

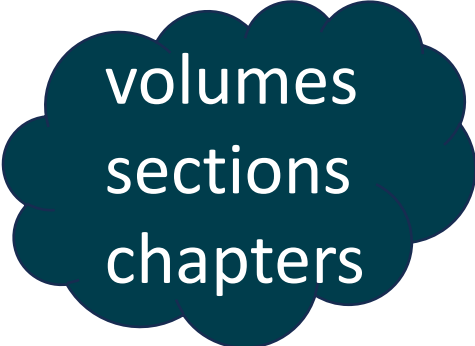
# Incremental prediction updating through consecutive cues: Evidence from eye-tracking and ERPs

Kayla Keyue Chen<sup>1</sup>, Fan Xia<sup>2</sup>, Suiping Wang<sup>3</sup>, Wing-Yee Chow<sup>1</sup>

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# Introduction

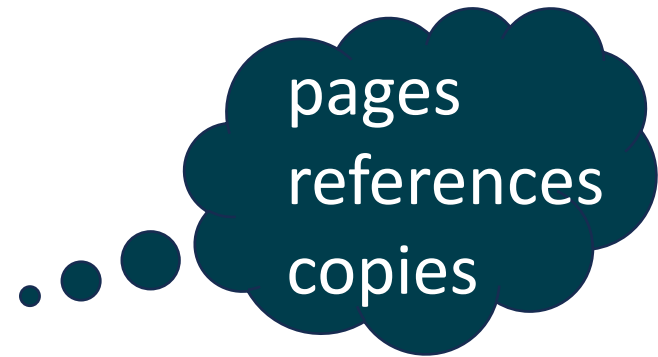
This book has three \_\_\_\_\_



volumes  
sections  
chapters

# Introduction

This book has three hundred \_\_\_\_\_



# Introduction

## Prediction during language comprehension

Comprehenders can use rich contextual information to predict upcoming language (Altmann & Kamide, 1999; DeLong et al., 2005; Federmeier & Kutas, 1999; Kamide et al., 2003; Szewczyk & Schriefers, 2013; Wicha et al., 2004; see Kutas et al., 2011; Ryskin & Nieuwland, 2023 for reviews)

Moreover, recent studies indicate that upon encountering unexpected information, comprehenders can rapidly update their predictions (Chow & Chen, 2020; Fleur et al., 2020; Gussow et al., 2019; Szewczyk et al., 2022; Szewczyk & Wodniecka, 2020)

# Introduction

Updating predictions based on incoming information

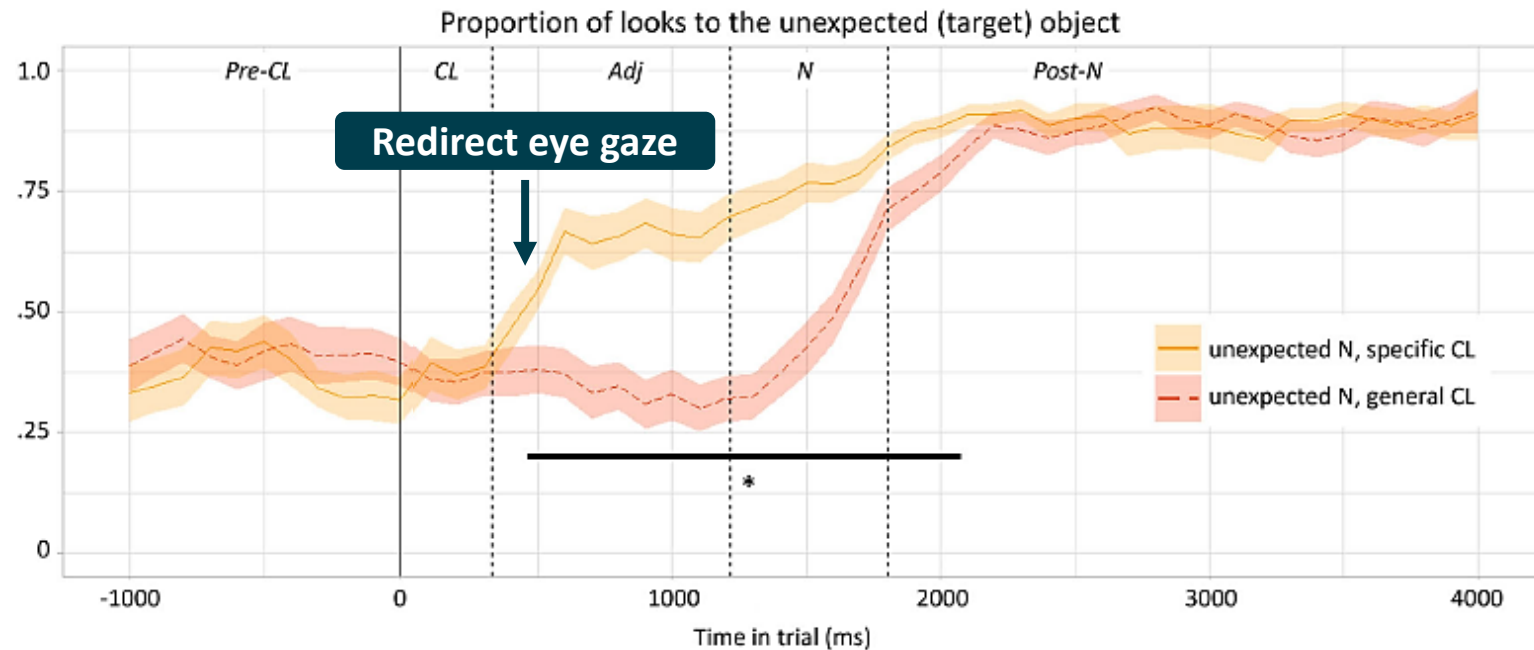
Chow and Chen (2020) examined listeners' sensitivity to cues that are inconsistent with their predictions by using nominal classifiers in Mandarin Chinese.



# Introduction

Updating predictions based on incoming information

Chow and Chen (2020) found that Mandarin Chinese listeners were able to rapidly redirect their eye gaze towards a previously unexpected object upon hearing a prediction-inconsistent classifier.



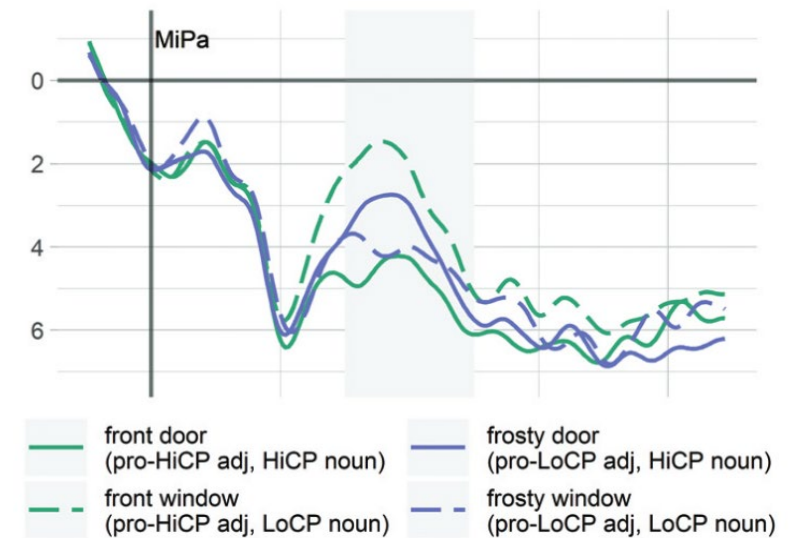
*Anna at Starbucks bought one CL\_piece / CL\_general very nice-tasting cake.*

**Unexpected N**

# Introduction

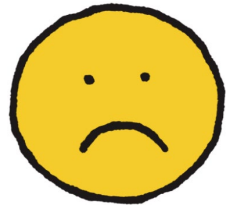
Updating predictions based on incoming information

Szewczyk et al. (2022) found that English readers can use adjectives to dynamically adjust their expectations for upcoming nouns.



# Introduction

How about consecutive cues?



Overload

**Processing the first prediction-inconsistent cue may already overload the system**

- Detecting conflicts between prediction and bottom-up input can disrupt subsequent processing (Husband & Bovolenta, 2020)
- Difficult to update existing predictions or make new ones



Resilient

**The cost of prediction error seems very small or very short-lived**

- Eye-tracking: redirect eye gaze without an extensive search for alternatives (Chow & Chen, 2020; Gussow et al. 2019)
- ERP: reduced N400 at the noun which is preceded by an informative cue (Szewczyk et al., 2022; Szewczyk & Wodniecka, 2020)



# The present study

## 1<sup>st</sup> cue

We used *prediction-mismatching classifiers* to **signal a prediction error** (Chow & Chen, 2020).

- Nominal classifiers are obligatory in Mandarin Chinese when the noun is modified by a demonstrative or numeral.

### Specific, matching

一本书 (one CL<sub>ben</sub> book)  
一束花 (one CL<sub>shu</sub> flower)  
一台相机 (one CL<sub>tai</sub> camera)

### Specific, mismatching

—\*块书 (one \*CL<sub>kuai</sub> book)  
—\*张花 (one \*CL<sub>zhang</sub> flower)  
—\*份相机 (one \*CL<sub>fen</sub> camera)

### General

一些书 (some books)  
一些花 (some flowers)  
一个相机 (one CL<sub>ge</sub> camera)

## 2<sup>nd</sup> cue

We then used *informative modifiers* to **trigger potential updating of noun predictions**.

- We measured *cloze probabilities* of the target noun to ensure that an informative adjective can always make the noun more likely to follow even after a prediction-mismatching classifier (cf. Husband & Bovolenta, 2020)

# EXP 1 the visual world study: Method

EXP 1 visual-world eye-tracking experiment (50 participants, 40 items)

Expected



Target

Distractor



Competitor



老家的院子里种了很多绿色植物，院子中央有...

