



Understanding Task Design Trade-offs in Crowdsourced Paraphrase Collection

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Walter Lasecki

Paraphrases are useful across
a wide range of NLP tasks

Motivation
Experiment
Results

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Sentence

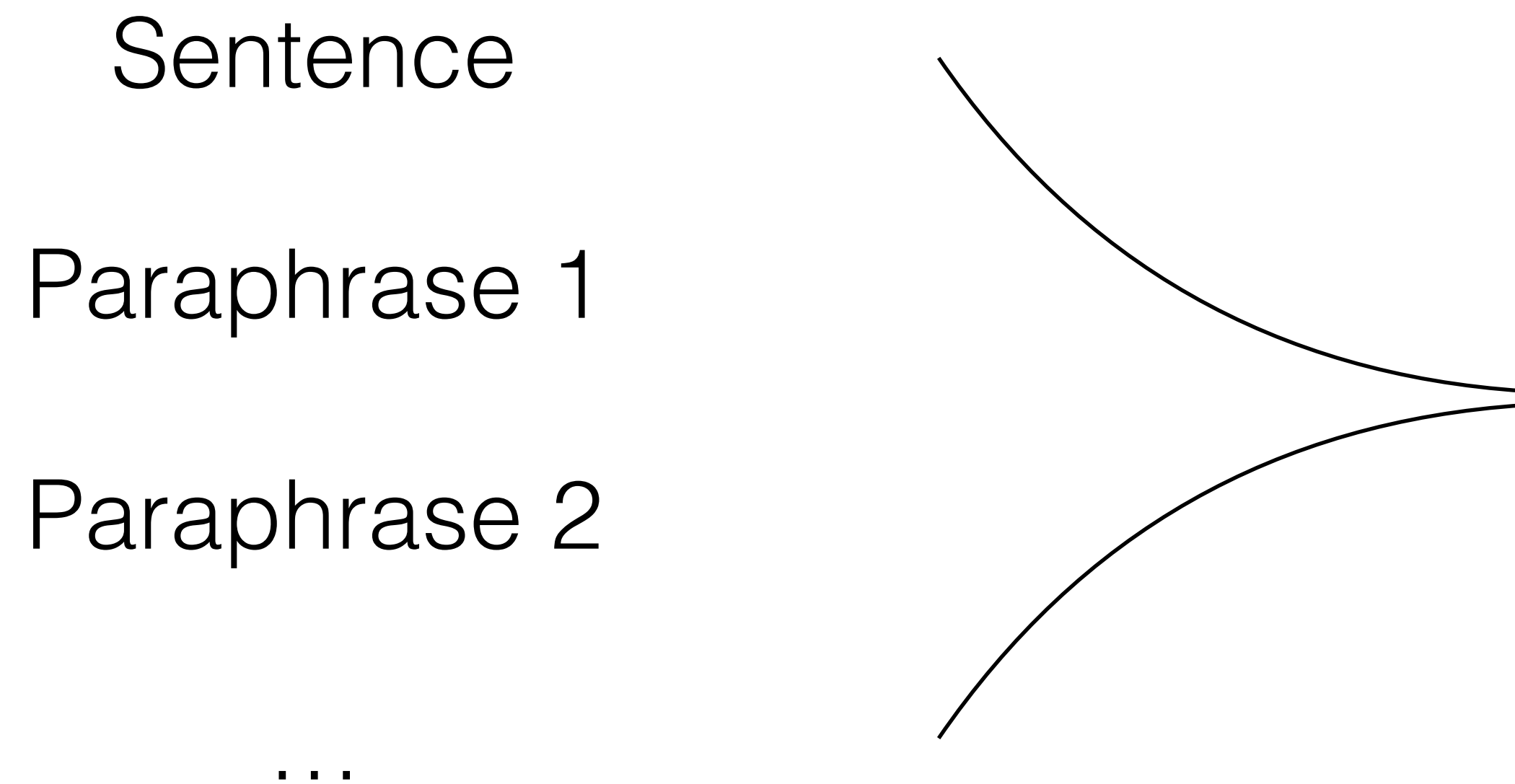
Paraphrase 1

Paraphrase 2

...

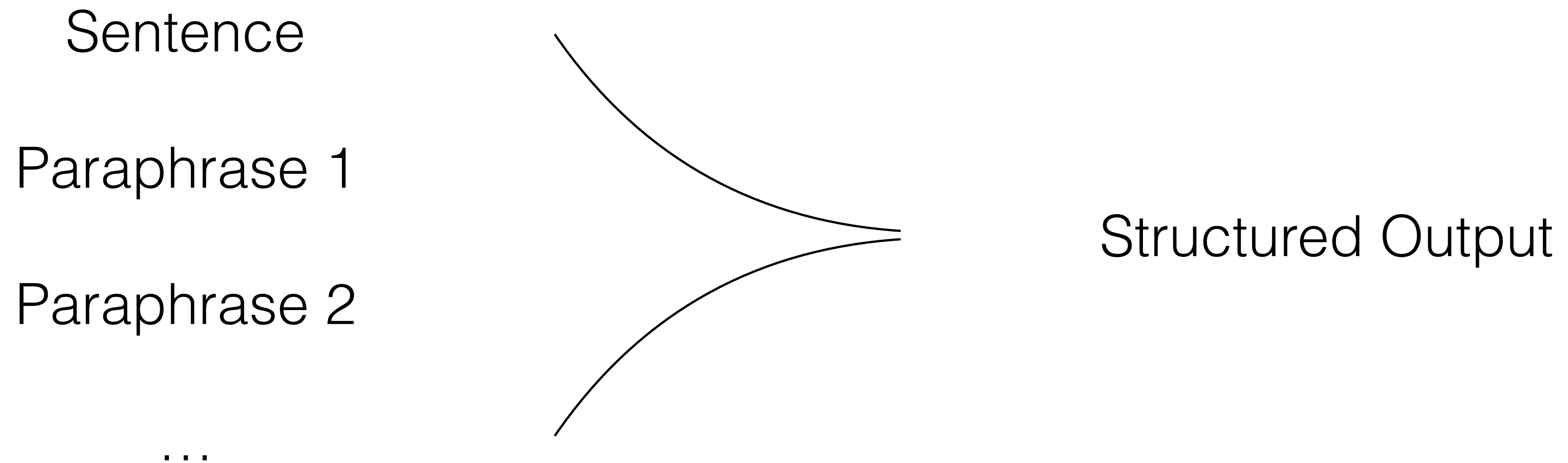
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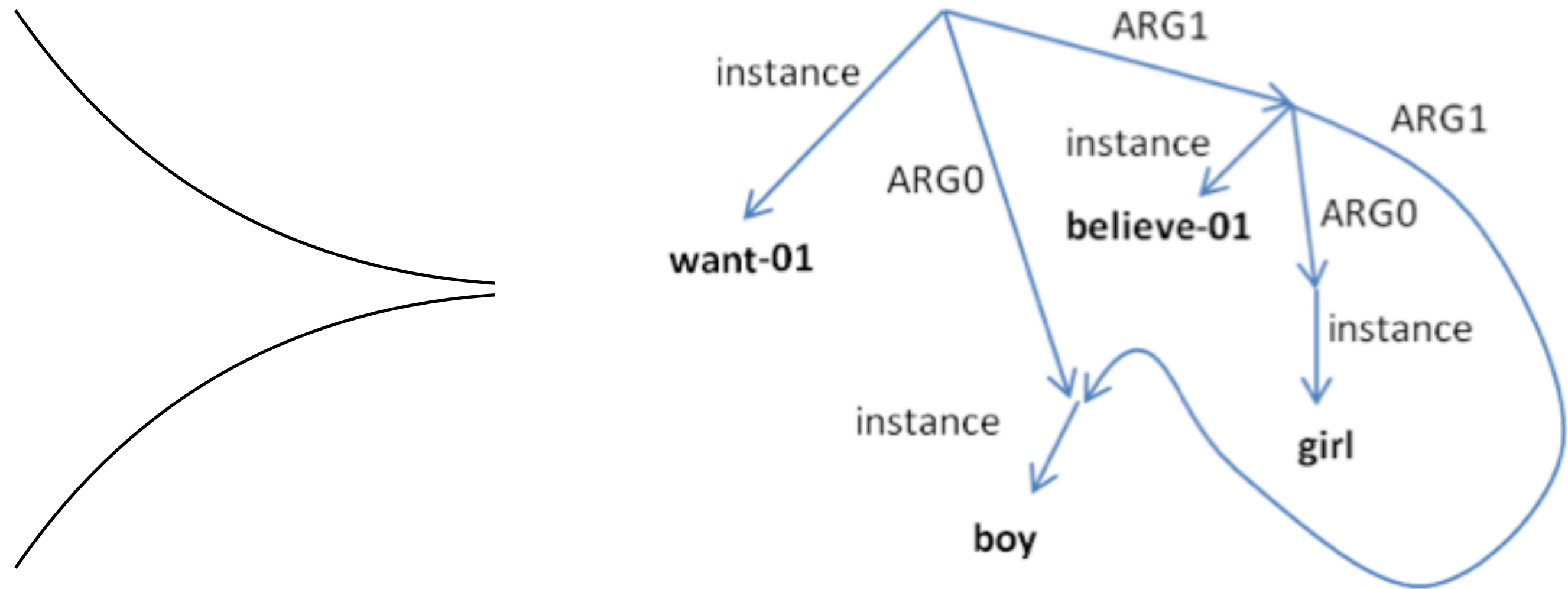
The boy desires the girl
to believe him.

