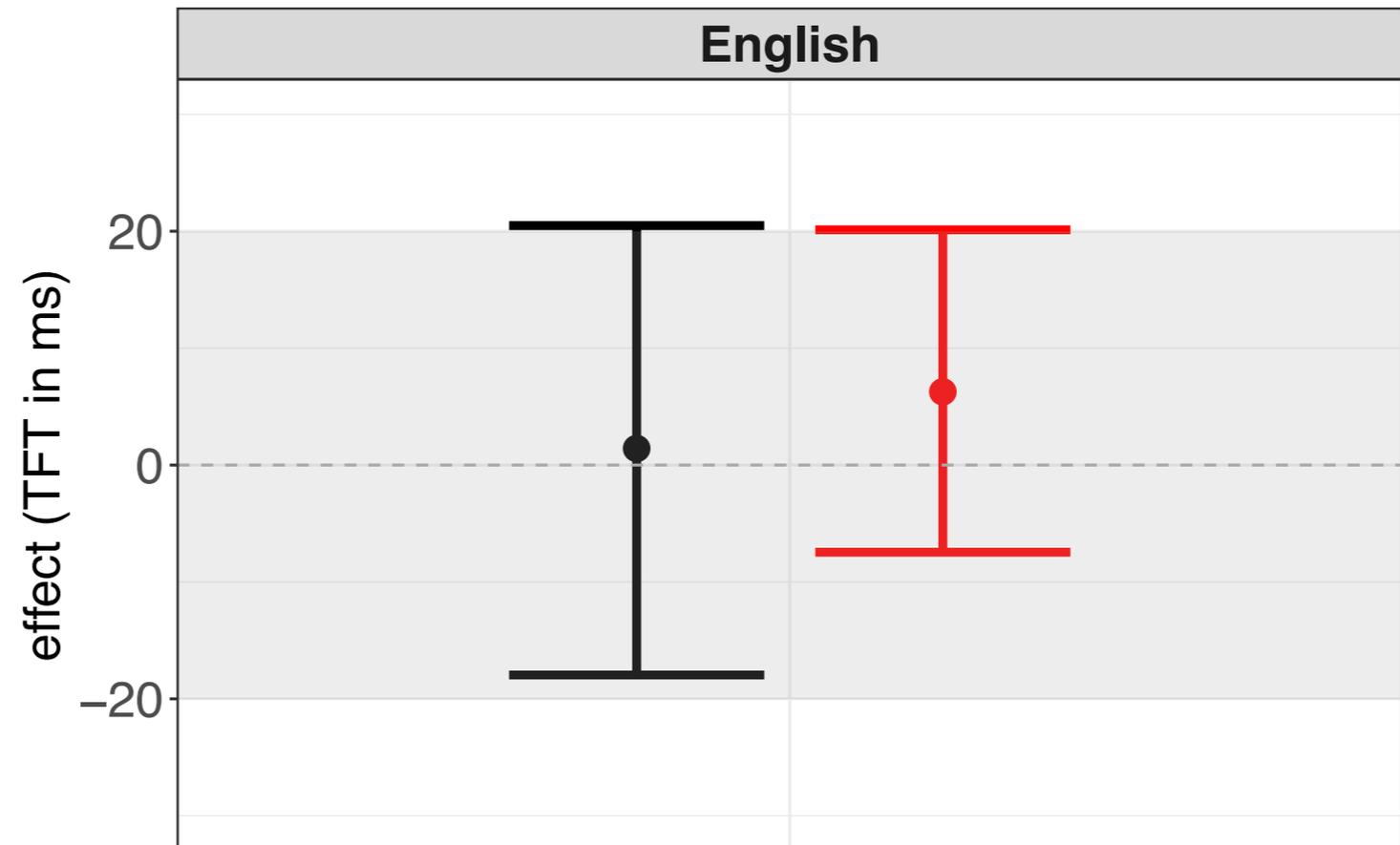
Null region with possible outcomes



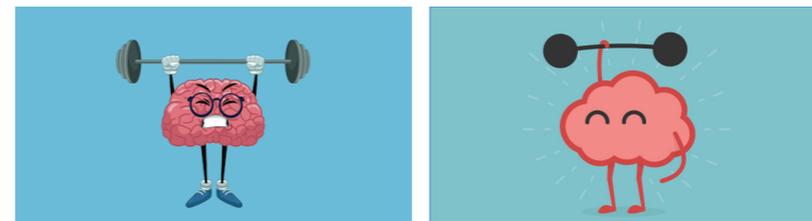
# Total fixation time results (preregistered analysis)



Load x Interference interaction, critical verb  
(posterior means and 95% credible intervals)