The old house's courtyard is full of greenery, and in its centre, there is/are ...

tree

**Specific classifier**

一 张 {下棋的/好看的} 桌子  
one **CL<sub>zhang</sub>** {chess-playing / good-looking} table

**General classifier**

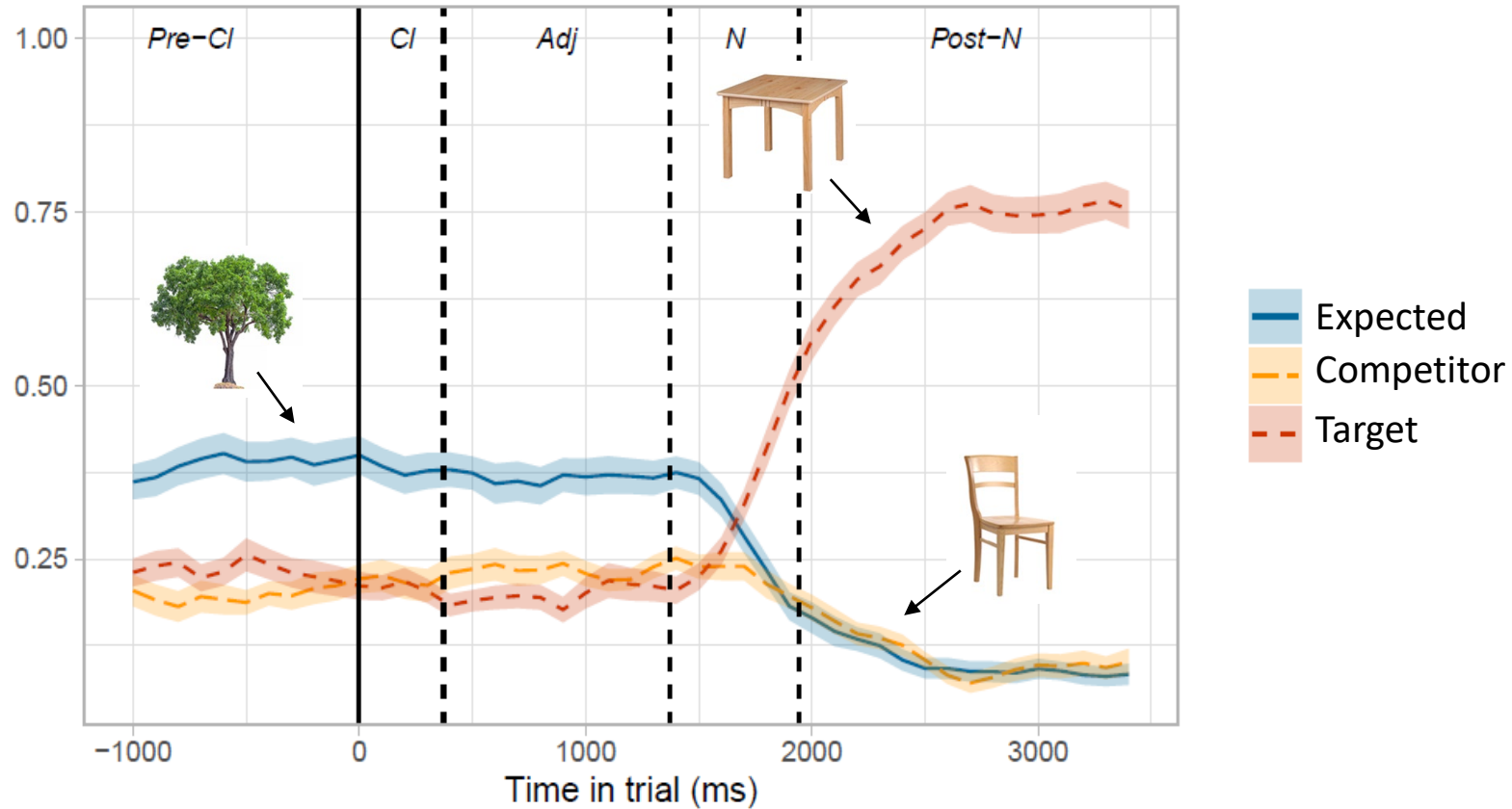
一 些 {下棋的/好看的} 桌子  
one **CL<sub>xie</sub>** {chess-playing / good-looking} table

**Informative modifier**

**Uninformative modifier**

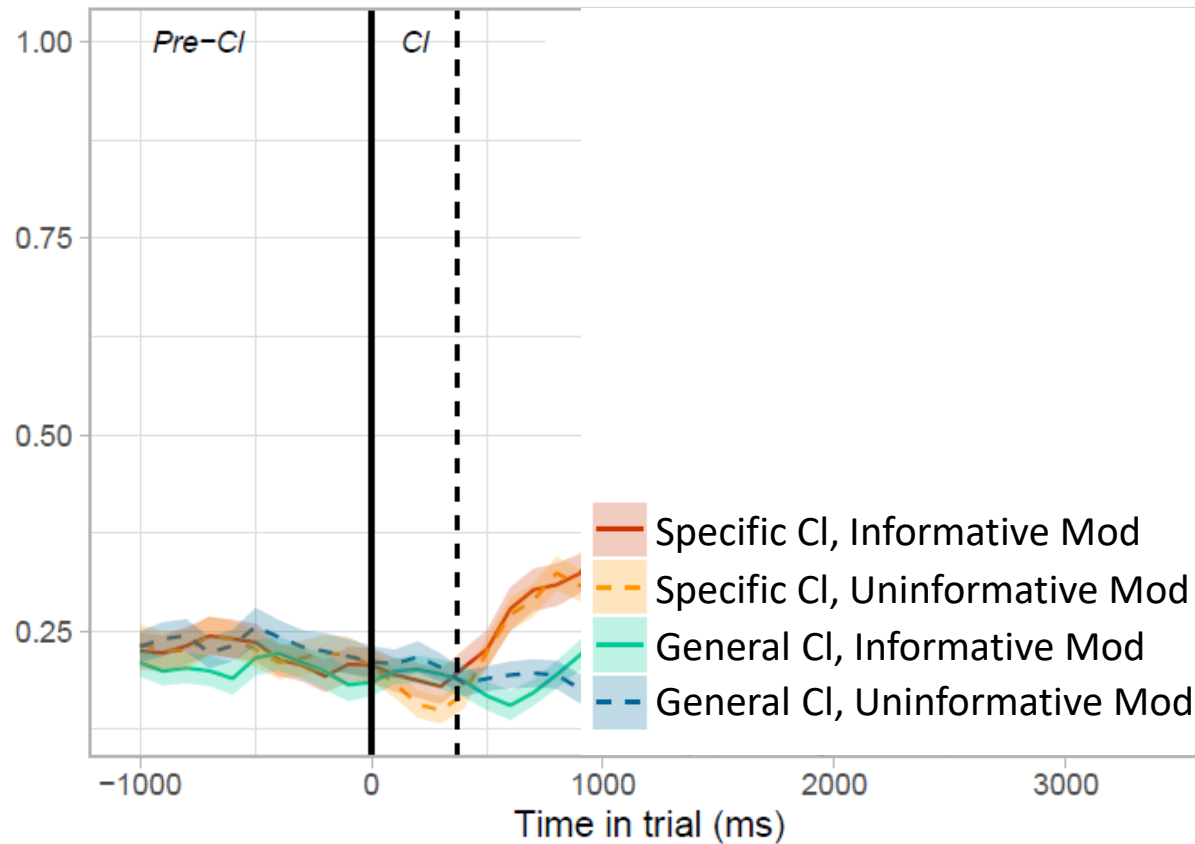
# EXP 1 the visual world study: Results

Proportion of fixations to objects in the **General CI-Uninformative Mod** condition

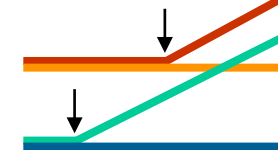


# EXP 1 the visual world study: Results

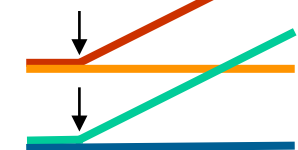
Proportion of fixations to the **target object** (e.g., table)



Overload

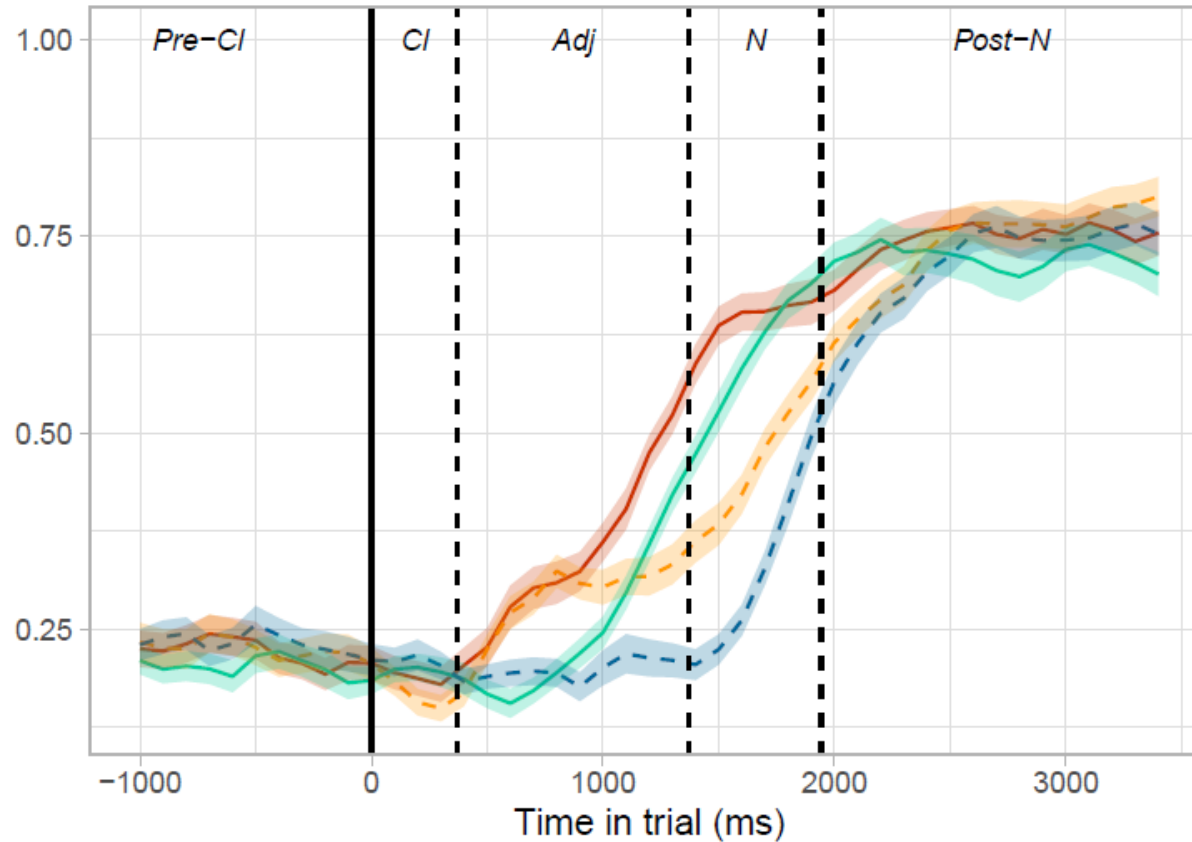


Resilient

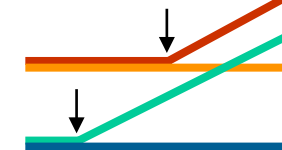


# EXP 1 the visual world study: Results

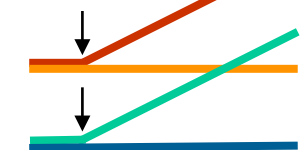
Proportion of fixations to the **target object** (e.g., table)



