

**Organizers:** Moses Charikar, Anay Mehrotra, Charlotte Peale, Chirag Pabbaraju, Grigoris Velegkas

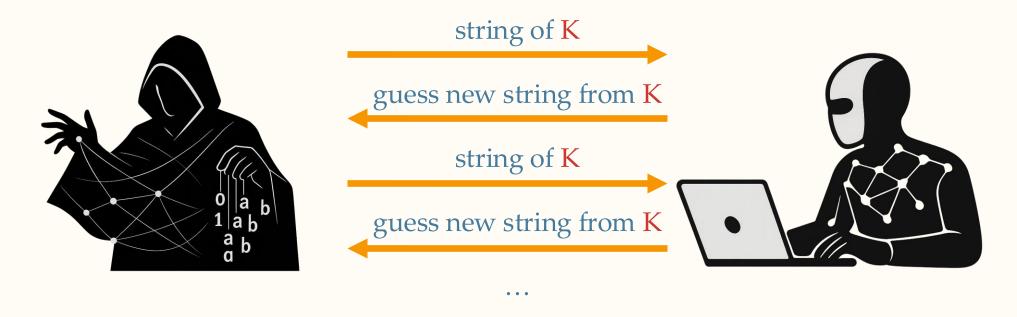
## Validity-Breadth Trade-Off (Part I)

#### This Talk:

- ➤ Why Breadth?
- > Definitions of Breadth + Abstractions
- > Results
- > Step Back
- > Future Directions

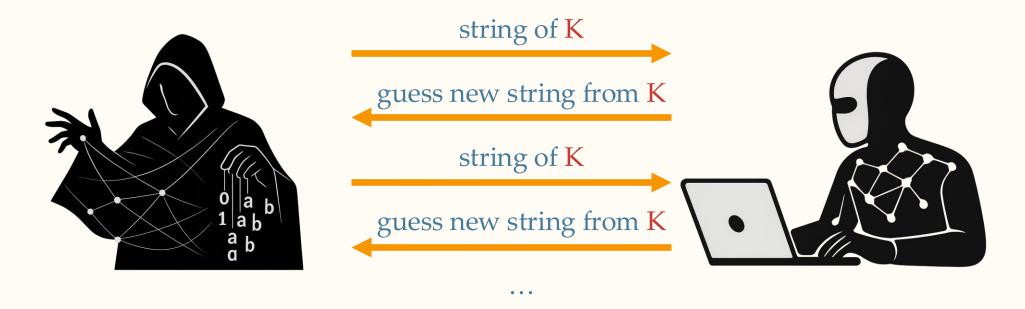
Recap of Language Generation in the Limit

Kleinberg, Mullainathan, 2024



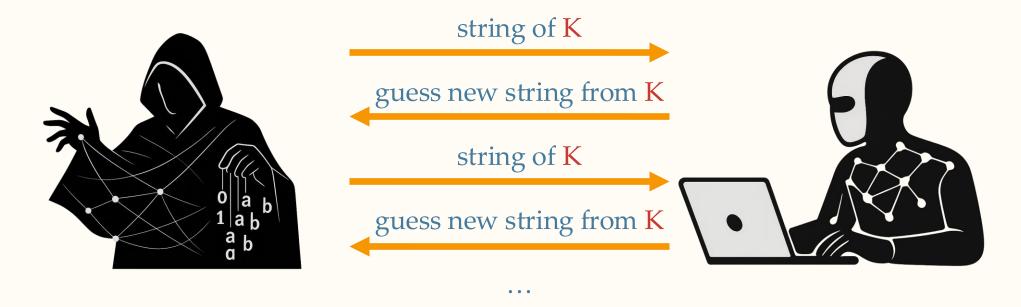
Success: guess correct (i.e., valid and unseen) for every **!** > **!** (We say that algorithm has generated **K** in the limit)

