

How BabyLMs Learn Filler-Gap Dependencies

Chi-Yun Chang, Xueyang Huang, Humaira Nasir,
Shane Storks, Olawale Akingbade, Huteng Dai



... about LMs

What we know:

- ❖ Domain-general blackbox
- ❖ LARGE
- ❖ LMs can produce human-like sentences

What we don't know:

- ❖ Small datasets?
- ❖ Human-like knowledge?
- ❖ Do LMs still learn complex syntactic structures?

Overview

- ❖ LMs trained on child-oriented input can approximate *filler-gap dependencies*
- ❖ But they failed to learn sensitivity to *island effects*

How human babies learn languages

Noisy, limited input

Rapid learning rate

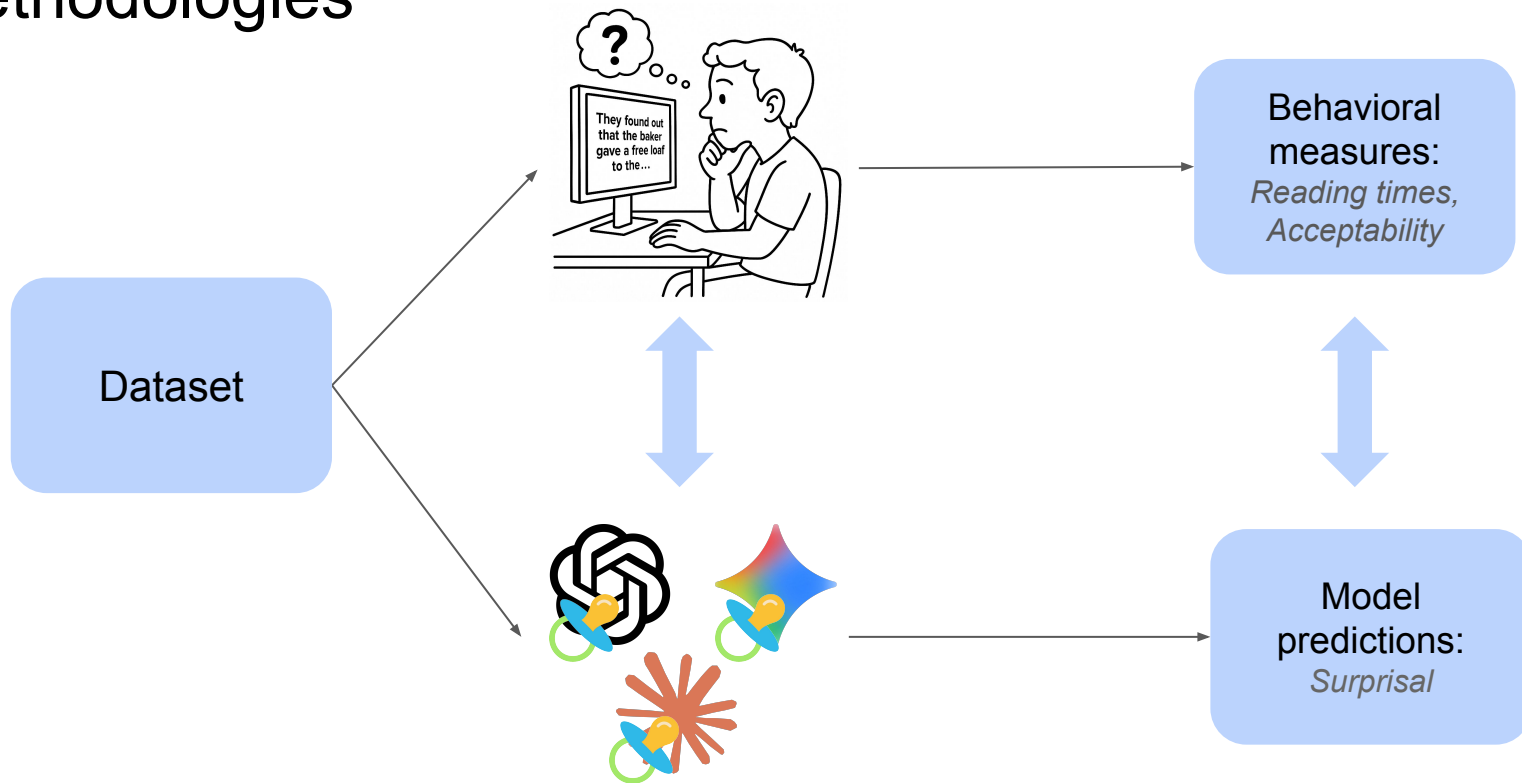


Young Noam

1-2 yo — comprehension of syntactic dependencies

5-6 yo — exhibit near-adult to adult level comprehension and representation

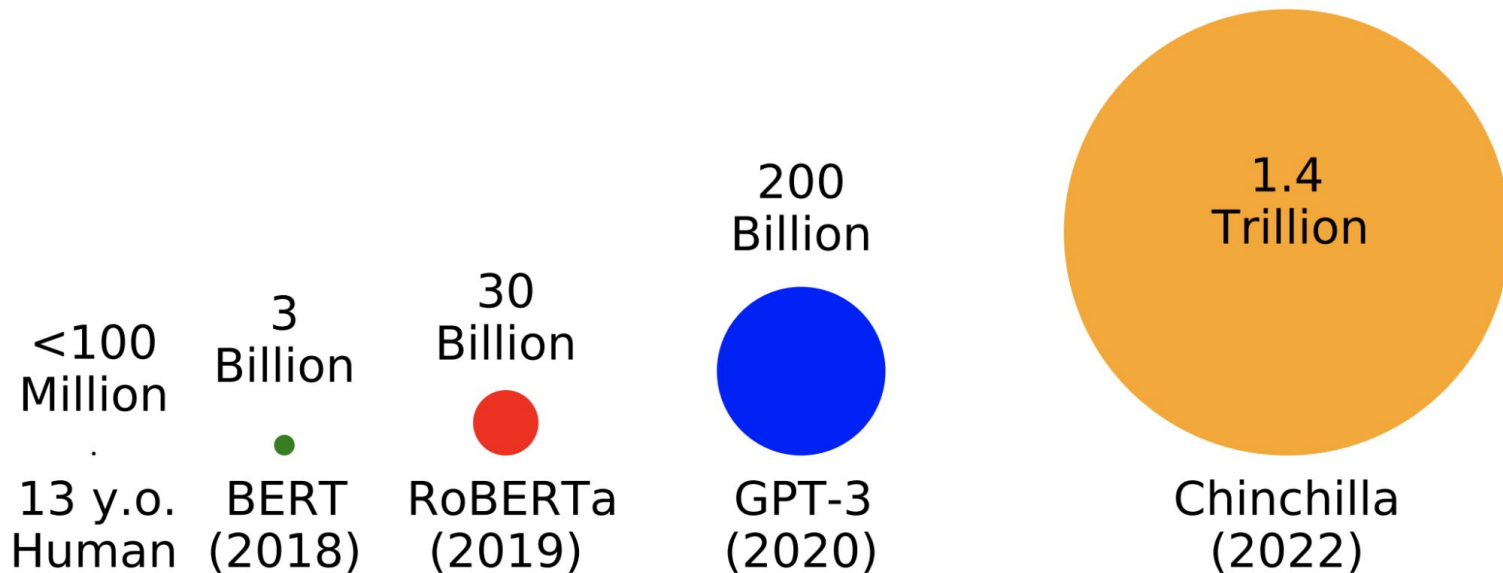
Methodologies



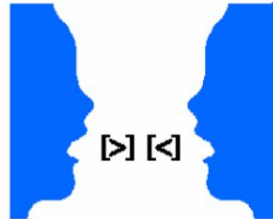