Overload



Resilient



- Specific CI, Informative Mod
- - Specific CI, Uninformative Mod
- General CI, Informative Mod
- - General CI, Uninformative Mod

# EXP 1 the visual world study: Results

## Bootstrapping analysis

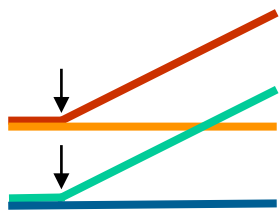
(Stone et al. 2021)

Following a specific classifier  
819 ms, 95% CI = [740, 900]

Following a general classifier  
804 ms, 95% CI = [760, 860]

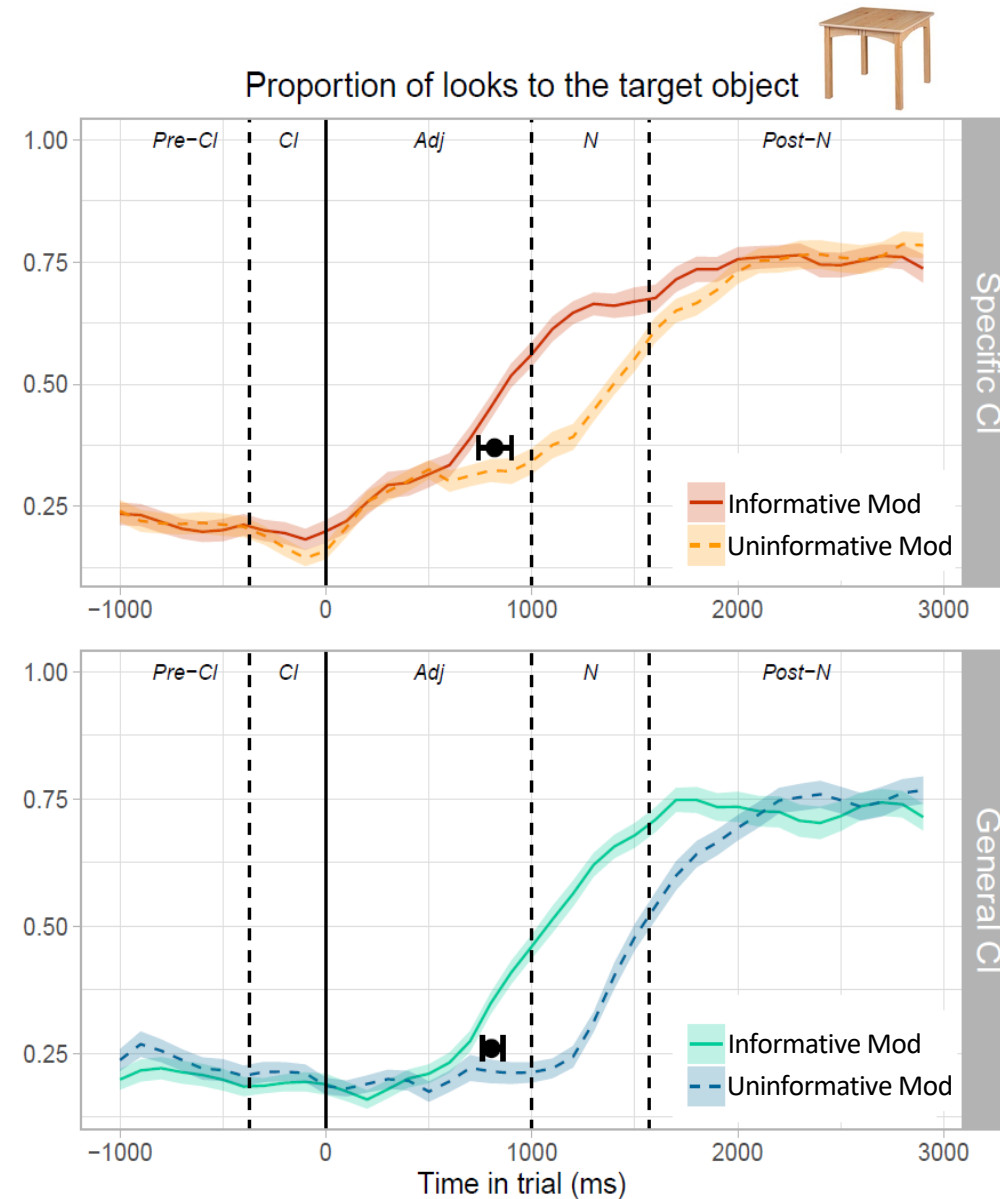


Resilient



No difference in  
divergence points

Consecutive prediction updating  
without measurable cost



# EXP 2 the ERP study: Method

## ! Candidate objects were already present on the screen

In the absence of a visual display, the target noun could receive higher competition with all other possible nouns, and prediction updating might be hindered.

In EXP 2 the ERP study (38 participants, 164 items), we used the same design. Participants read sentences presented word by word at a fixed rate, with **no pre-selected candidates available**.

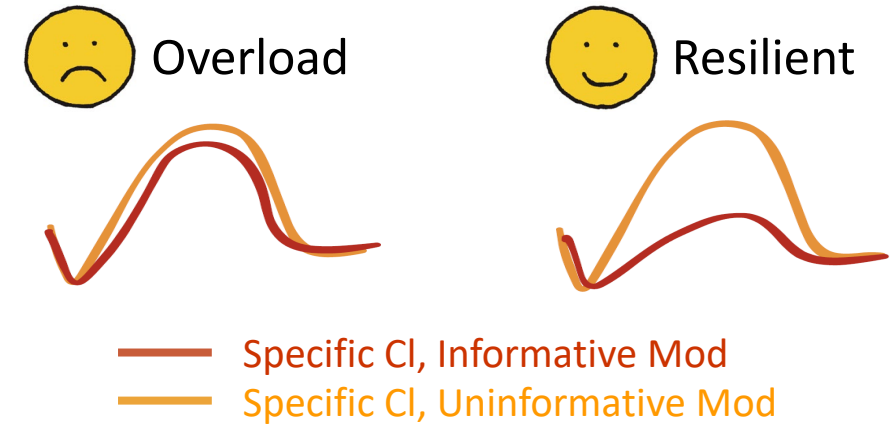
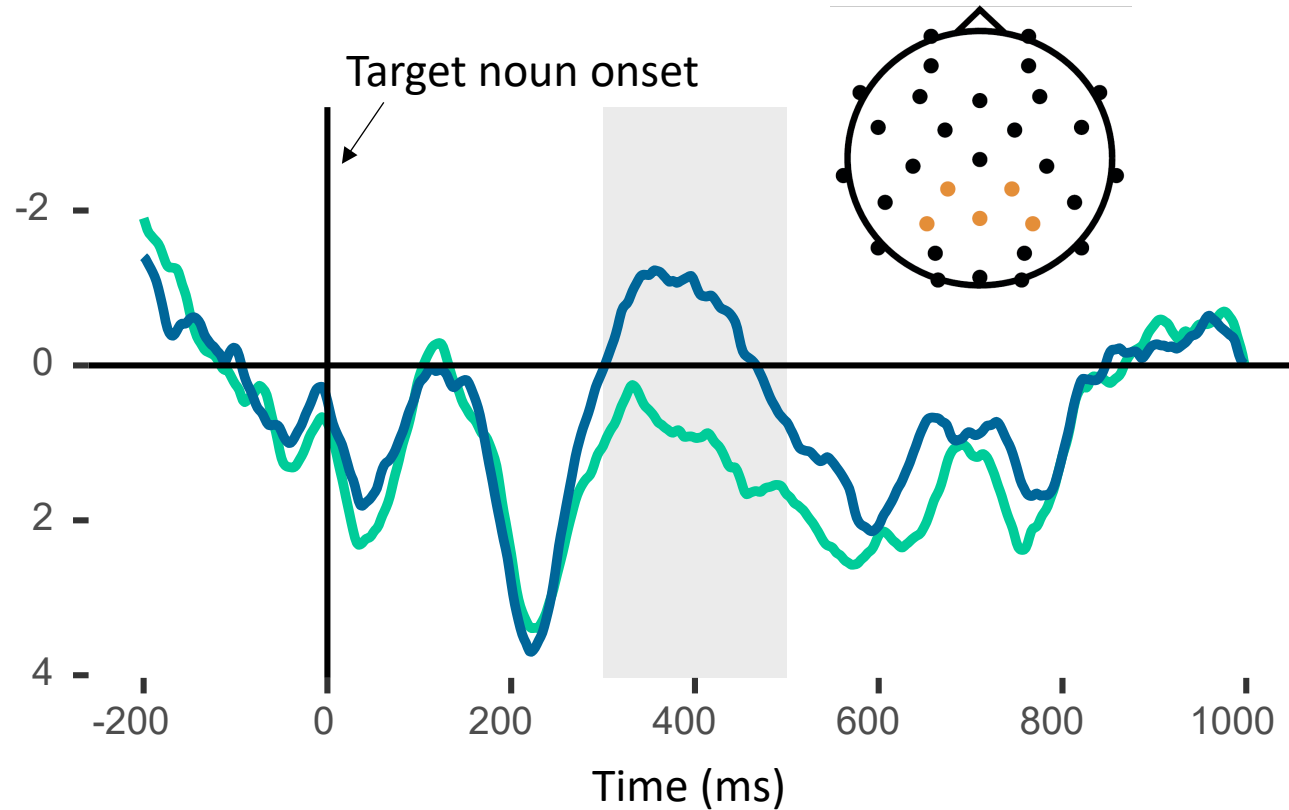
老家的院子里种了很多绿色植物，院子中央有...

