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Intertwining NLP and CP-AI-OR Reasoning for Constrained Text Generation



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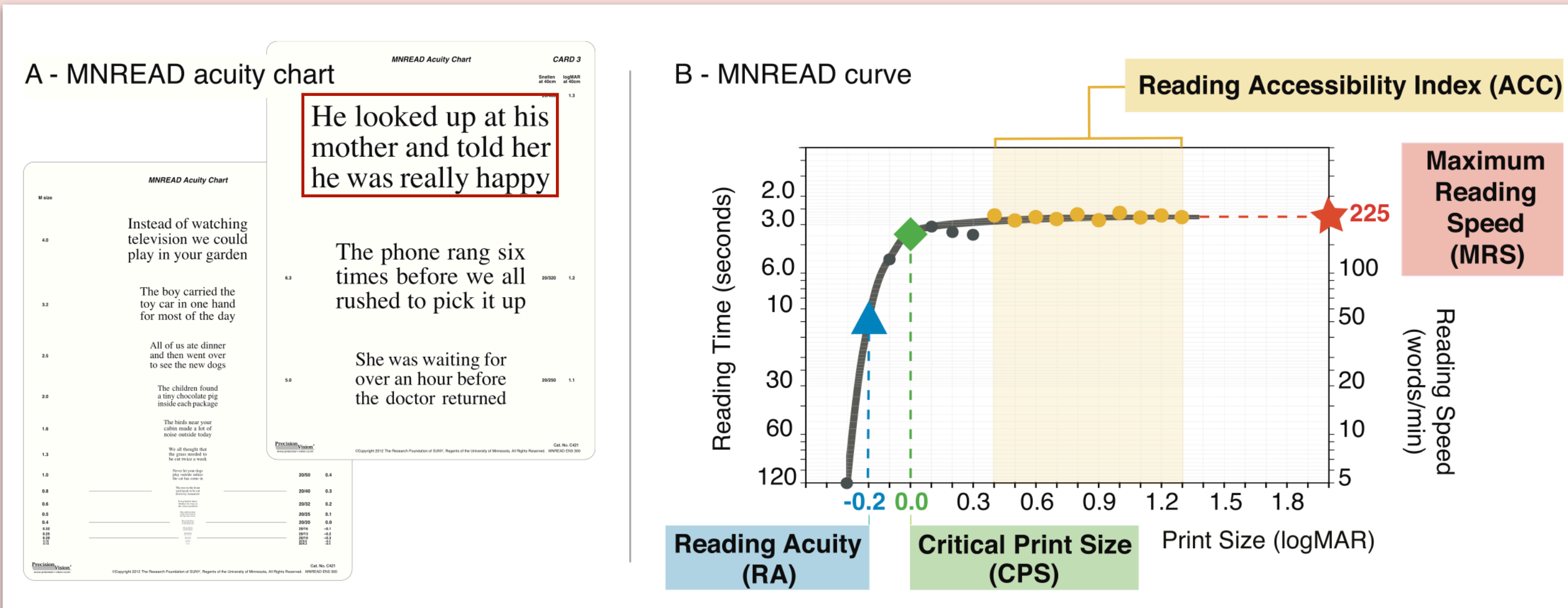


General Idea

Beam Search fails to generate constrained text when the solutions space is **strongly constrained** (e.g., length, display). When constraints are defined on the **whole text**. Our **CP-based** approach solves it.

Context

Case study: the MNREAD test



A psychophysical test based on standardised sentences, available in 19 languages

- Assessing the **reading speed** is crucial for evaluating patients with visual impairments
- The need for a collection of **standardized** sentences respecting grammar, lexicon, size, or display rules
- Limitation: **few sentences** available due to the rules being too restrictive (**only 38 MNREAD sentences in French...**)
- Problem: How can we **generate** sentences that comply with several rules?

Methods

Principle (n-gram)

Step 1: Corpus

He is angry.
My friend is sad.
She is beautiful tonight.