Kleinberg, Mullainathan, 2024



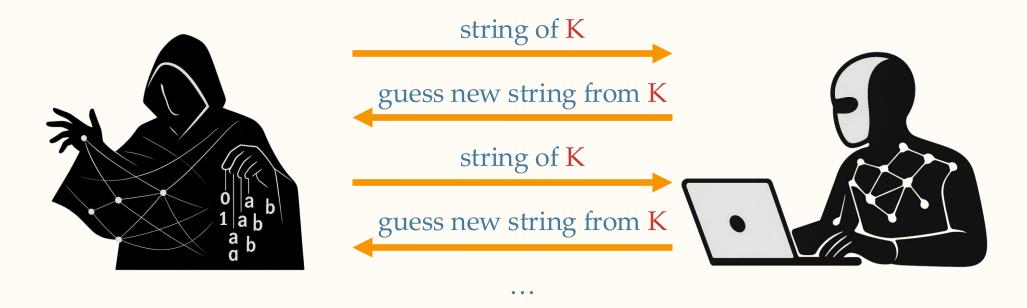
Algorithm never sees negative examples

Kleinberg, Mullainathan, 2024



Algorithm never sees negative examples
No feedback

Kleinberg, Mullainathan, 2024



Algorithm never sees negative examples

No feedback

Assume all languages infinite

## Language Generation in the Limit

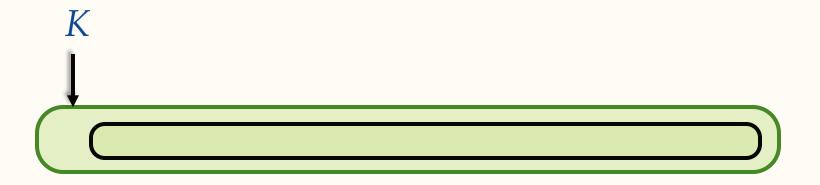
Theorem [Kleinberg, Mullainathan 2024]

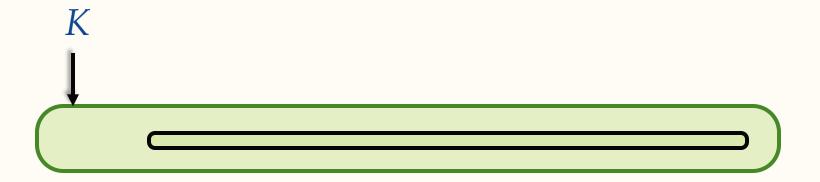
Language generation in the limit is possible for any countable collection of languages