The old house's courtyard is full of greenery, and in its centre, there is/are ...

— 张 {下棋的/好看的} 桌子  
one **CL<sub>zhang</sub>** {chess-playing / good-looking} table

— 些 {下棋的/好看的} 桌子  
one **CL<sub>xie</sub>** {chess-playing / good-looking} table

# EXP 2 the ERP study: Results



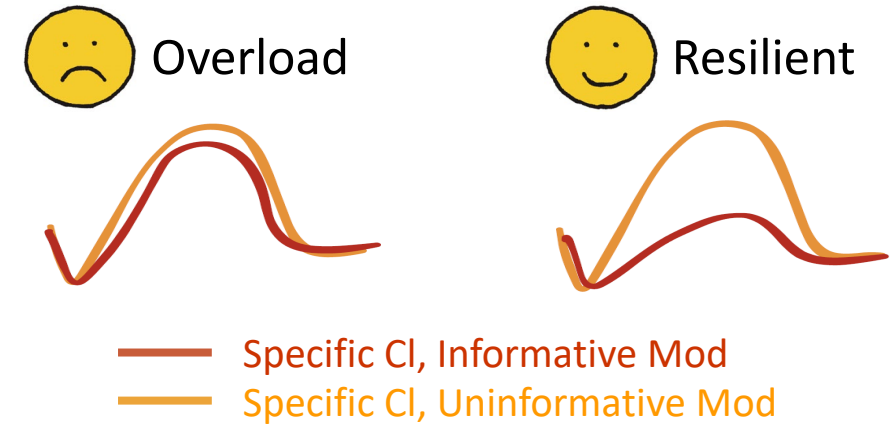
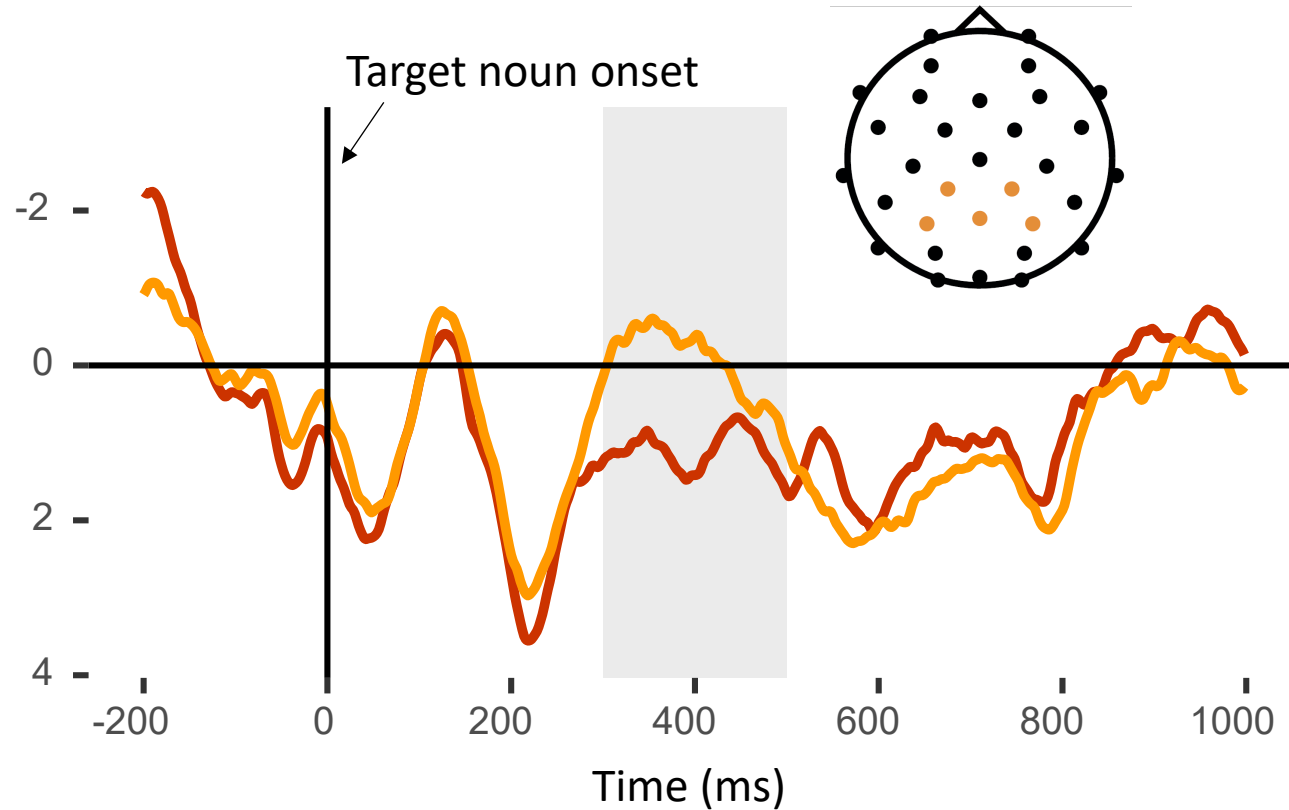
The old house's courtyard is full of greenery, and in its centre, there is ...

— General CI, Informative Mod: one  $CL_{xie}$  chess-playing table ...

— General CI, Uninformative Mod: one  $CL_{xie}$  good-looking table ...



# EXP 2 the ERP study: Results



The old house's courtyard is full of greenery, and in its centre, there is ...

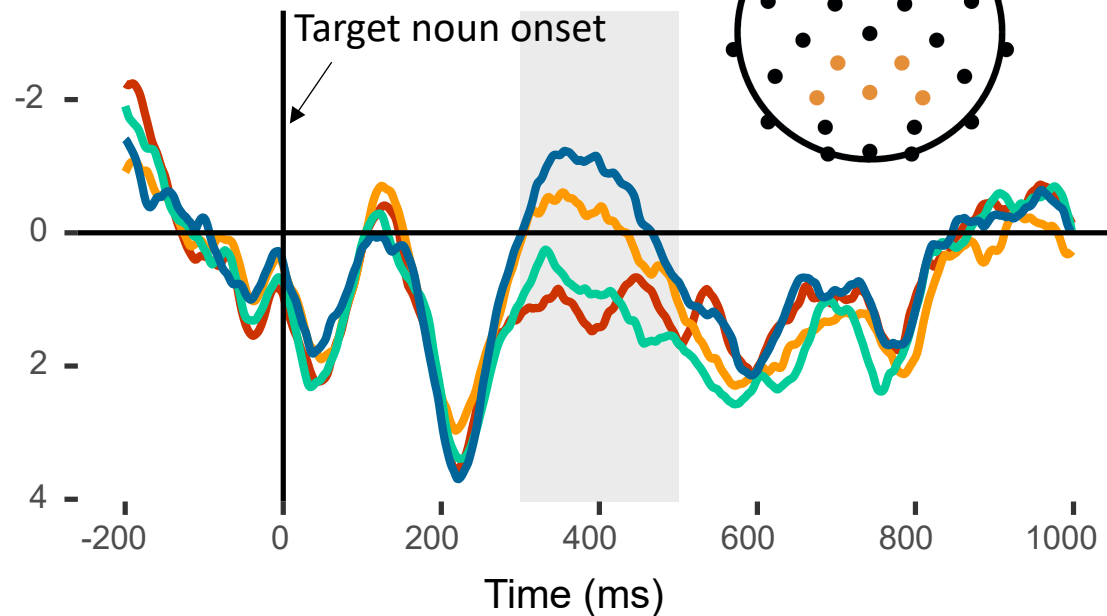
— Specific CI, Informative Mod: one CL<sub>zhang</sub> chess-playing table ...

— Specific CI, Uninformative Mod: one CL<sub>zhang</sub> good-looking table ...