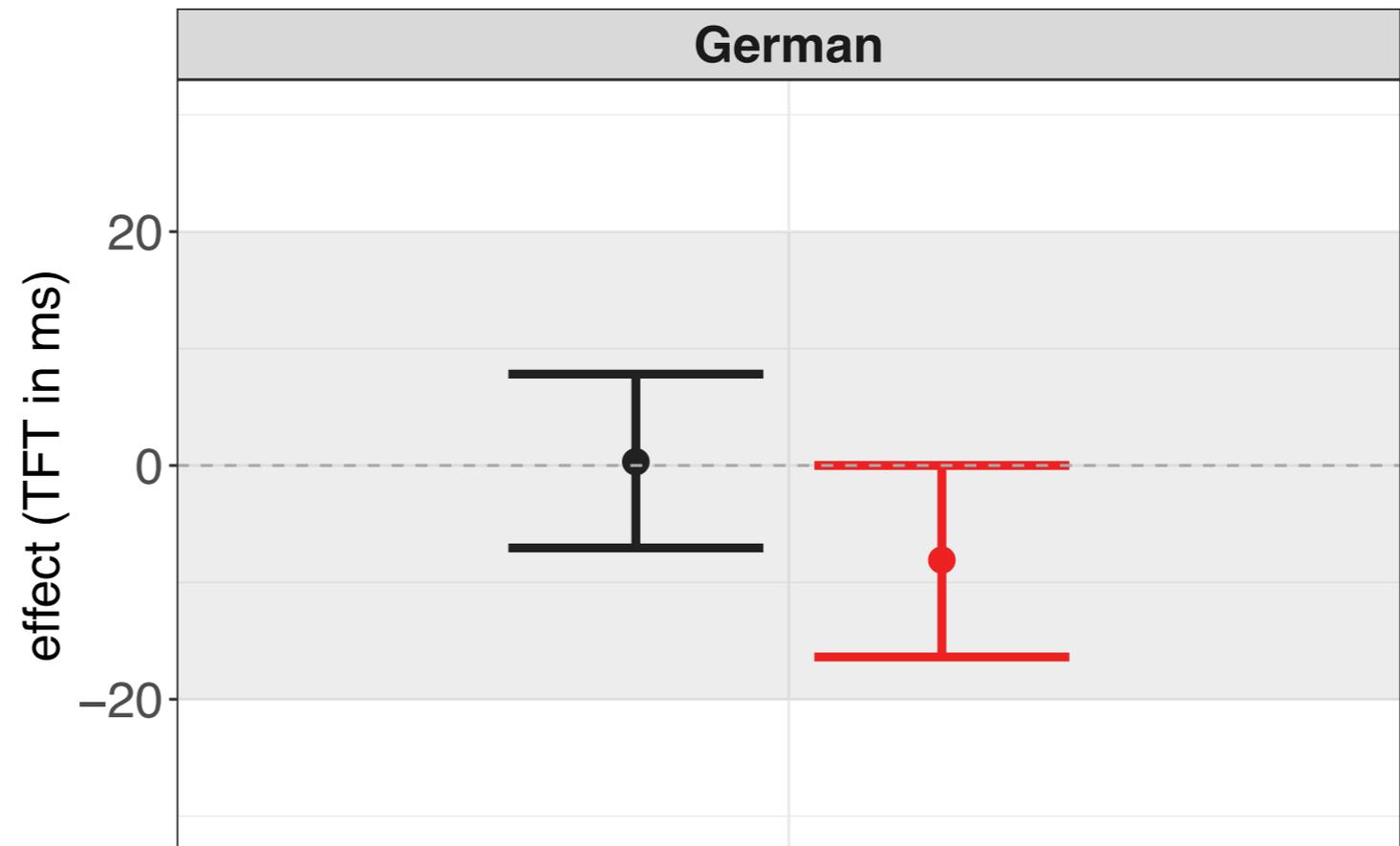
● complex ● simple



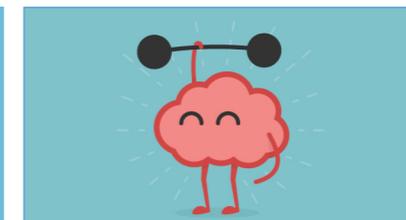
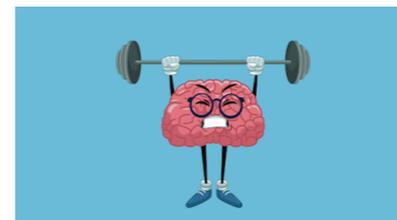
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Load x Interference interaction, critical verb  
(posterior means and 95% credible intervals)