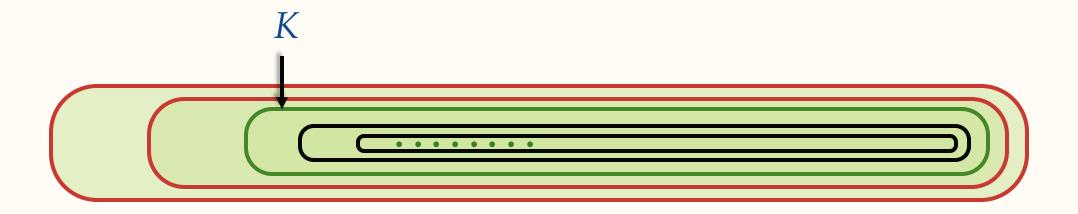


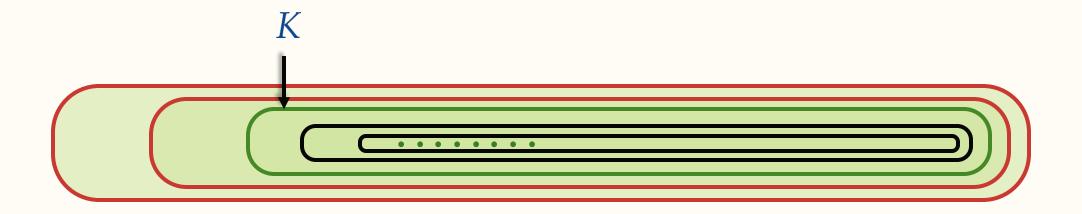




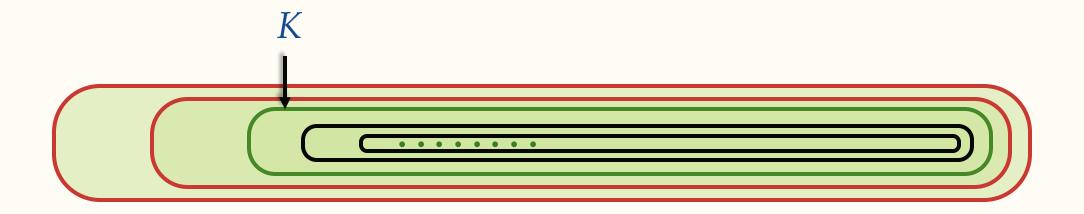




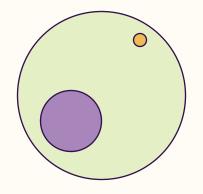




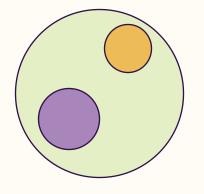
One question asked by [KM24]: Can a generator avoid hallucinations while maintaining some notion of "breadth"



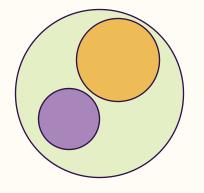
One question asked by [KM24]: Can a generator avoid hallucinations while maintaining some notion of "breadth" Or what is the limit in generation in the limit



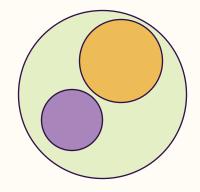
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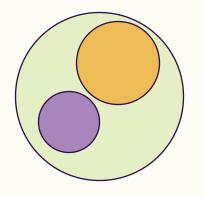


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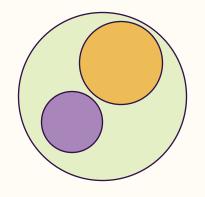
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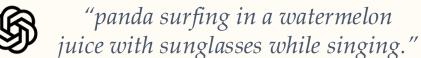
Why is this relevant? Captures how much the "knows"

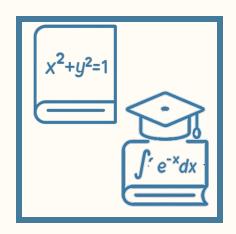


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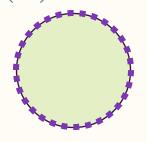
Solve new math problems

For generator G, let  $G(S) \subseteq X$  be the output-set of G trained on S

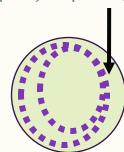
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#### **Set Theoretic Definitions**

Exact Breadth  $G(S) = K \setminus S$ 



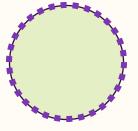
Approximate Breadth  $|(K \setminus S) \setminus G(S)| < \infty$ 



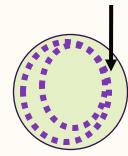
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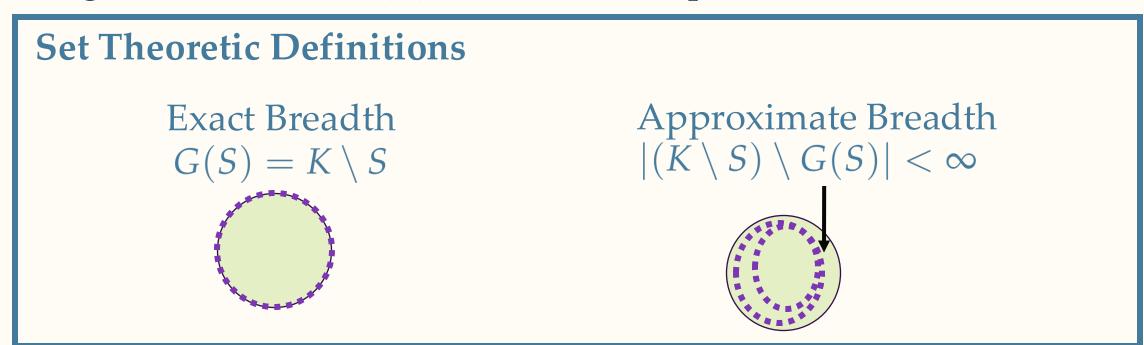


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Consider 
$$K = \mathbb{N}$$
,  $G(S) = \{i, i + 1, ...\}$  and  $G(S) = \{2, 4, 6, ...\}$ 

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Can also require/relax additional properties [CP'25] [KMV'24]

#### Abstractions of Breadth

Most lower bounds for breadth use diagonalization [CP'25] [KMV'24]