The boy desires to be
believed by the girl.

The boy has a desire to
be believed by the girl.

The boy's desire is for
the girl to believe him.

...



Paraphrases are useful across a wide range of NLP tasks

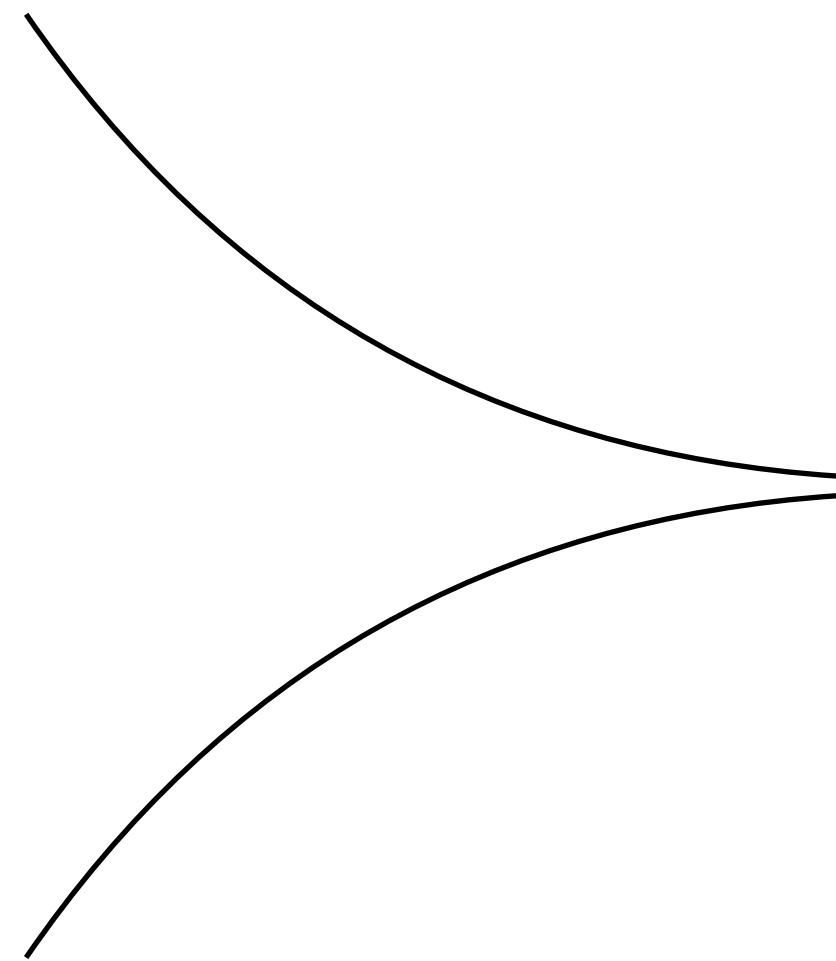
Motivation
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What is the smallest state by area?

Which state has the least area?

Name the state with the smallest area

...



```
λx1.smallest(x2,  
  λx1.state(x1),  
  λx1.λx2.area(x1,x2))
```

Paraphrases are useful across a wide range of NLP tasks

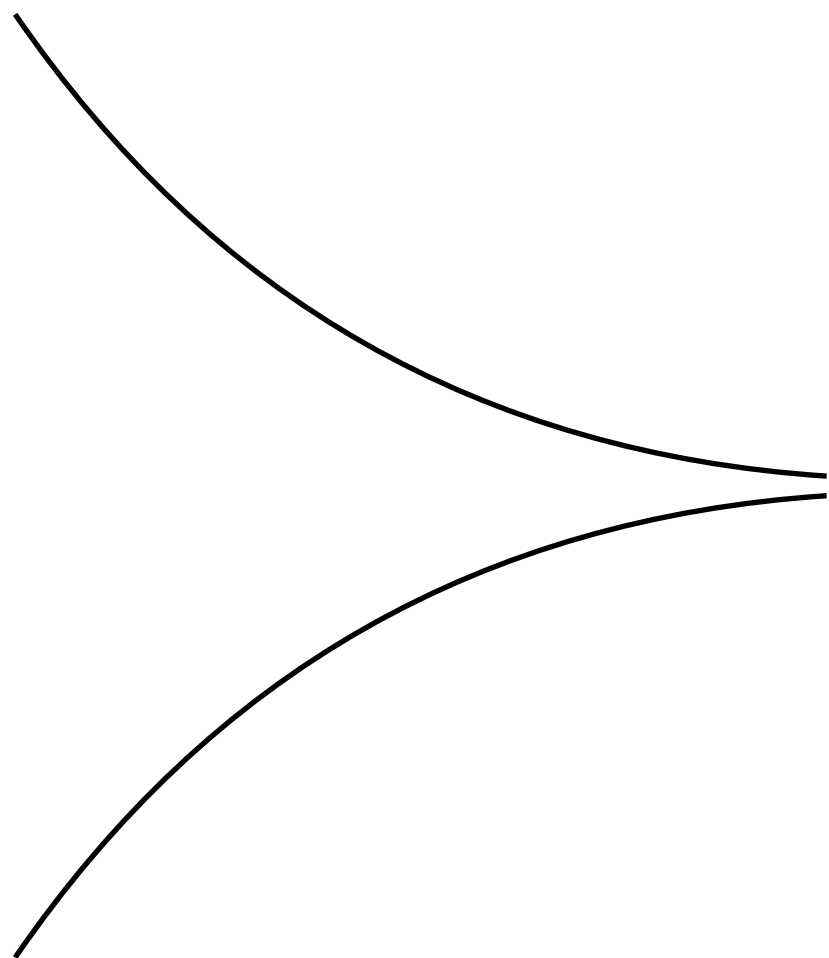
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What is the smallest state by area?