Step 2: set of 2-grams

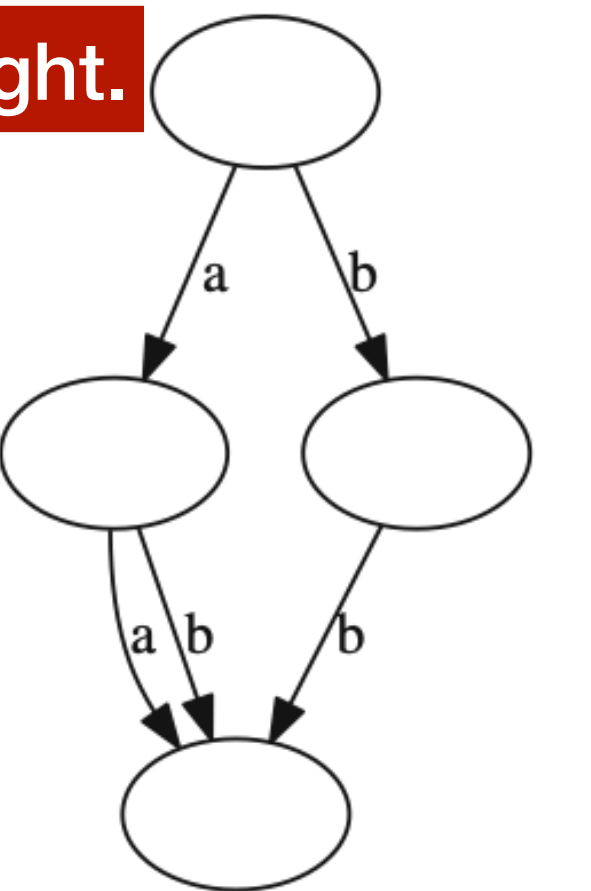
Is beautiful friend is Is beautiful He is
My friend She is beautiful tonight Is sad.

Step 3: chaining

My friend → friend is → is beautiful.
is beautiful → beautiful tonight.

MDD Paradigm (Constraint Programming)

- Data structures for calculating and storing the solutions to a problem in a compressed form using an acyclic directed graph.
- Advantage: powerful modelling tool, computing solutions set without a search.