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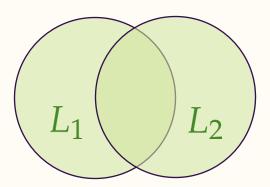
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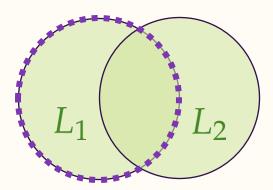




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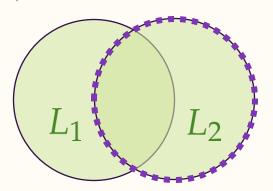




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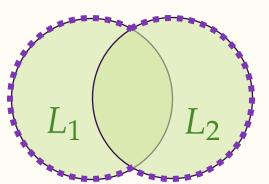




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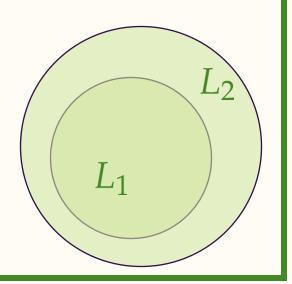
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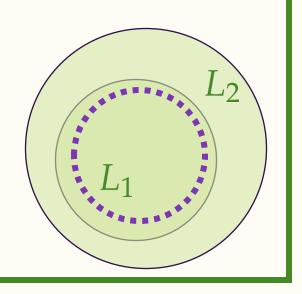
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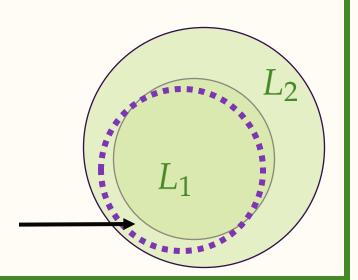
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Can generate things not in  $L_1$ !



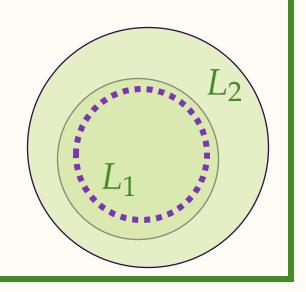
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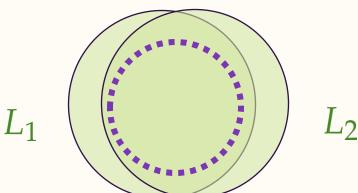
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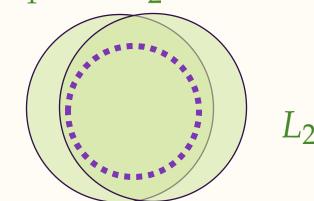
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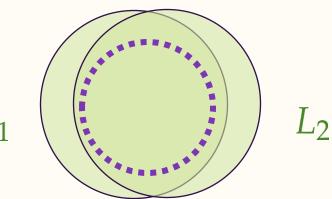
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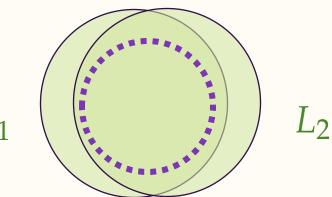
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Other examples: Allow generators to have finite hallucinations

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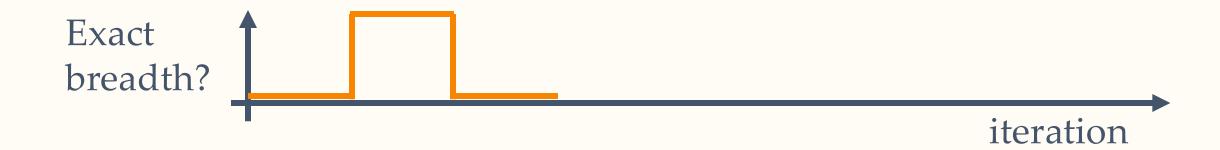
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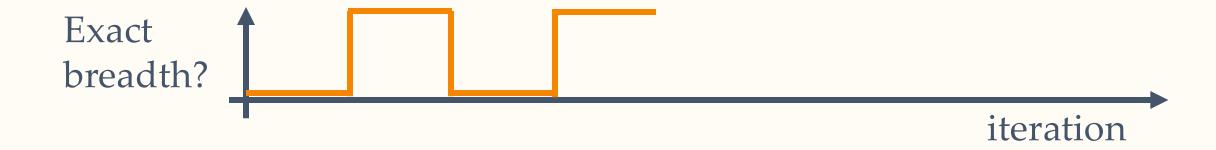
[KMV'25]: (a) extends to statistical model, (b) extends conditionally