# EXP 2 the ERP study: Results

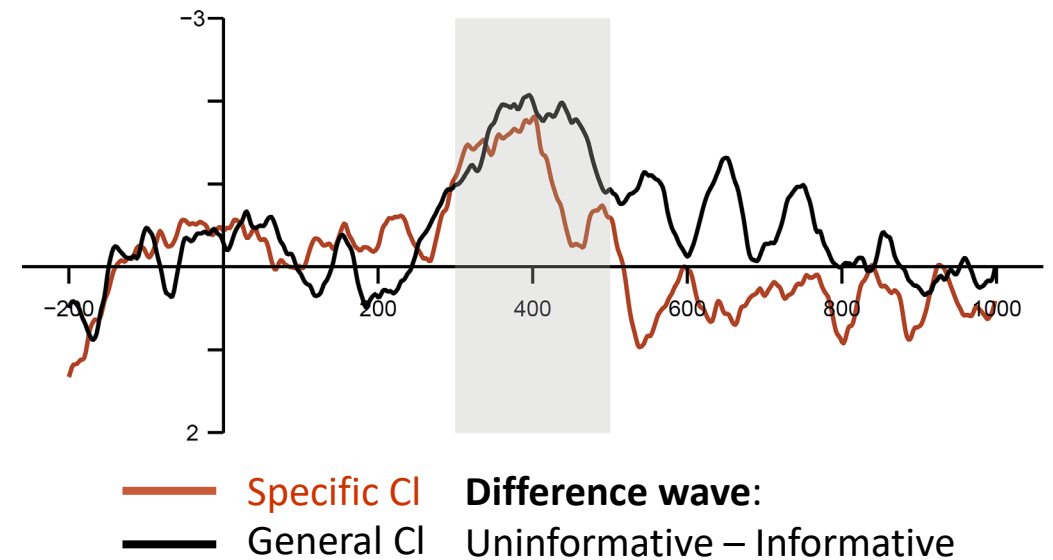
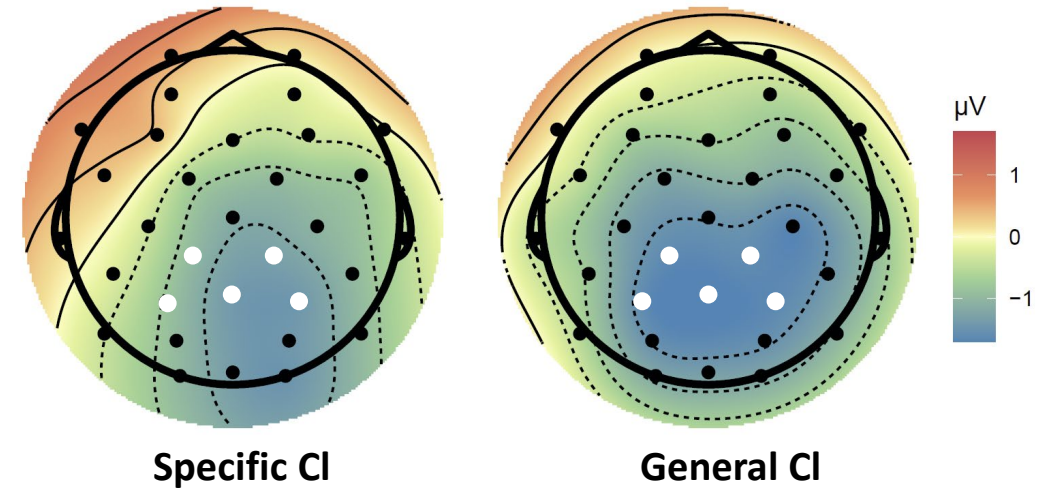
## Centro-parietal Cluster, 300-500 ms

Main effect of classifier  
Main effect of modifier



The old house's courtyard is full of greenery, and in its centre, there is ...

- Specific CI, Informative Mod: one CL<sub>zhang</sub> chess-playing table ...
- Specific CI, Uninformative Mod: one CL<sub>zhang</sub> good-looking table ...
- General CI, Informative Mod: one CL<sub>xie</sub> chess-playing table ...
- General CI, Uninformative Mod: one CL<sub>xie</sub> good-looking table ...



# Conclusion

## EXP 1 Eye movements

- Listeners looked towards the unexpected target object upon hearing a specific classifier and informative modifier.
- The divergence points between the modifier conditions occurred at similar times following both specific and general classifiers.

## EXP 2 ERP

- The N400 response to the critical unexpected noun was reduced when it was preceded by a specific classifier and an informative modifier.
- The modulation of the N400 amplitude due to the modifier was not affected by the preceding classifier.

An early sign of prediction error (i.e., a specific classifier) did not incur measurable costs that would affect subsequent semantic processing (i.e., the use of an informative modifier).

**Comprehenders can use consecutive cues to update predictions effectively.**

# Conclusion



**We are resilient comprehenders!**

Resilience:

“an ability to recover from or adjust easily to misfortune or change”

– Merriam-Webster Dictionary

# Thank You

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## Reference

- Altmann, G. T. M., & Kamide, Y. (1999). Incremental interpretation at verbs: Restricting the domain of subsequent reference. *Cognition*, 73(3), 247–264. [https://doi.org/10.1016/S0010-0277\(99\)00059-1](https://doi.org/10.1016/S0010-0277(99)00059-1)
- Chow, W.-Y., & Chen, D. (2020). Predicting (in)correctly: Listeners rapidly use unexpected information to revise their predictions. *Language, Cognition and Neuroscience*, 35(9), 1149–1161. <https://doi.org/10.1080/23273798.2020.1733627>
- DeLong, K. A., Urbach, T. P., & Kutas, M. (2005). Probabilistic word pre-activation during language comprehension inferred from electrical brain activity. *Nature Neuroscience*, 8(8), 1117–1121. <https://doi.org/10.1038/nn1504>
- Federmeier, K. D., & Kutas, M. (1999). A Rose by Any Other Name: Long-Term Memory Structure and Sentence Processing. *Journal of Memory and Language*, 41(4), 469–495. <https://doi.org/10.1006/jmla.1999.2660>
- Fleur, D. S., Flecken, M., Rommers, J., & Nieuwland, M. S. (2020). Definitely saw it coming? The dual nature of the pre-nominal prediction effect. *Cognition*, 204, 104335. <https://doi.org/10.1016/j.cognition.2020.104335>
- Gussow, A. E., Kapnoula, E. C., & Molinaro, N. (2019). Any leftovers from a discarded prediction? Evidence from eye-movements during sentence comprehension. *Language, Cognition and Neuroscience*, 34(8), 1041–1058. <https://doi.org/10.1080/23273798.2019.1617887>
- Husband, E. M., & Bovolenta, G. (2020). Prediction failure blocks the use of local semantic context. *Language, Cognition and Neuroscience*, 35(3), 273–291. <https://doi.org/10.1080/23273798.2019.1651881>
- Kamide, Y., Altmann, G. T. M., & Haywood, S. L. (2003). The time-course of prediction in incremental sentence processing: Evidence from anticipatory eye movements. *Journal of Memory and Language*, 49(1), 133–156. [https://doi.org/10.1016/S0749-596X\(03\)00023-8](https://doi.org/10.1016/S0749-596X(03)00023-8)
- Kutas, M., DeLong, K. A., & Smith, N. J. (2011). A look around at what lies ahead: Prediction and predictability in language processing. In *Predictions in the brain: Using our past to generate a future*. Oxford University Press. <https://doi.org/10.1093/acprof:oso/9780195395518.001.0001>
- Ryskin, R., & Nieuwland, M. S. (2023). Prediction during language comprehension: What is next? *Trends in Cognitive Sciences*, 0(0). <https://doi.org/10.1016/j.tics.2023.08.003>
- Stone, K., Lago, S., & Schad, D. J. (2021). Divergence point analyses of visual world data: Applications to bilingual research. *Bilingualism: Language and Cognition*, 24(5), 833–841. <https://doi.org/10.1017/S1366728920000607>
- Szewczyk, J. M., Mech, E. N., & Federmeier, K. D. (2022). The power of “good”: Can adjectives rapidly decrease as well as increase the availability of the upcoming noun? *Journal of Experimental Psychology: Learning, Memory, and Cognition*, 48(6), 856–875. <https://doi.org/10.1037/xlm0001091>
- Szewczyk, J. M., & Schriefers, H. (2013). Prediction in language comprehension beyond specific words: An ERP study on sentence comprehension in Polish. *Journal of Memory and Language*, 68(4), 297–314. <https://doi.org/10.1016/j.jml.2012.12.002>
- Szewczyk, J. M., & Wodniecka, Z. (2020). The mechanisms of prediction updating that impact the processing of upcoming word: An event-related potential study on sentence comprehension. *Journal of Experimental Psychology: Learning, Memory, and Cognition*, 46(9), 1714–1734. <https://doi.org/10.1037/xlm0000835>
- Wicha, N. Y. Y., Moreno, E. M., & Kutas, M. (2004). Anticipating Words and Their Gender: An Event-related Brain Potential Study of Semantic Integration, Gender Expectancy, and Gender Agreement in Spanish Sentence Reading. *Journal of Cognitive Neuroscience*, 16(7), 1272–1288. <https://doi.org/10.1162/0898929041920487>

# Cloze probability tasks

We did three rounds of offline cloze tasks.

- Before the classifier

*It's too dark. To read the words on the book, Jack brings one \_\_\_\_\_.*

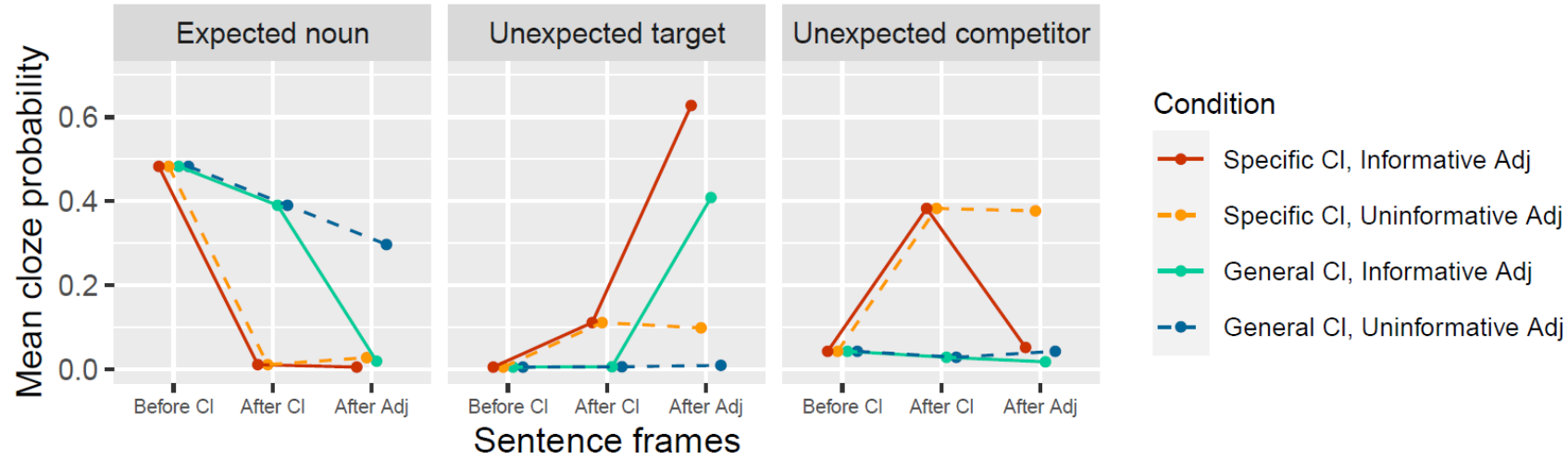
- After the classifier but before the adjective