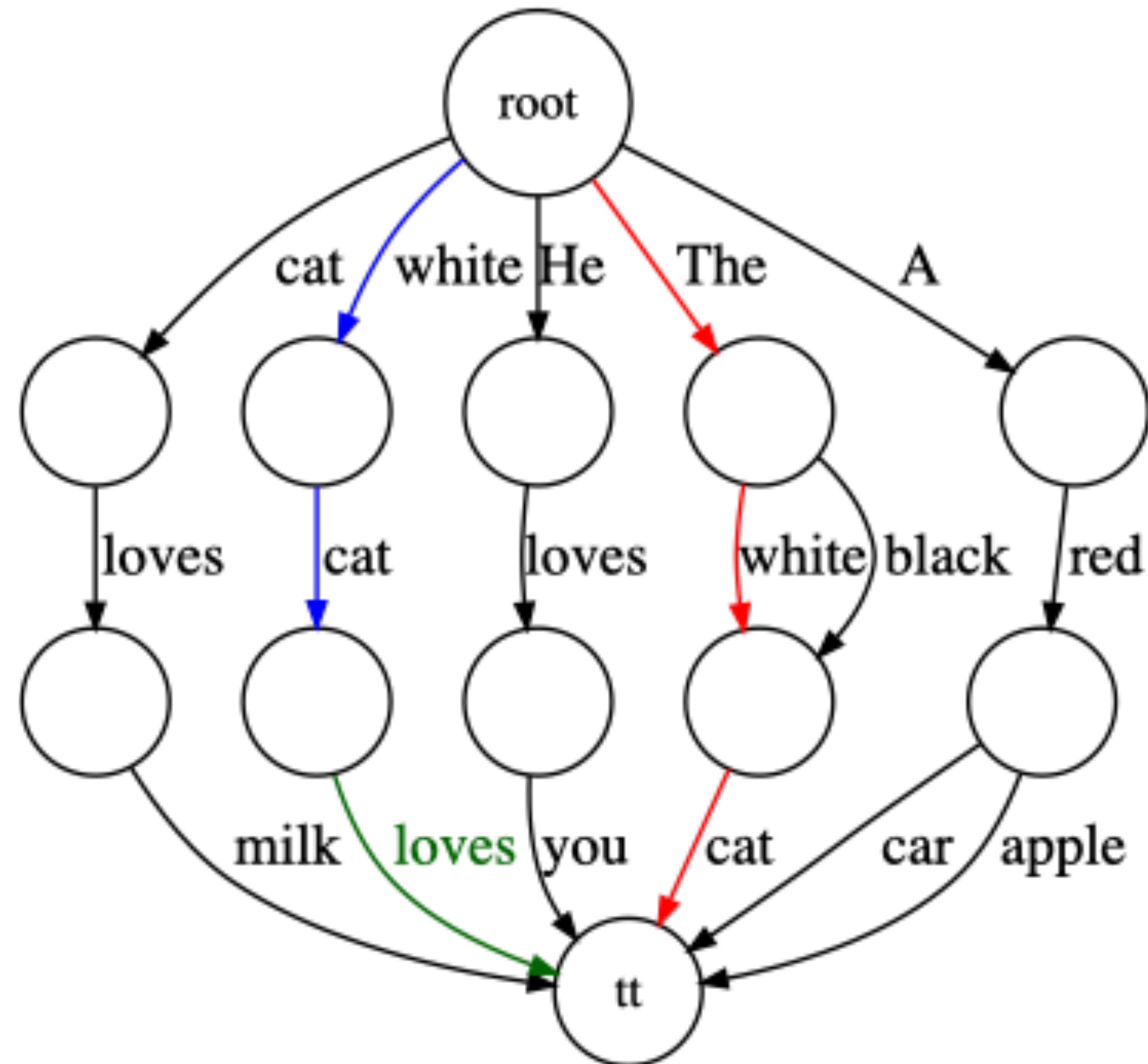


Large Language Model (LLM) can be used to score generated sentences. This score is viewed as a quality measurement of the generated sentences.