Which state has the least area?

Name the state with the smallest area

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```
SELECT state.state_name
FROM state
WHERE state.area = (
    SELECT MIN (state.area)
    FROM state
) ;
```


Paraphrases are useful across a wide range of NLP tasks


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Many factors affect the quality and diversity of crowdsourced paraphrases

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Many factors affect the quality and diversity of crowdsourced paraphrases

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Title

Many factors affect the quality and diversity of crowdsourced paraphrases

Motivation
Experiment
Results

Title

Instructions ...

Many factors affect the quality and diversity of crowdsourced paraphrases

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Examples

Many factors affect the quality and diversity of crowdsourced paraphrases

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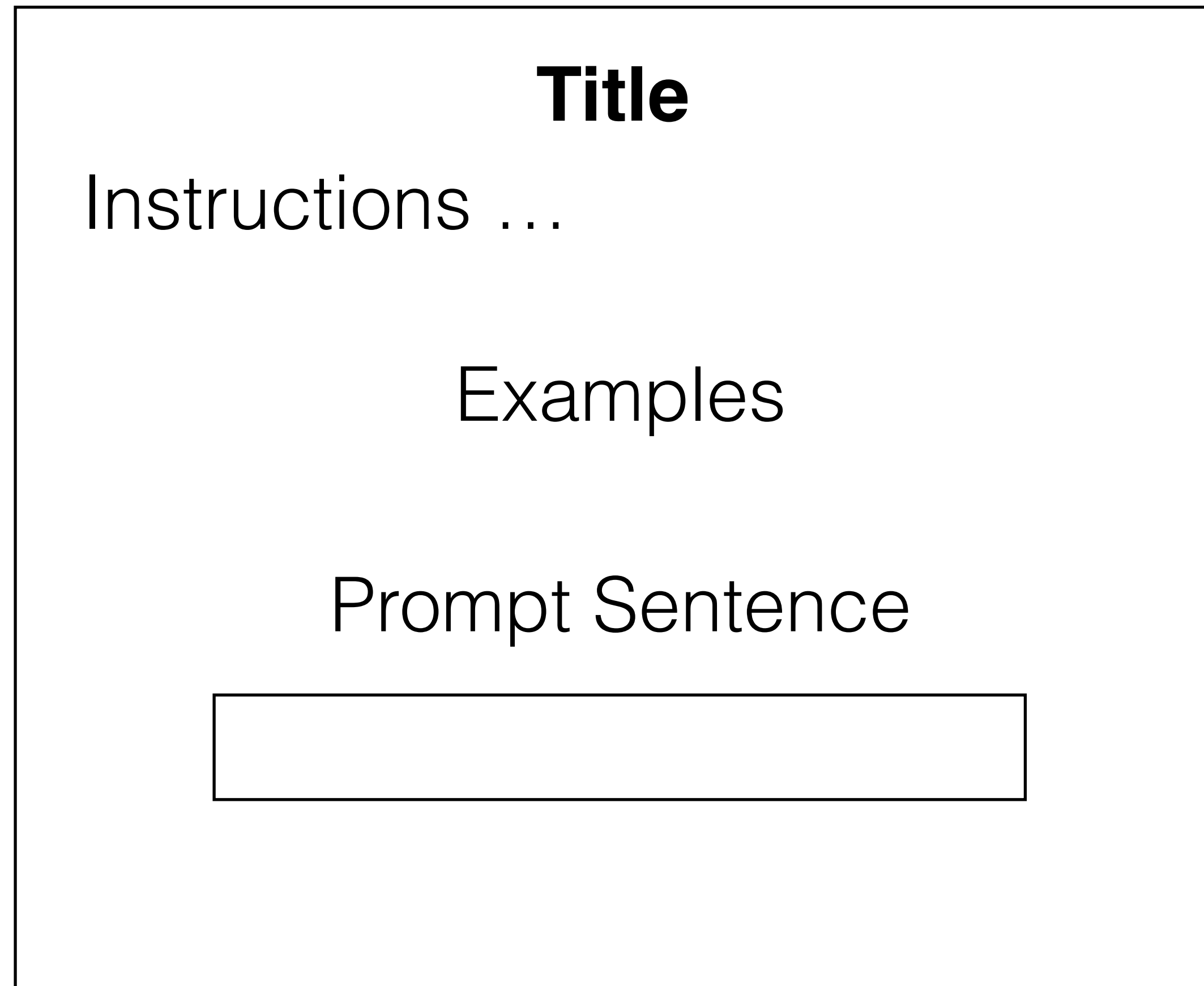
Title

Instructions ...

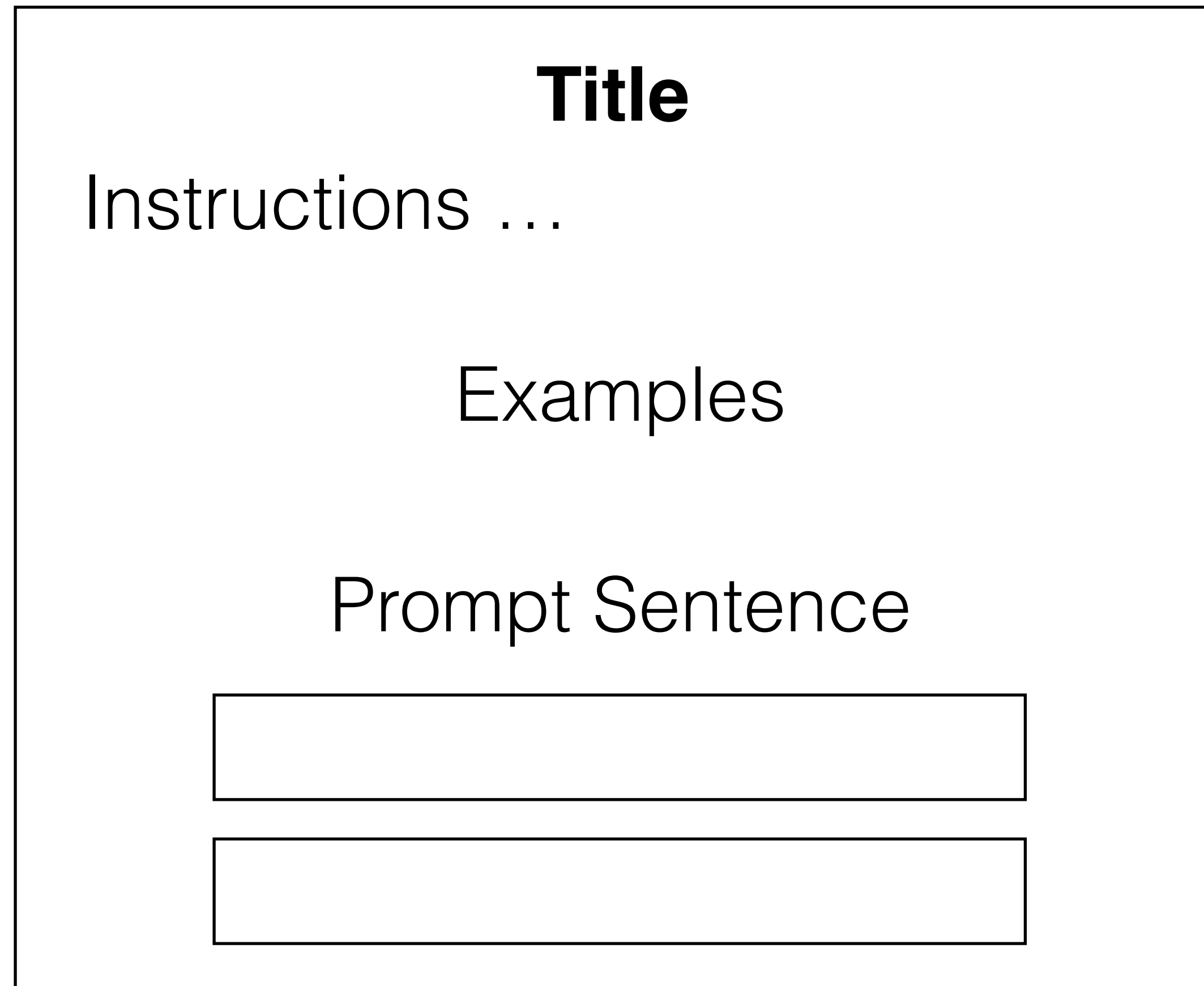