*It's too dark. To read the words on the book, Jack brings one {CL\_specific/CL\_general} \_\_\_\_\_.*

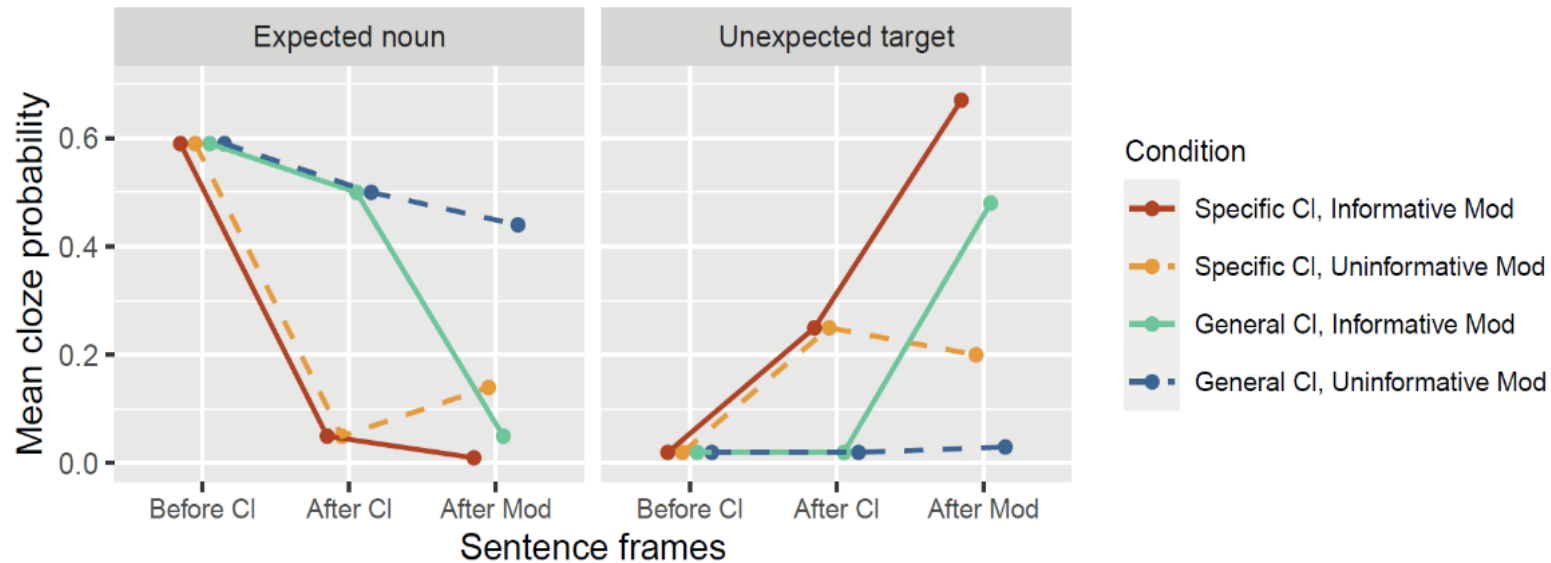
- After the adjective but before the noun

*It's too dark. To read the words on the book, Jack brings one {CL\_specific/CL\_general} {Mod\_informative/Mod\_uninformative} \_\_\_\_\_.*