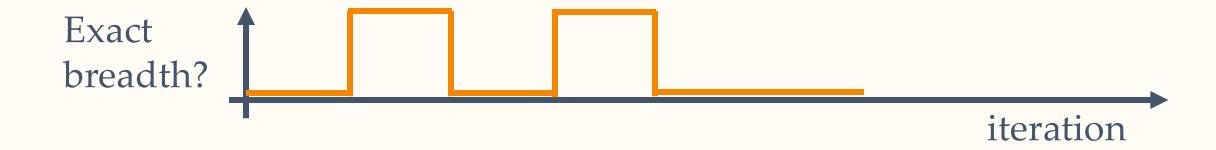


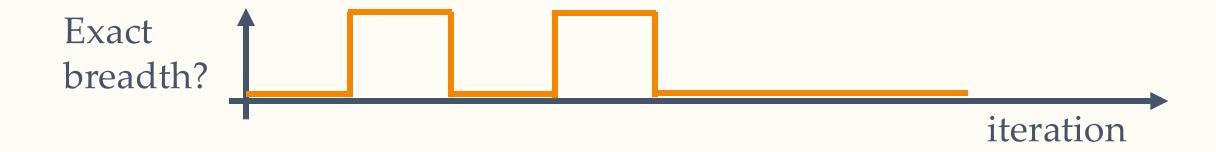


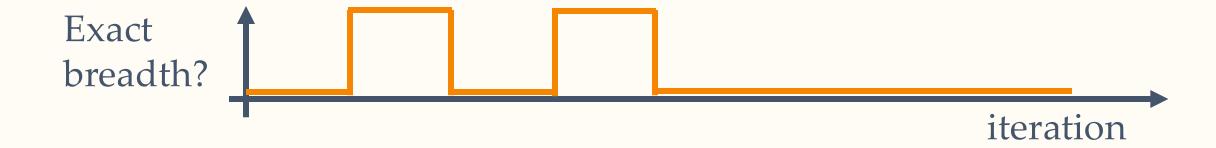




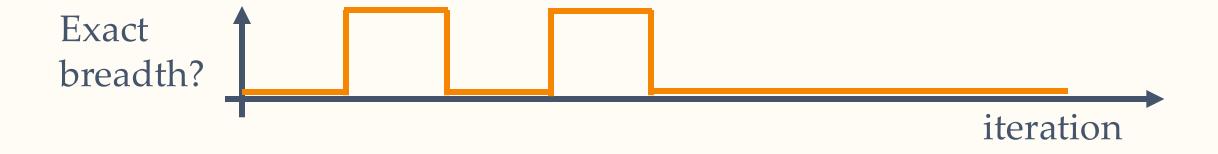








**Implication:** For non-identifiable collections exact breadth is violated infinitely many times



Question: Is it possible to achieve exact breadth infinitely many times?

**Implication:** For non-identifiable collections exact breadth is violated infinitely many times

**Theorem.** [KW'25] There is a generator G, that achieves exact breadth *infinitely* many times for *any* countable collection  $\mathcal{L}$ 