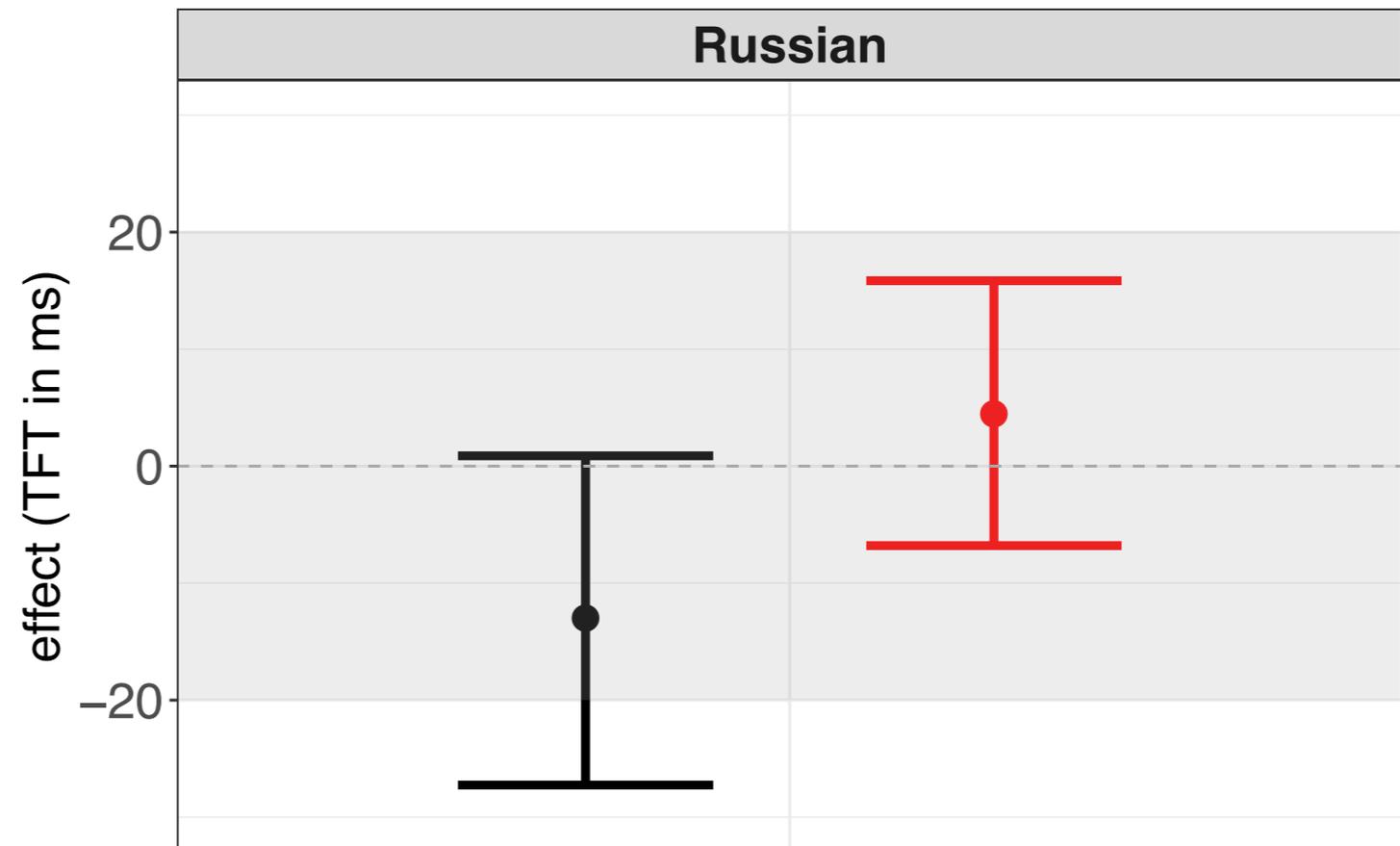
—●— complex —●— simple



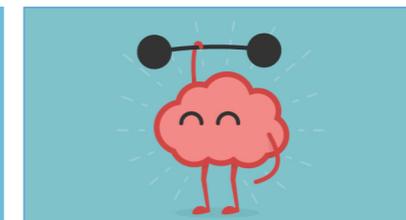
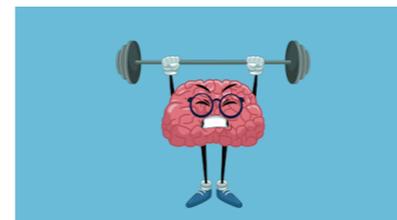
# Total fixation time results (preregistered analysis)



Load x Interference interaction, critical verb  
(posterior means and 95% credible intervals)