BabyLM Challenge

Sample-efficient pretraining on a developmentally plausible corpus



Warstadt et al. (2023), Hu et al. (2024)



MOT: what do you want me to do ?

CHI: oh !

CHI: &-uh .

MOT: wait a moment .

MOT: put the yellow one down .

CHI: 0 .

MOT: put the green one down .

CHI: 0 .

MOT: that's a boy .

MOT: put it on there .

MOT: now (.) try the orange one .

Filler-gap dependencies 🕒

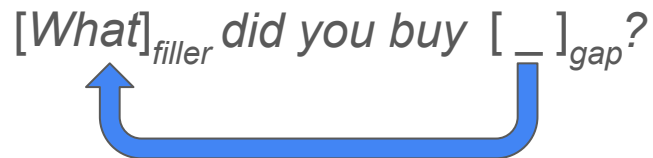
... a *filler* (e.g., *who* and *what*) that licenses a *gap*

did you buy what ?

Ross (1967); Wilcox et al. (2018, 2024)

Filler-gap dependencies

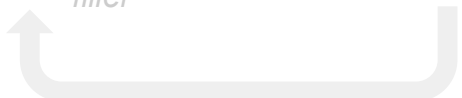
... a *filler* (e.g., *who* and *what*) that licenses a *gap*



Ross (1967); Wilcox et al. (2018, 2024)

Filler-gap dependencies 🕒

... a *filler* (e.g., *who* and *what*) that licenses a *gap*

[*What*]_{filler} did you buy [_]_{gap}?