Examples

Prompt Sentence

Many factors affect the quality and diversity of crowdsourced paraphrases



Many factors affect the quality and diversity of crowdsourced paraphrases



Many factors affect the quality and diversity of crowdsourced paraphrases

Motivation
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Results

Title

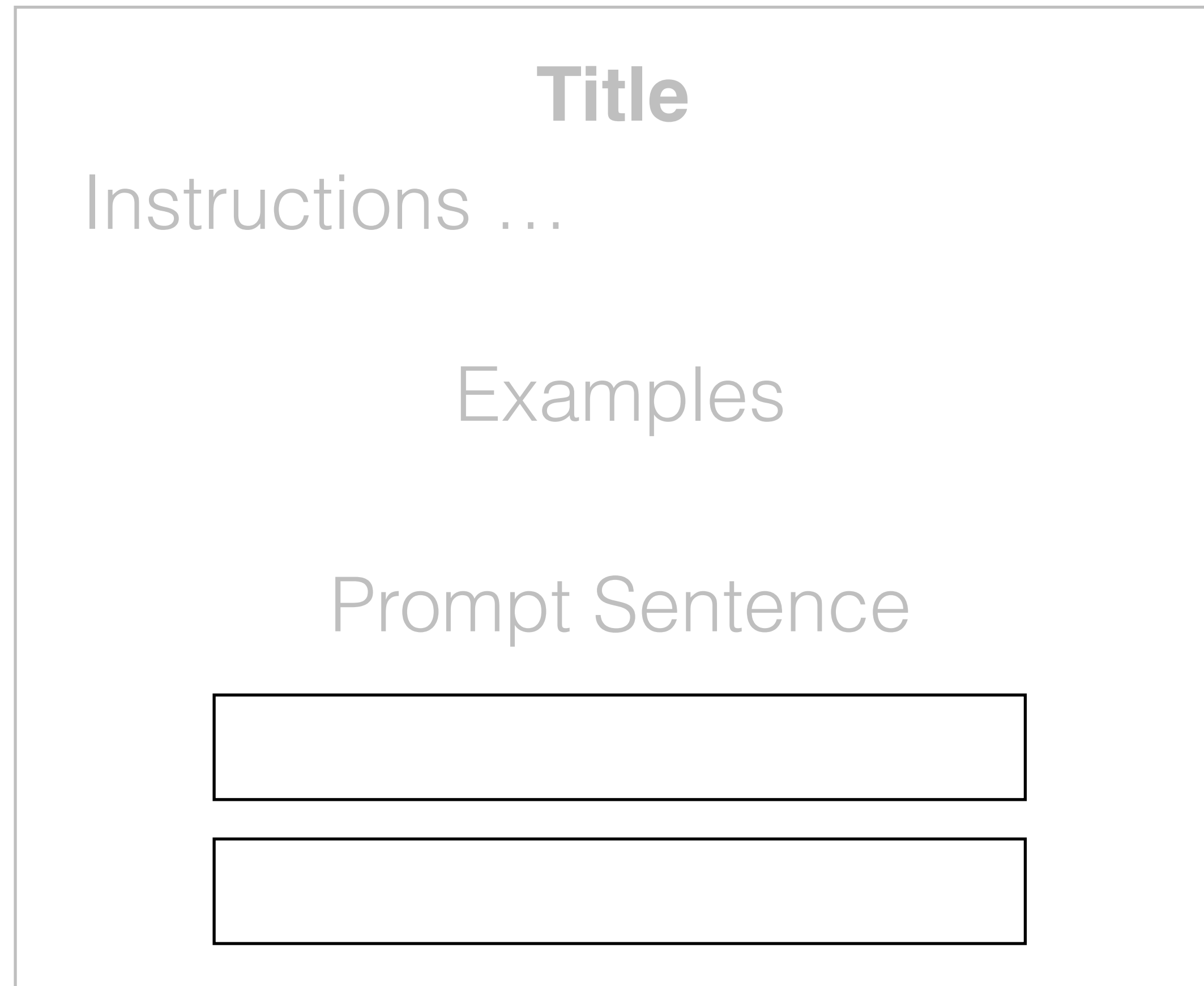
Instructions ...

Examples

Prompt Sentence

Many factors affect the quality and diversity of crowdsourced paraphrases