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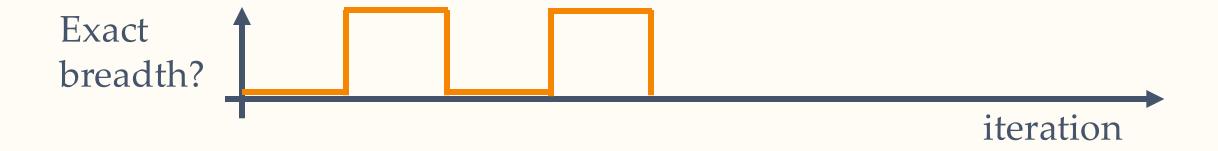
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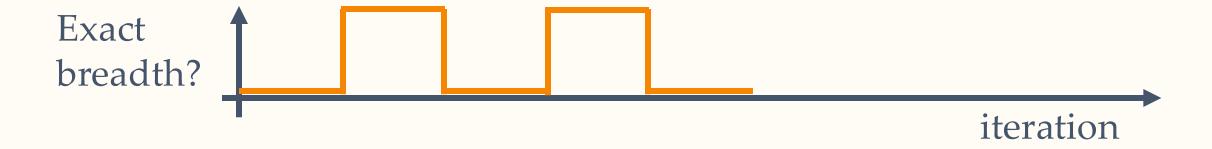
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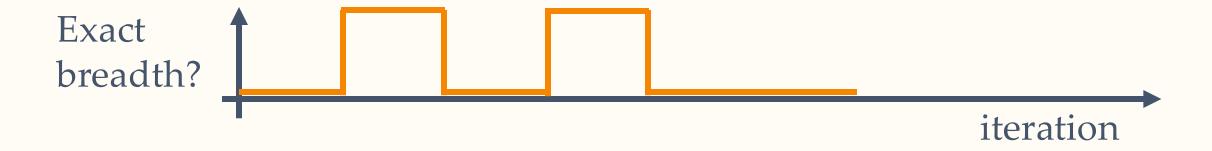
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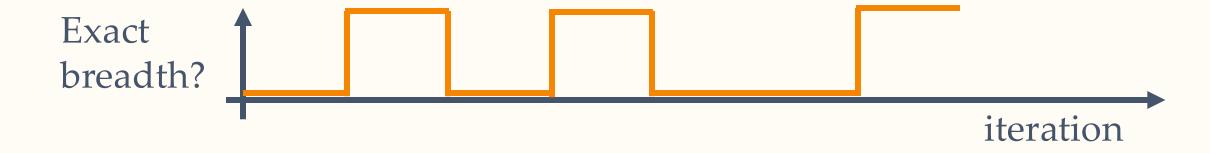
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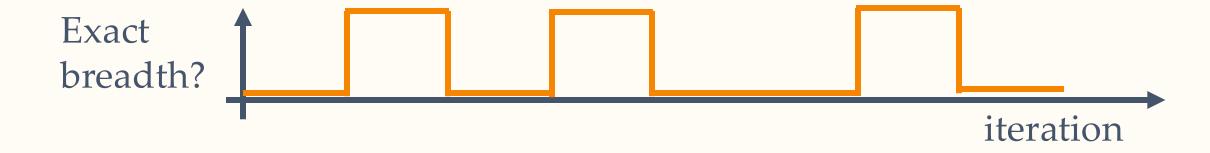
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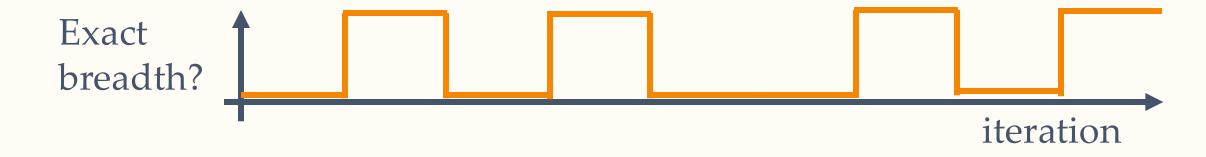
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## Immediate Open Questions

- 1. Fine-grained trade-offs between hallucinations and breadth *Partial results* [CP'25], [KMV'24], [KW'25]
- 2. Allow multiple responses (could bypass impossiblity results)
- 3. What other type of feedback is useful? *Partial results* [KMV'25a], [CP'25]

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**COLT 2025** 

On Thursday in the Language Model Session

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Let  $\mathcal{L}$  be a countable collection indexed by axiomatic systems

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Let *K* be defined by ZFC system (there is a TM that enumerates *K*)

If a generator achieves exact breadth for *K* (in a prompted model), it can be used to prove all *provable* statements

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- 1.  $L \in \mathcal{L}$  is defined by some axiomatic system (e.g., ZFC)
- 2. *L* has strings of the form " $\langle \text{Theorem} \rangle \langle \text{Proof} \rangle$ "

Let *K* be defined by ZFC system (there is a TM that enumerates *K*)

If a generator achieves exact breadth for *K* (in a prompted model), it can be used to prove all *provable* statements ...even without knowing the axiomatic system

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Does not contradict Godel (does contradict Turing's decidability)

#### References

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