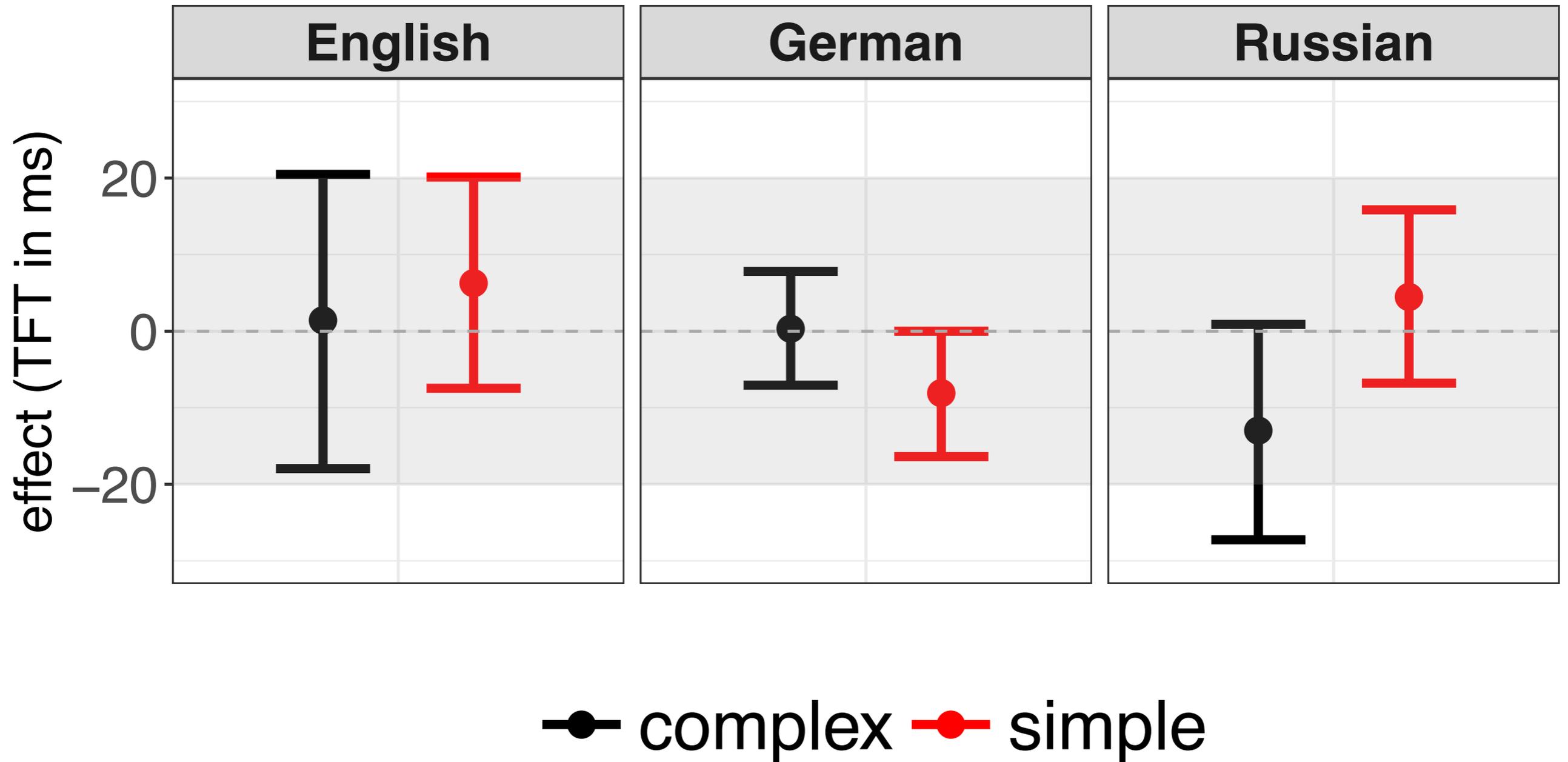


● complex ● simple