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Many factors affect the quality and diversity of crowdsourced paraphrases

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Experiment
Results

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Instructions ...

Examples

Prompt Sentence

Many factors affect the quality and diversity of crowdsourced paraphrases

\$0.05 - participation

Title

Instructions ...

Examples

Prompt Sentence

Many factors affect the quality and diversity of crowdsourced paraphrases

\$0.05 - participation

\$0.05 - bonus

Title

Instructions ...

Examples

Prompt Sentence

Many factors affect the quality and diversity of crowdsourced paraphrases

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Title

Instructions ...

Examples

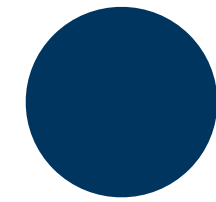
Prompt Sentence

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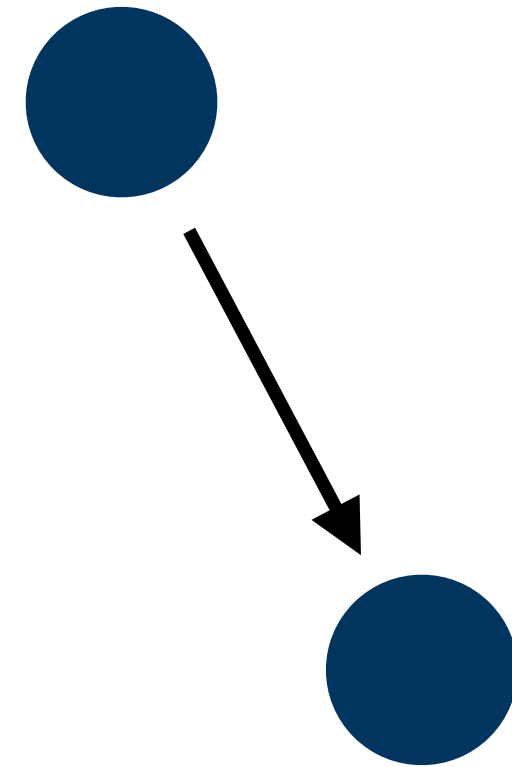
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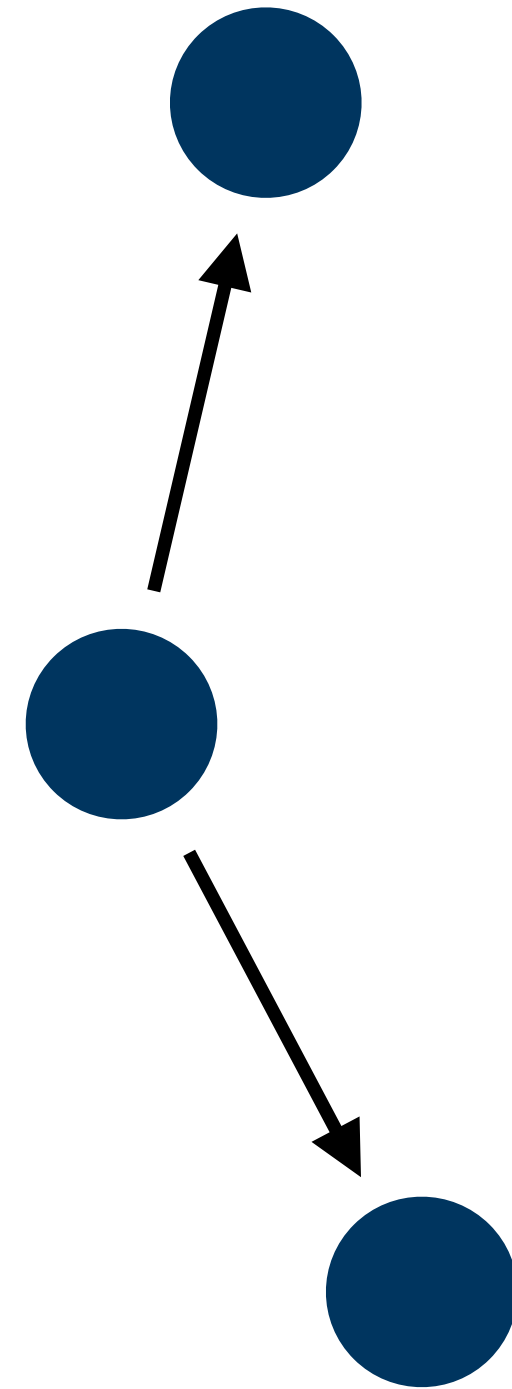
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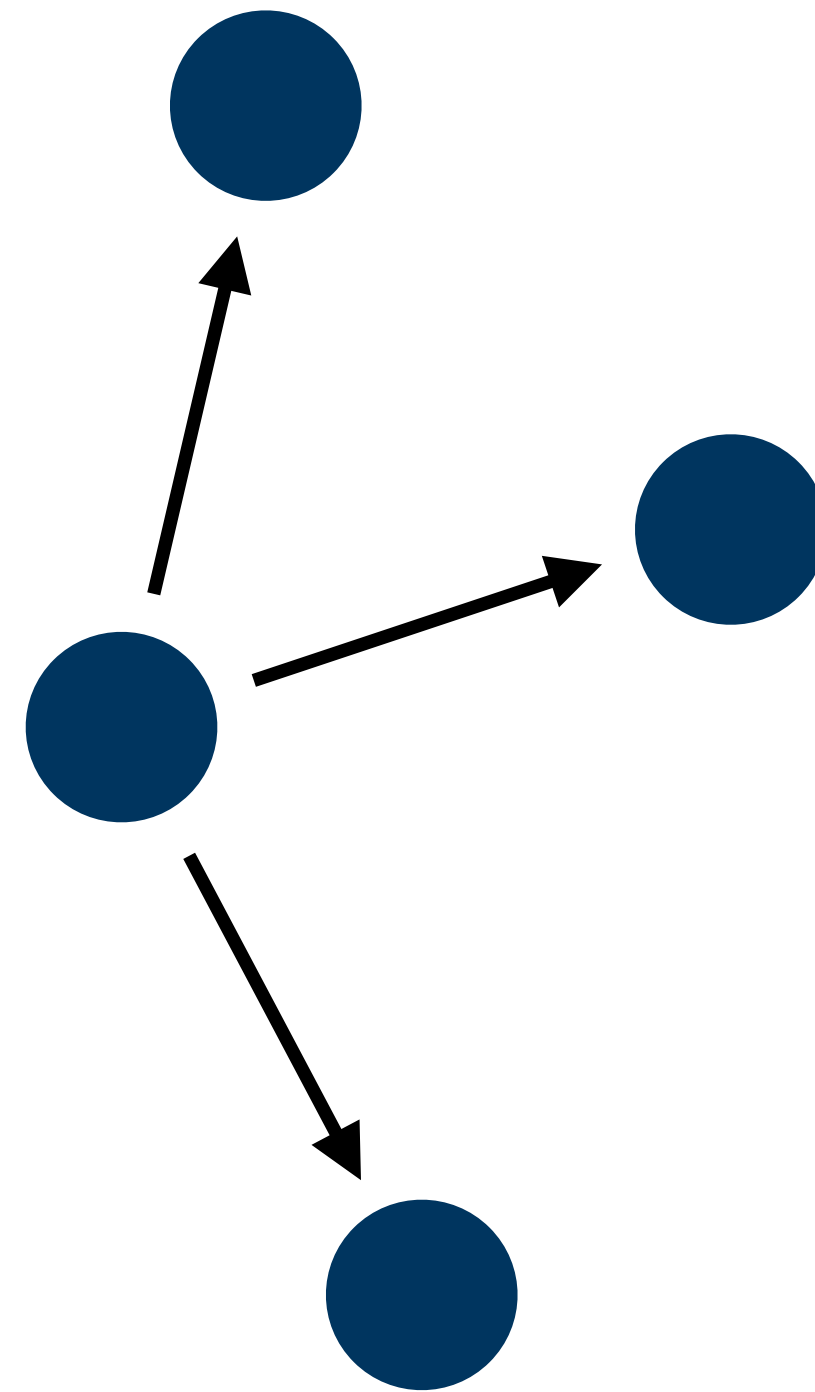