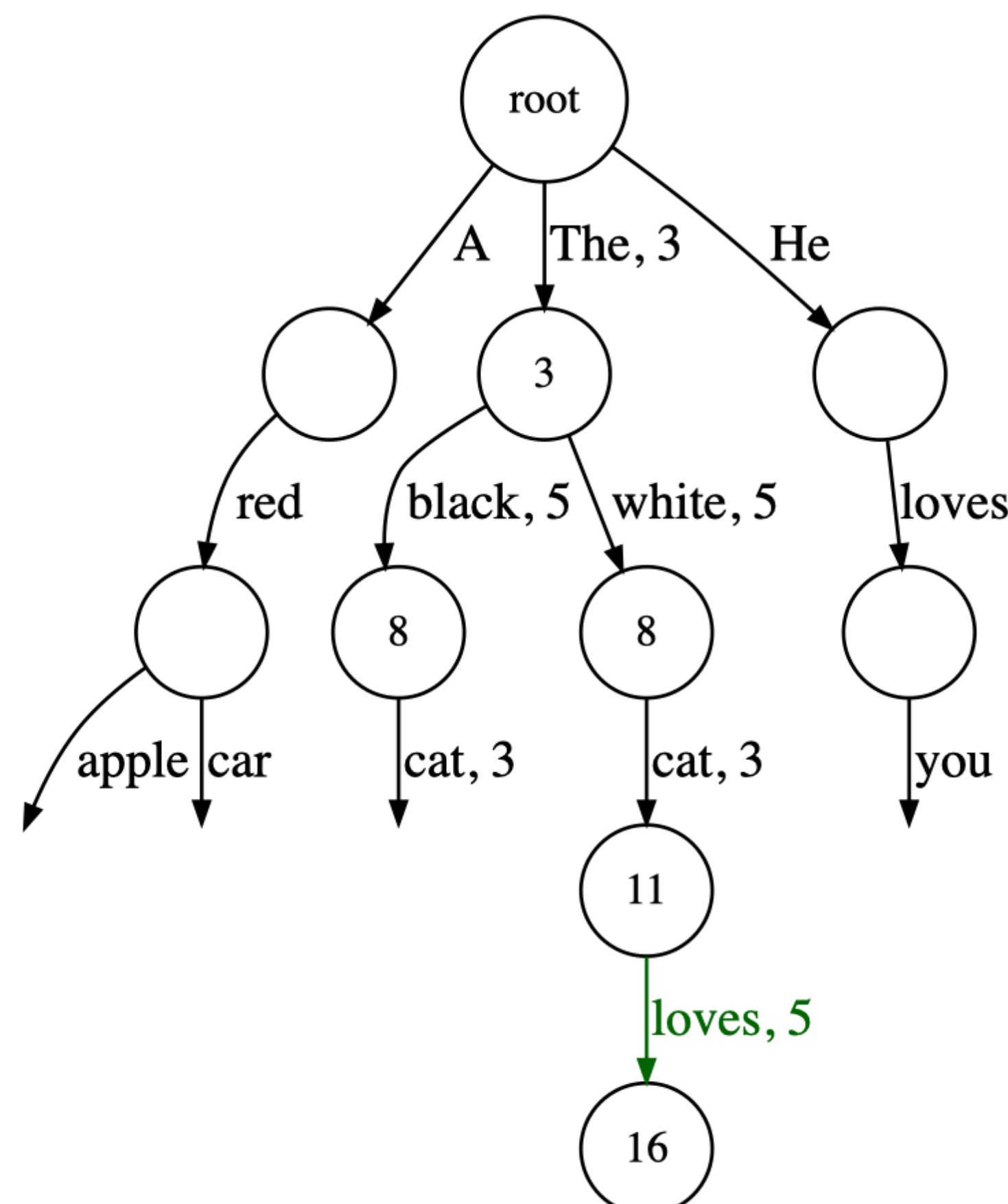
Results

From MNREAD rules to Sentences Generation in 3 steps

1 - MDD as a Trie (prefix tree)



2 - MDD top-down compilation



3 - Sentences scoring with LLM

$$P(X_1 \dots X_n) = \prod_{i=1}^n P(X_i | X_1 \dots X_{i-1})$$
$$PPL(X_1 \dots X_n) = \sqrt[n]{\frac{1}{P(X_1 \dots X_n)}}$$
$$PPL(X_1 \dots X_n) = \sqrt[n]{\frac{1}{\prod_{i=1}^n P(X_i | X_1 \dots X_{i-1})}}$$

- 'Perplexity' is derived from Shannon's Entropy.
- It quantifies the uncertainty of a model with respect to a sample
- The lower, the better; range is [1 ; + inf]

➔ What is the successor of **The white cat** ?