# Cloze probability tasks



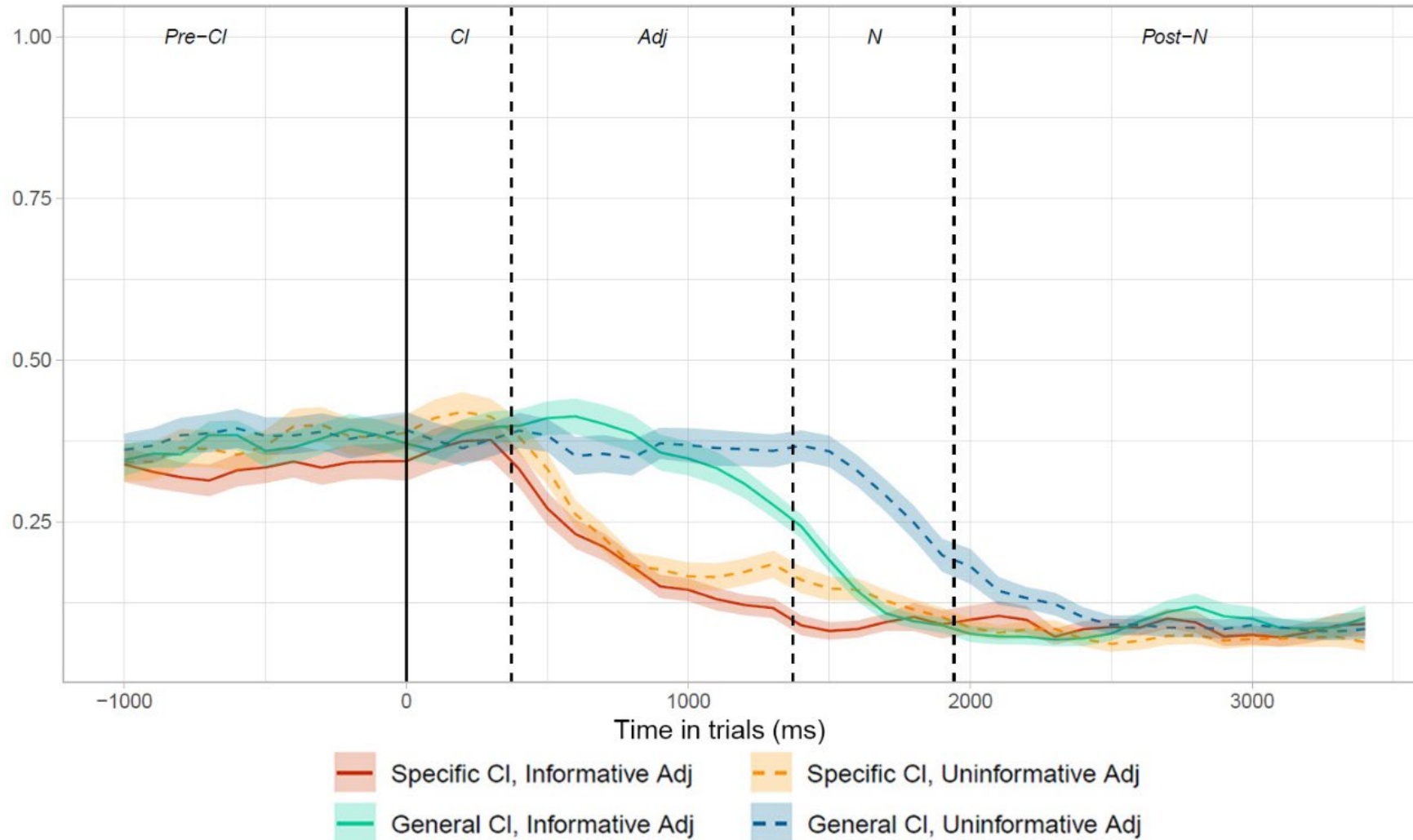
← **Visual-world study**



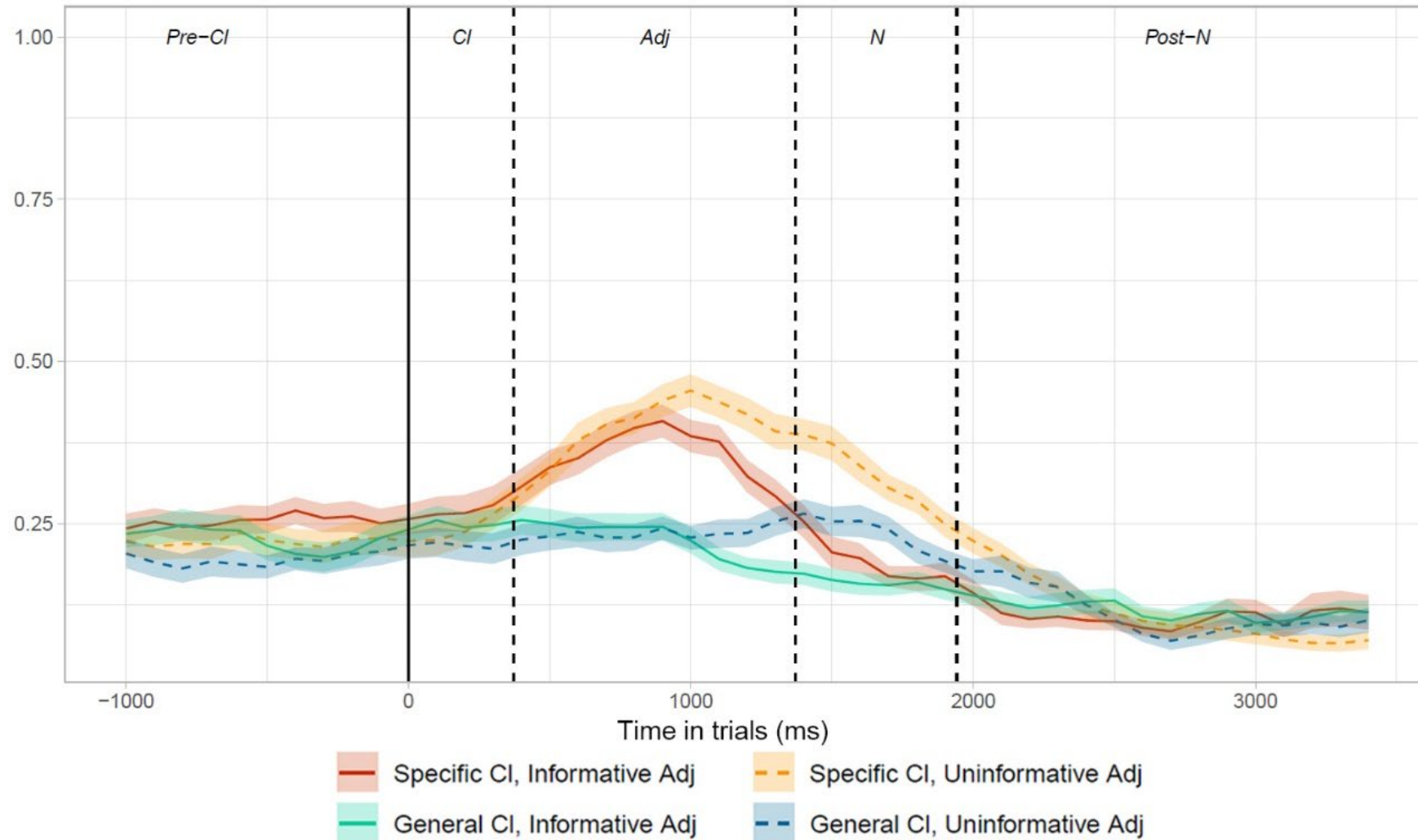
← **ERP study**



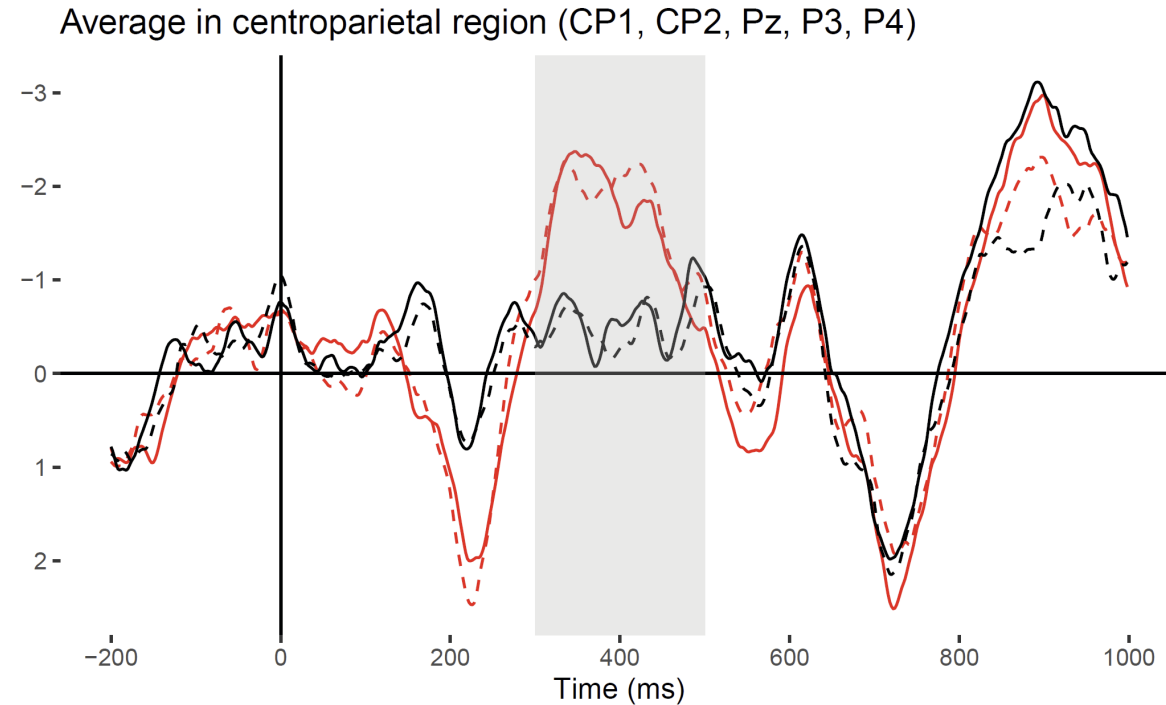
Looks to the expected object



Looks to the unexpected competitor



# ERP at the classifier

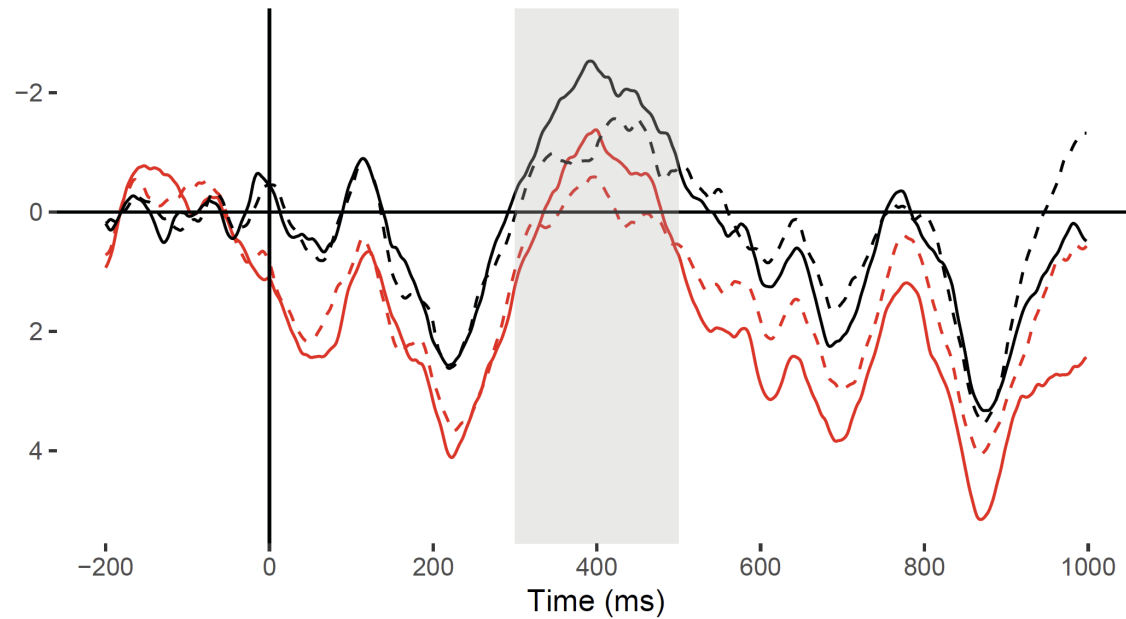


Main effect of classifier  
(collapsed over modifier conditions)

- Specific CI, Informative Mod: one CL<sub>zhang</sub> chess-playing table ...
- - Specific CI, Uninformative Mod: one CL<sub>zhang</sub> good-looking table ...
- General CI, Informative Mod: one CL<sub>xie</sub> chess-playing table ...
- - General CI, Uninformative Mod: one CL<sub>xie</sub> good-looking table ...

# ERP at the modifier

Average in centroparietal region (CP1, CP2, Pz, P3, P4)

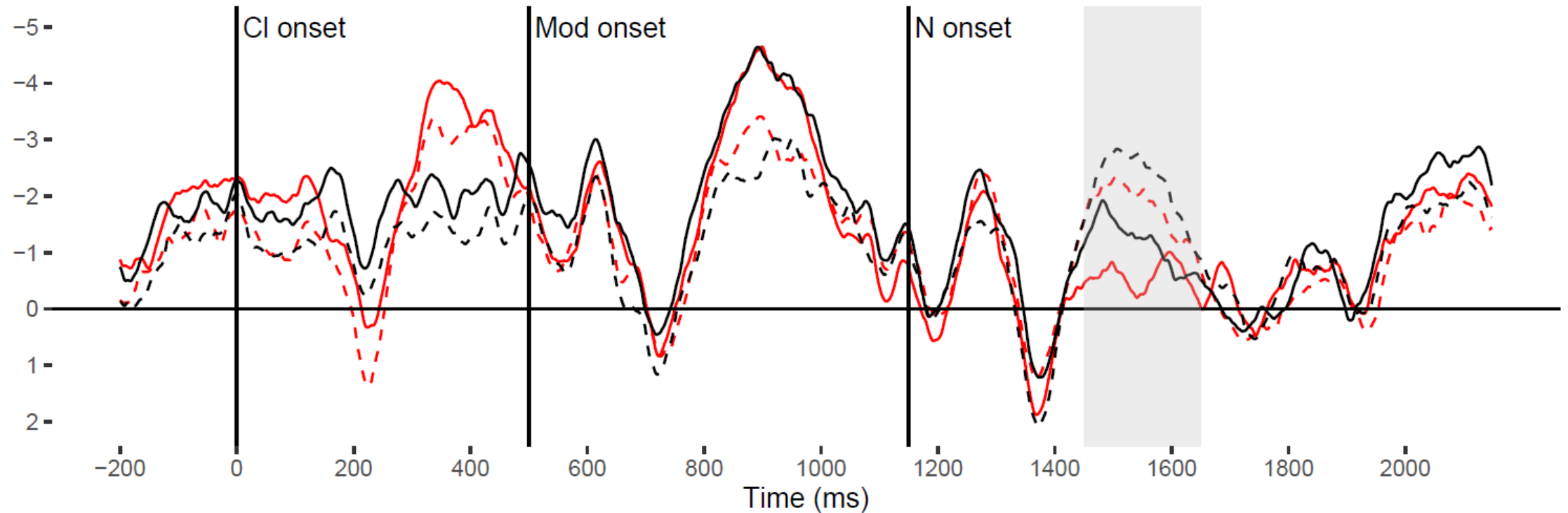


Main effect of classifier  
Main effect of modifier

- Specific CI, Informative Mod: one CL<sub>zhang</sub> chess-playing table ...
- - Specific CI, Uninformative Mod: one CL<sub>zhang</sub> good-looking table ...
- General CI, Informative Mod: one CL<sub>xie</sub> chess-playing table ...
- - General CI, Uninformative Mod: one CL<sub>xie</sub> good-looking table ...