Island constraints 🏝️

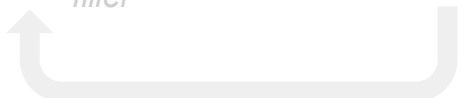
The movement of a *filler* can be blocked by some clauses aka. “syntactic islands”

did he leave [*before she finished what*]_{island}?

Ross (1967); Wilcox et al. (2018, 2024)

Filler-gap dependencies 🕒

... a *filler* (e.g., *who* and *what*) that licenses a *gap*

[*What*]_{filler} did you buy []_{gap}?


Island constraints 🏝️

The movement of a *filler* can be blocked by some clauses aka. “syntactic islands”

**What* did he leave [*before she finished* ____]_{island}?


Ross (1967); Wilcox et al. (2018, 2024)

Models



Experiment Design

	+filler	-filler
+gap	I know what the students should take ____.	
-gap		I know that the students should take linguistics.

Dependency manipulations: gap distance × direct obj., gap distance × indirect obj.)

Two types of syntactic islands: wh-islands, adjunct-islands

Wilcox et al. (2018, 2024)

Wh-licensing score

$$[\text{Surprisal}(+\text{filler}, -\text{gap}) - \text{Surprisal}(-\text{filler}, -\text{gap})]$$
$$-[\text{Surprisal}(+\text{filler}, +\text{gap}) - \text{Surprisal}(-\text{filler}, +\text{gap})]$$

A **positive** value is expected when you have a filler-gap dependency

Word-level

GPT2-10M

GPT2-100M

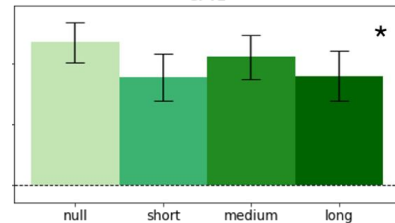
Full-size GPT2

Gap Distance × Direct Obj.

Gap Distance × Indirect Obj.

wh-islands

adjunct-islands



Clause-level

GPT2-10M

GPT2-100M

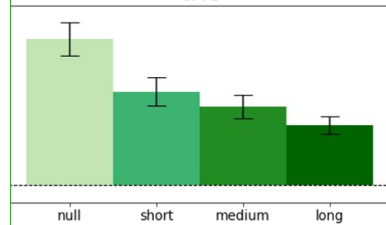
Full-size GPT2

Gap Distance × Direct Obj.

Gap Distance × Indirect Obj.

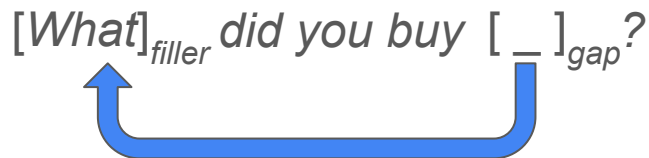
wh-islands

adjunct-islands



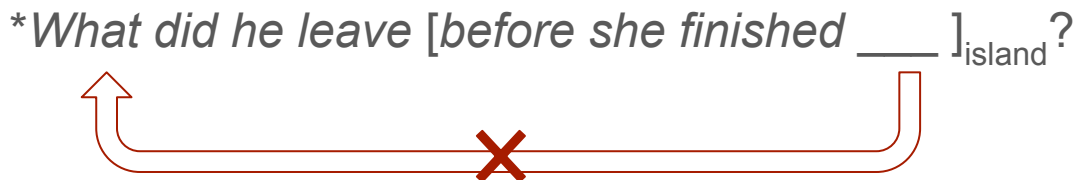
Filler-gap dependencies 🕒

... a *filler* (e.g., *who* and *what*) that licenses a *gap*



Island constraints 🏝️

The movement of a *filler* can be blocked by some clauses aka. “syntactic islands”



Ross (1967); Wilcox et al. (2018, 2024)

Take-home Messages

- ❖ GPT-2 models trained on child-oriented input can approximate *filler-gap dependencies* in human languages;
- ❖ But unlike humans, they failed to learn any island constraints



Chi-Yun Chang



Xueyang Huang



Humaira Nasir



Shane Storks



Olawale Akingbade



Huteng Dai

The End

We thank

Anonymous reviewers

Yi Tao

Richard Futrell

Steve Abney

Jon Brennan

Acrisio Pires

Andrew McInnerney

UM Computational Neurolinguistics Lab

BabyLM Challenge organizers