General observation

n of n-grams ↗
Quality of sentences ↗
Number of sentences ↘

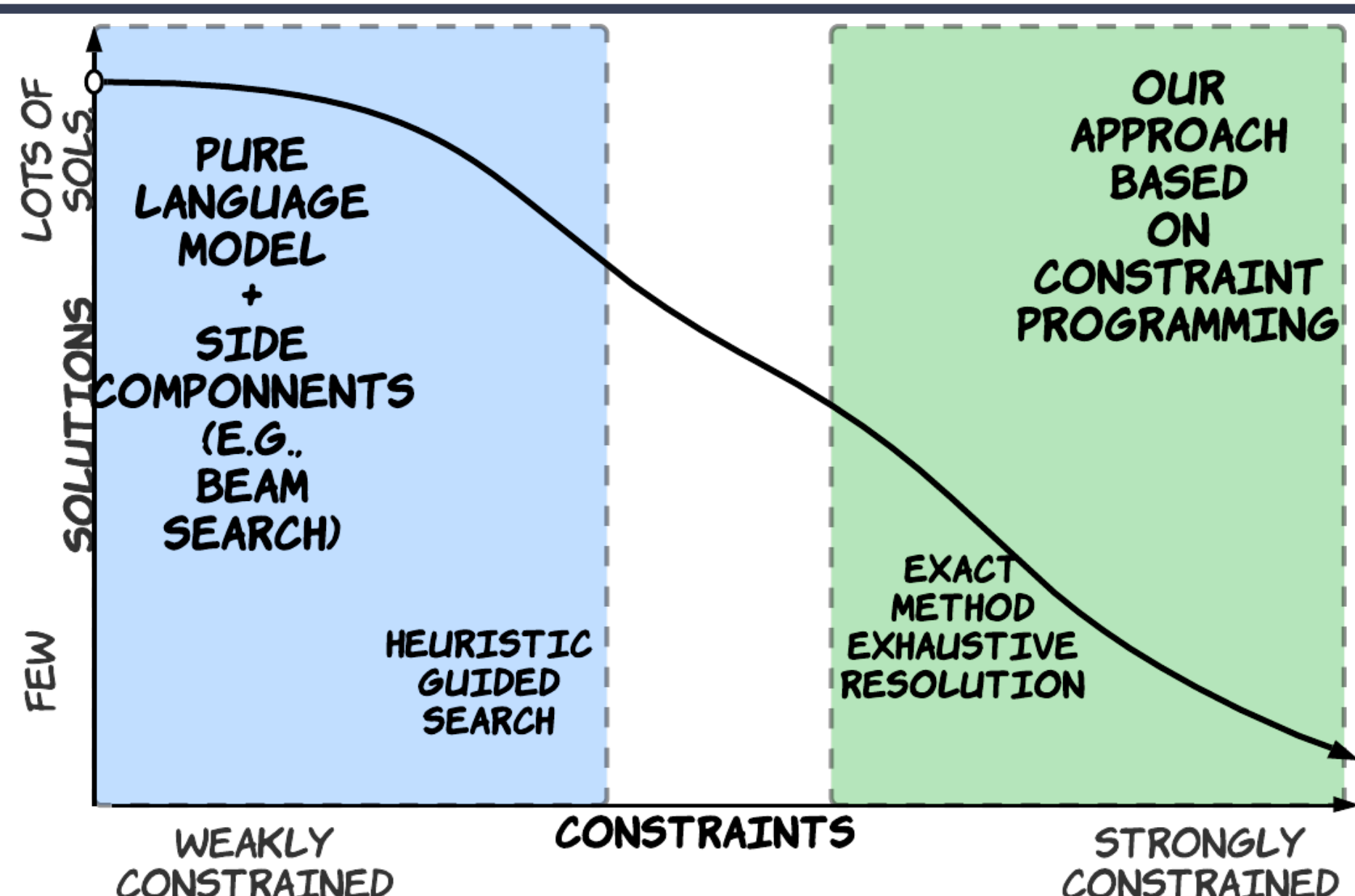
MNREAD sentence generation

FR	443	3GB	72s	7028	
EN	75	<<1GB	3s	204	

Examples of sentences

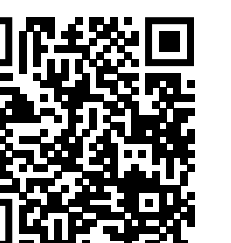
They are one of the most famous in the history of the sport	He stepped in from the double doors and into the branch	So strange to be on the edge of my chin between his fingers
Quality: Good PPL = 12	Quality: Average PPL = 160	Quality: Poor PPL = 224

CP-ML



Conclusion

For more details, read the paper →



- Promising method: more suitable than generic methods (e.g. GPT, Bert) for **managing constraints** and more **flexible** than the ad-hoc method of Mansfield et al.
- Advantages: **modularity** (easy to add and/or to remove rules), **constraints taken into account at the generation stage**, can be applied to **other languages**
- Perspectives: Bridging CP and ML