# ERP long epoch (no baseline correction)

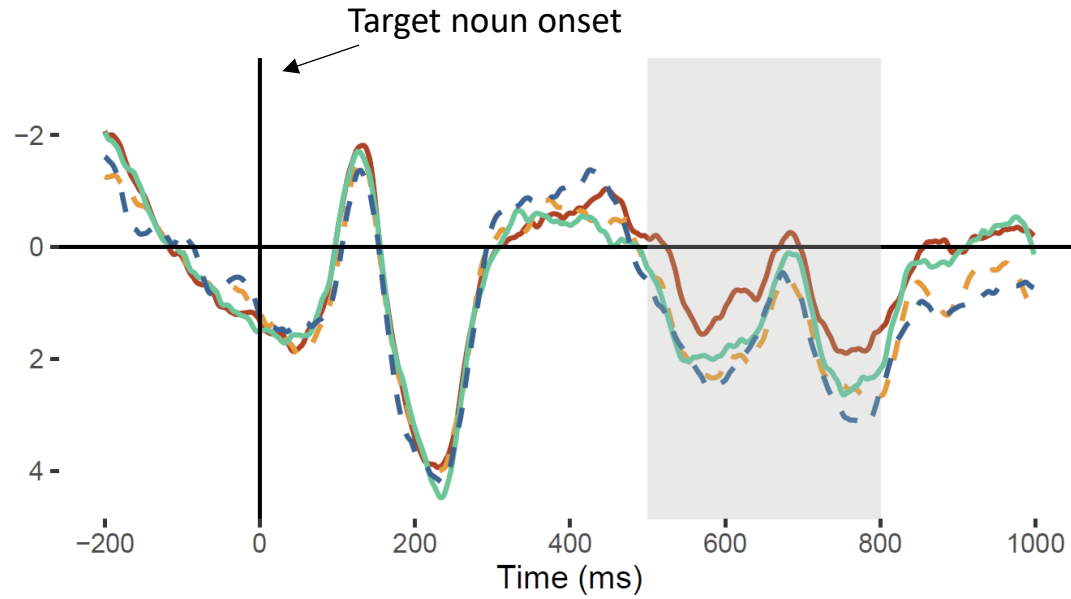
Average in centroparietal region (CP1, CP2, Pz, P3, P4)



- Specific CI, Informative Mod: one CL<sub>zhang</sub> chess-playing table ...
- - Specific CI, Uninformative Mod: one CL<sub>zhang</sub> good-looking table ...
- General CI, Informative Mod: one CL<sub>xie</sub> chess-playing table ...
- - General CI, Uninformative Mod: one CL<sub>xie</sub> good-looking table ...

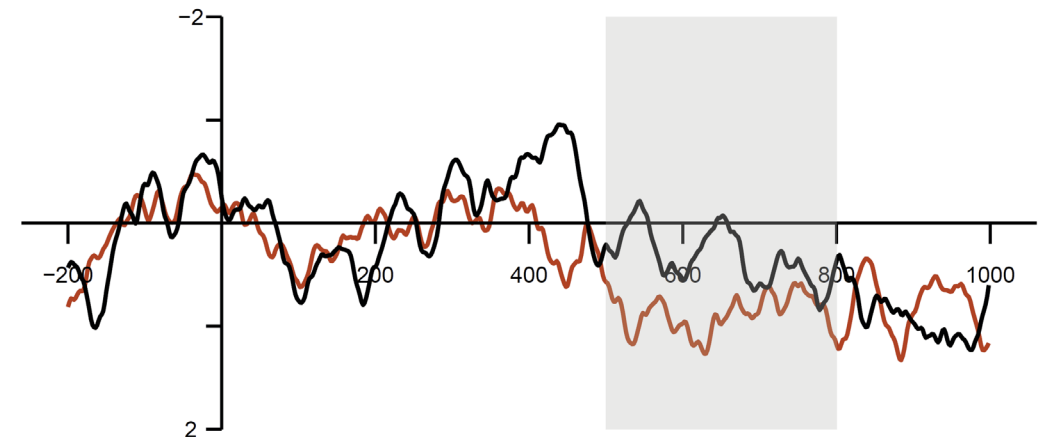
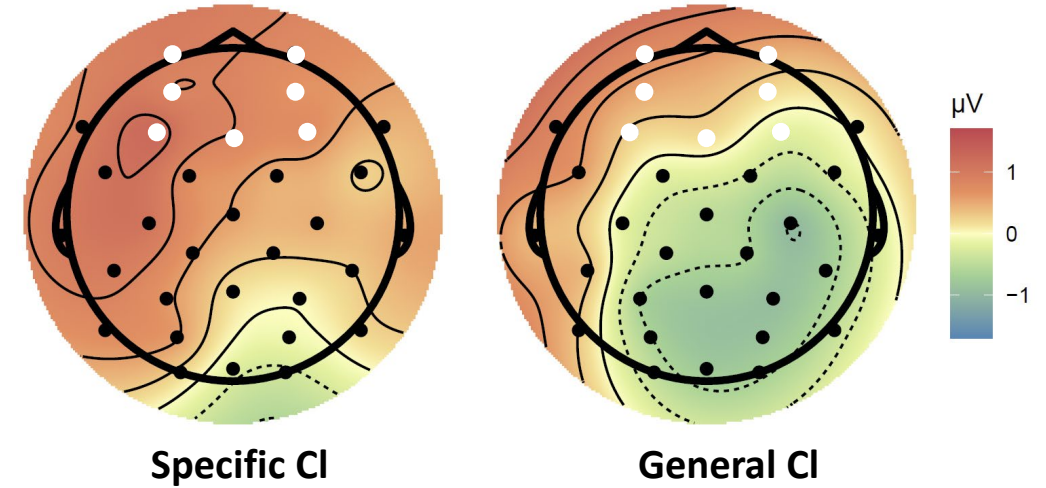
# Frontal Cluster, 500-800 ms

Only a marginal effect of modifier



The old house's courtyard is full of greenery, and in its centre, there is ...

- Specific CI, Informative Mod: one CL<sub>zhang</sub> chess-playing table ...
- - Specific CI, Uninformative Mod: one CL<sub>zhang</sub> good-looking table ...
- General CI, Informative Mod: one CL<sub>xie</sub> chess-playing table ...
- - General CI, Uninformative Mod: one CL<sub>xie</sub> good-looking table ...



- Specific CI
  - General CI
- Difference wave:**  
Uninformative – Informative

# Prediction error can disrupt subsequent semantic processing?

Husband and Bovolenta (2020) demonstrated that comprehenders couldn't take advantage of informative adjectives after they encountered a prediction error.

*(originally in Italian)*

*Before the execution, the  
condemned person had .....*

**(expected: meal<sub>M</sub>)**

Congruent article

*Many claim that the secretary stole  
some money, but he refused .....*

**(expected: accusation<sub>F</sub>)**

Incongruent article **(signals a prediction error)**

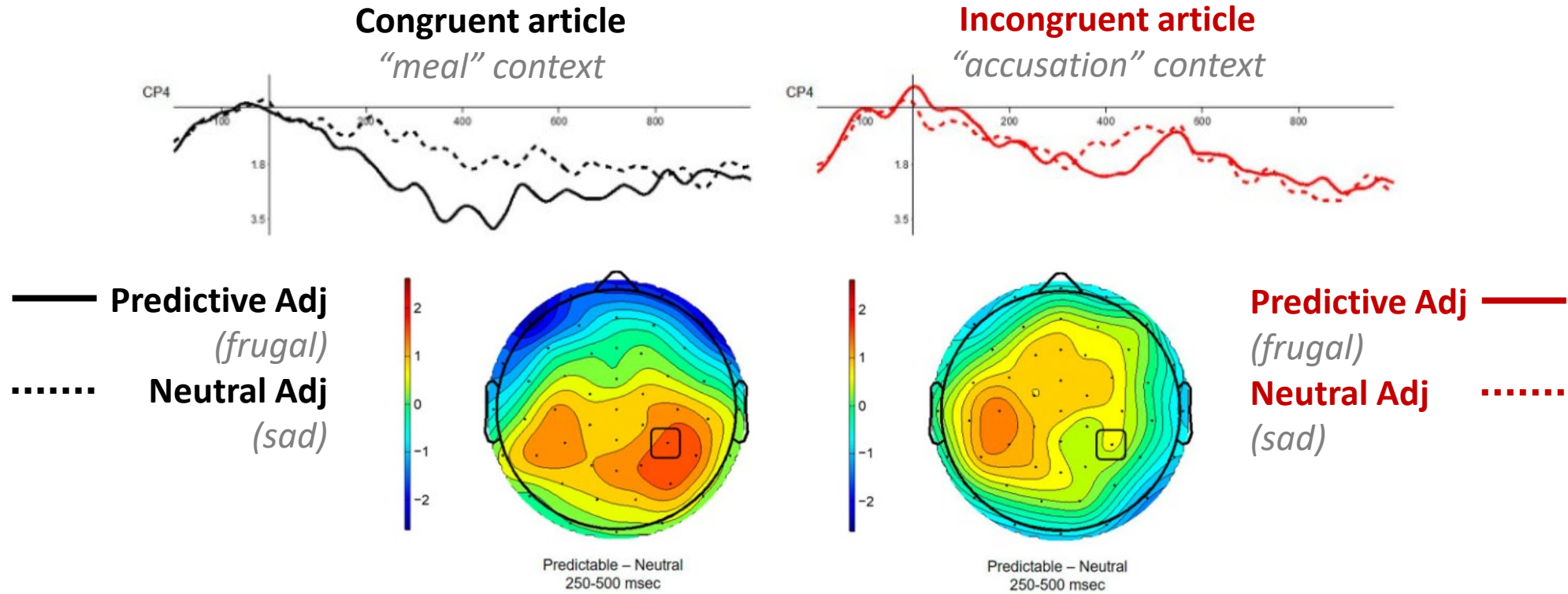
**a<sub>M</sub>** {frugal<sub>M</sub> / sad<sub>M</sub>} meal<sub>M</sub>

Predictive Adj

Neutral Adj

# Prediction error can disrupt subsequent semantic processing?

Husband and Bovolenta (2020) demonstrated that comprehenders couldn't take advantage of informative adjectives after they encountered a prediction error.





# Prediction error can disrupt subsequent semantic processing?

However, Husband and Bovolenta (2020) defined predictive/neutral adjective by co-occurrence frequencies

- i.e., the conditional probability of the noun given the adjective in an Italian corpus.
- It is possible that the predictive adjectives were not truly predictive of the noun in the sentence context they used in the experiment.
- In fact, as the target noun was **implausible** following an incongruent article in most items, even the predictive adjective could not make the noun more likely in these sentence contexts.