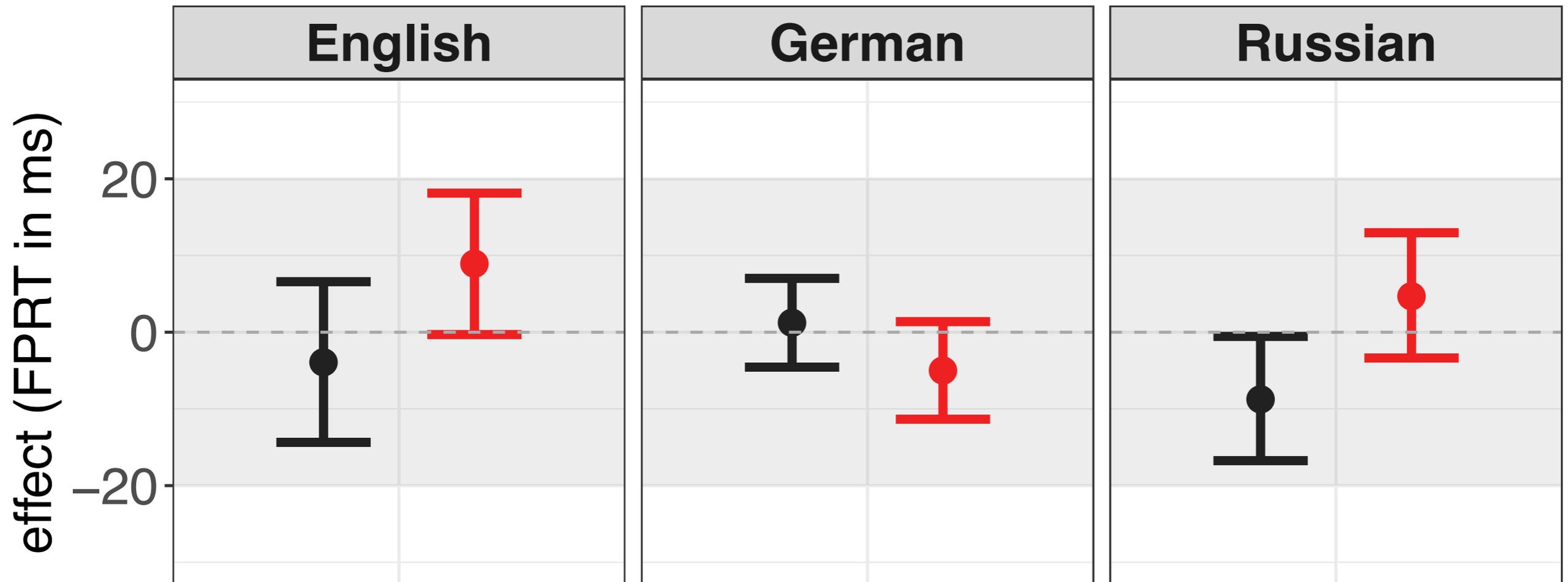
# Total fixation time results (preregistered analysis)

## Load x Interference interaction (critical verb)



# First pass reading time results

## Load x Interference interaction (critical verb)



● complex ● simple

# Main finding

- No evidence of the predicted Memory load x Interference interaction in any tested language

# Implications

- No support for hypothesis that sentence-external items in working memory interfere with retrieval during sentence processing
- Interference effects caused by sentence-external distractors may be very small and difficult to detect

or

- interfering distractors play a role only when they appear within a sentence: currently being tested cross-linguistically

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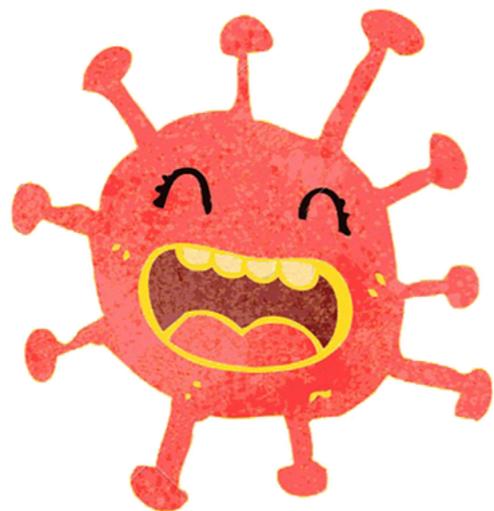
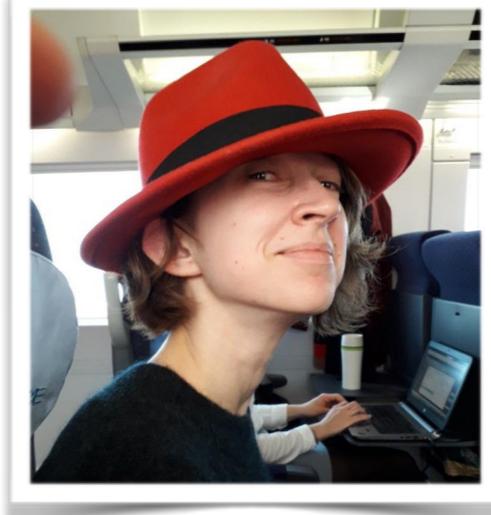
- interfering distractors play a role only when they appear within a sentence, particularly when distractor intervenes between target dependency (Van Dyke & McElree, 2011)

→ currently being tested cross-linguistically

# Thank you



**Questions: [mertzen@uni-potsdam.de](mailto:mertzen@uni-potsdam.de)**



**Stay safe!**



**UMass  
Amherst**