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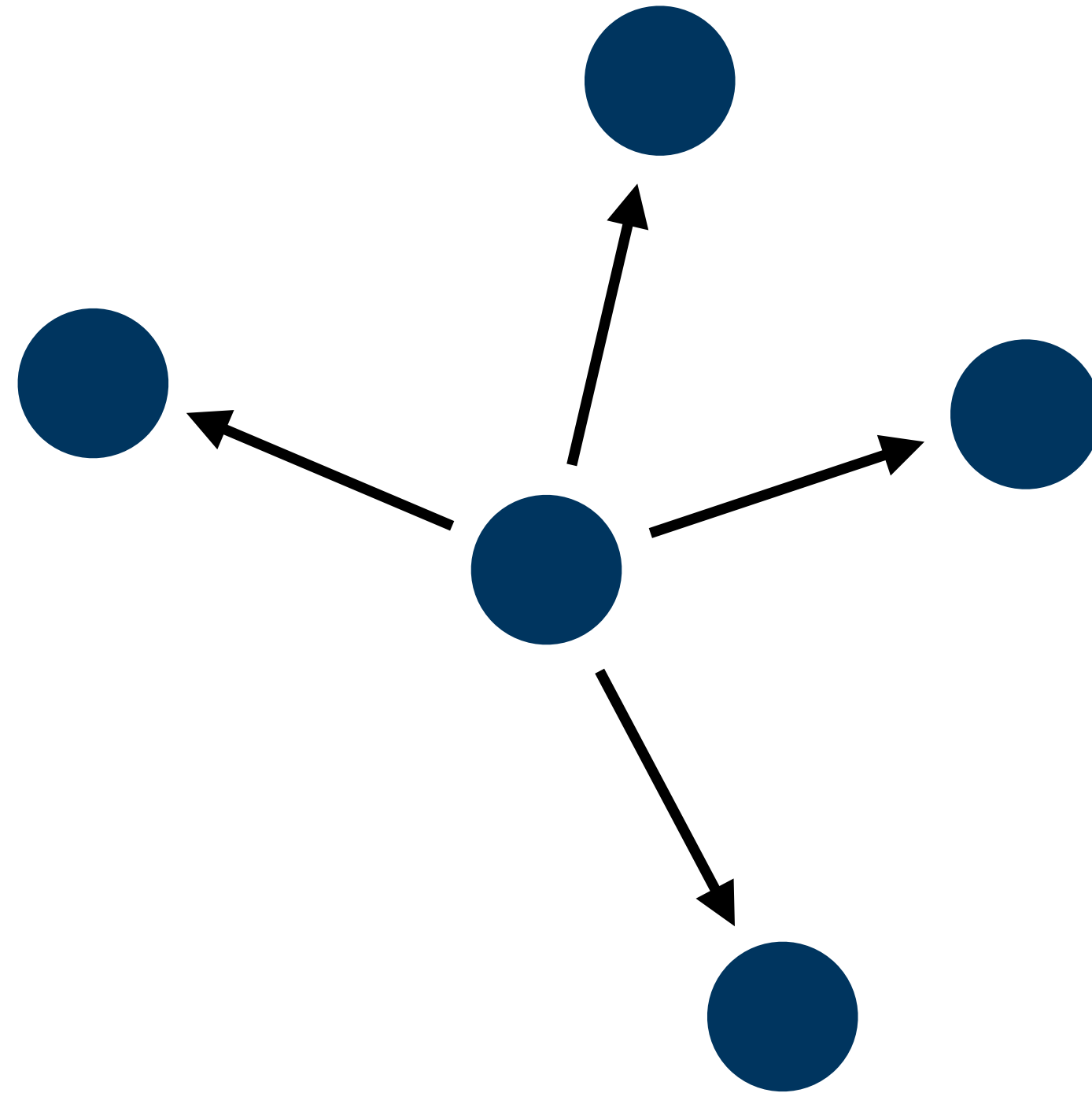
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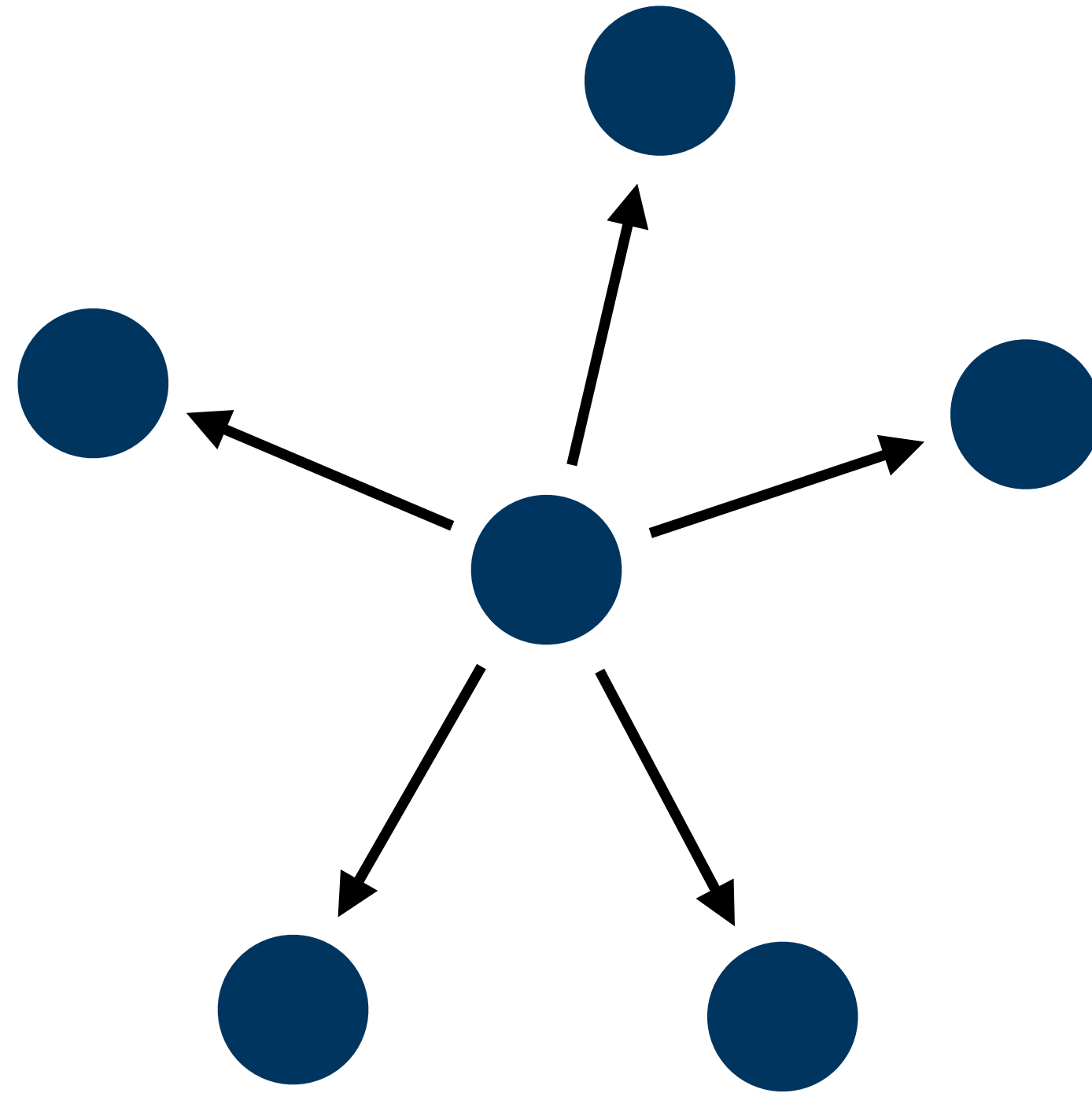
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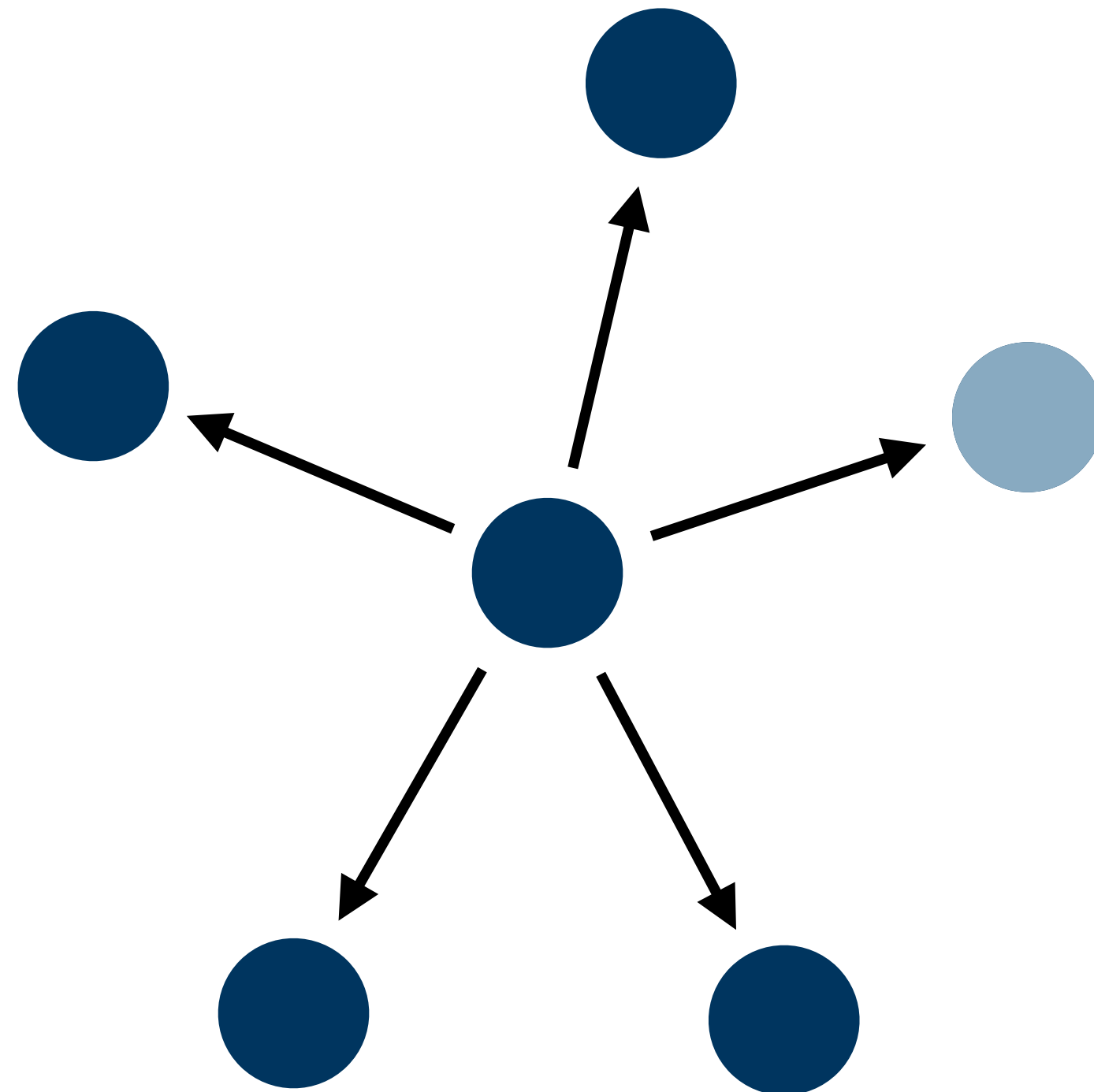
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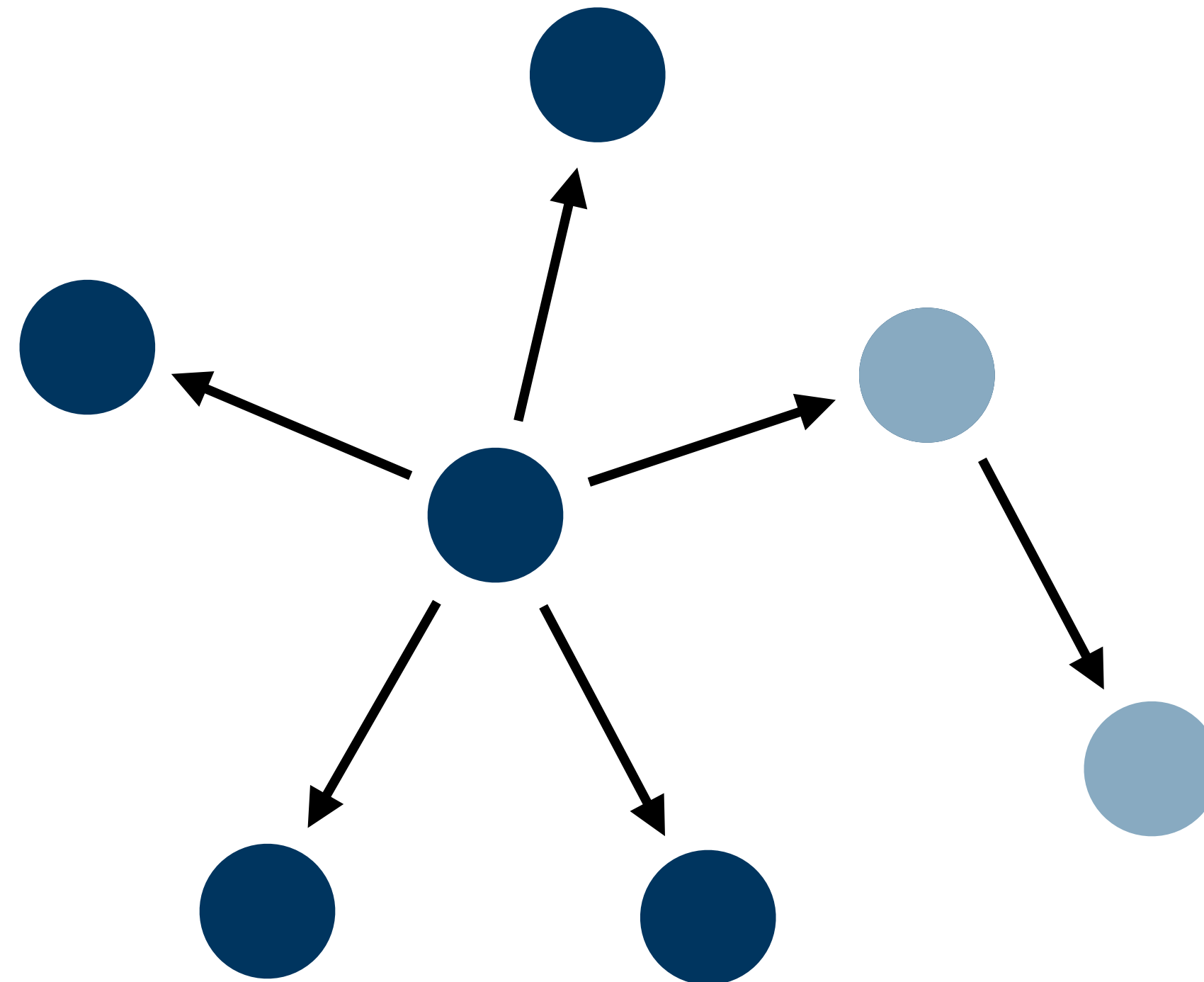
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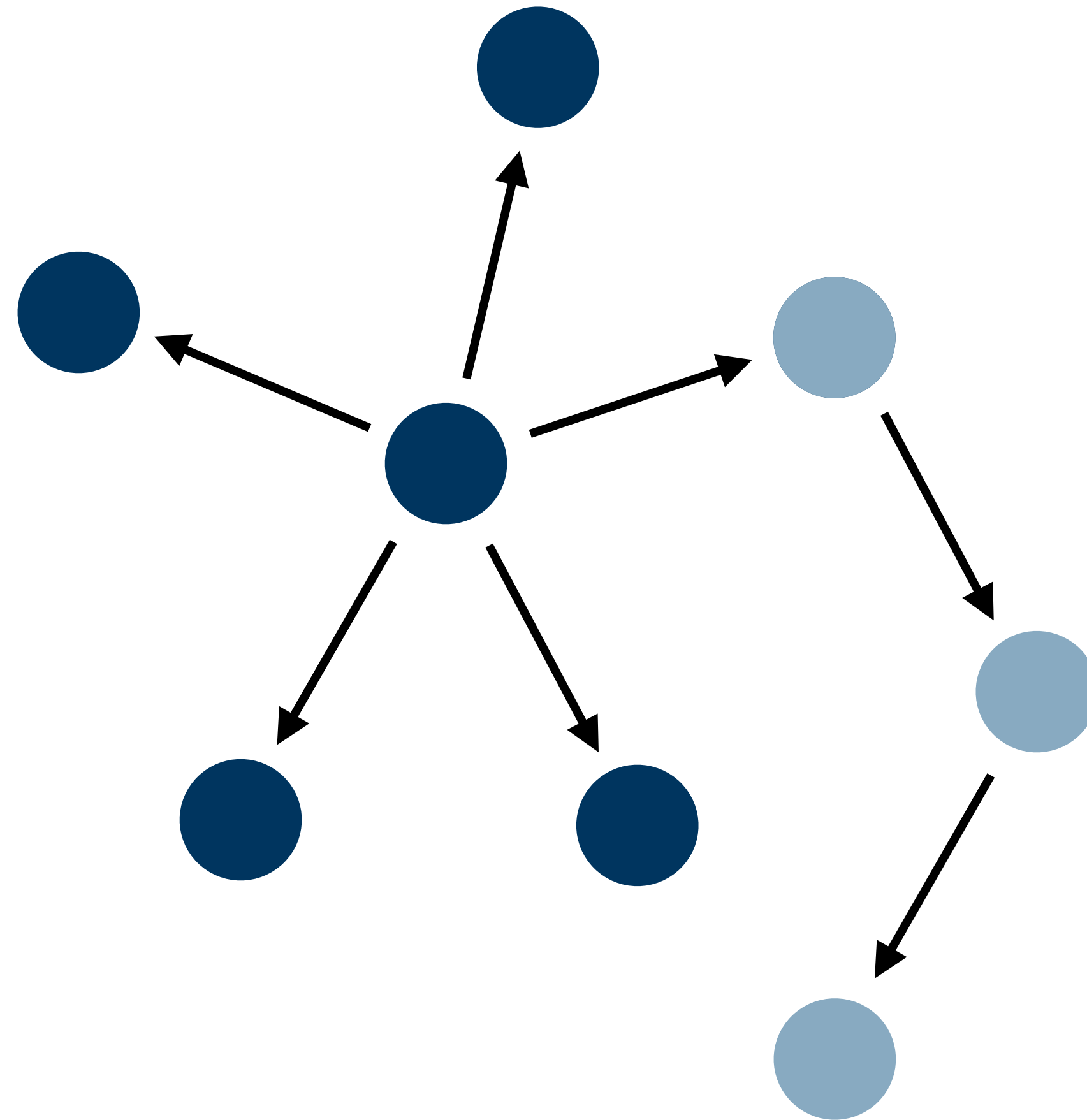
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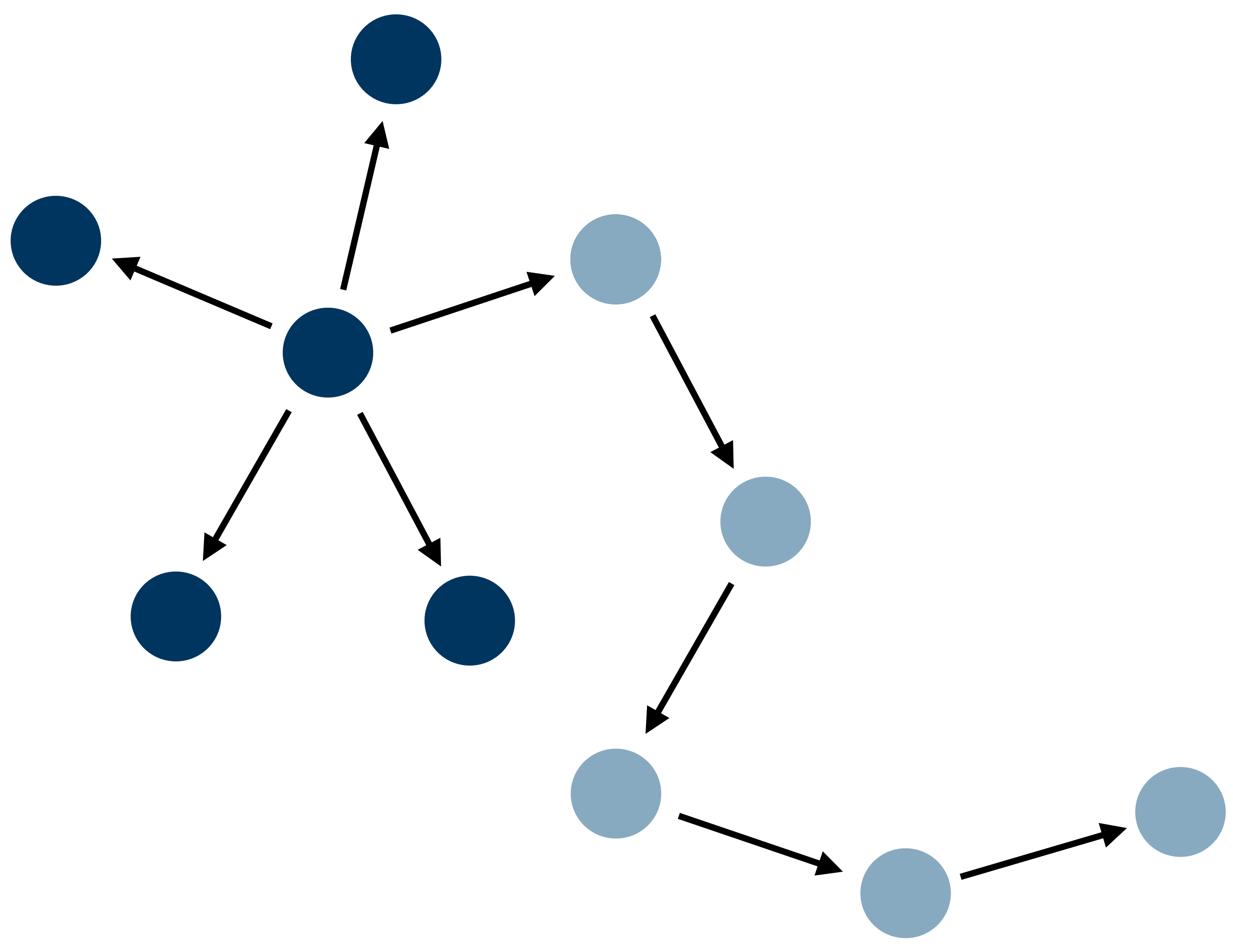


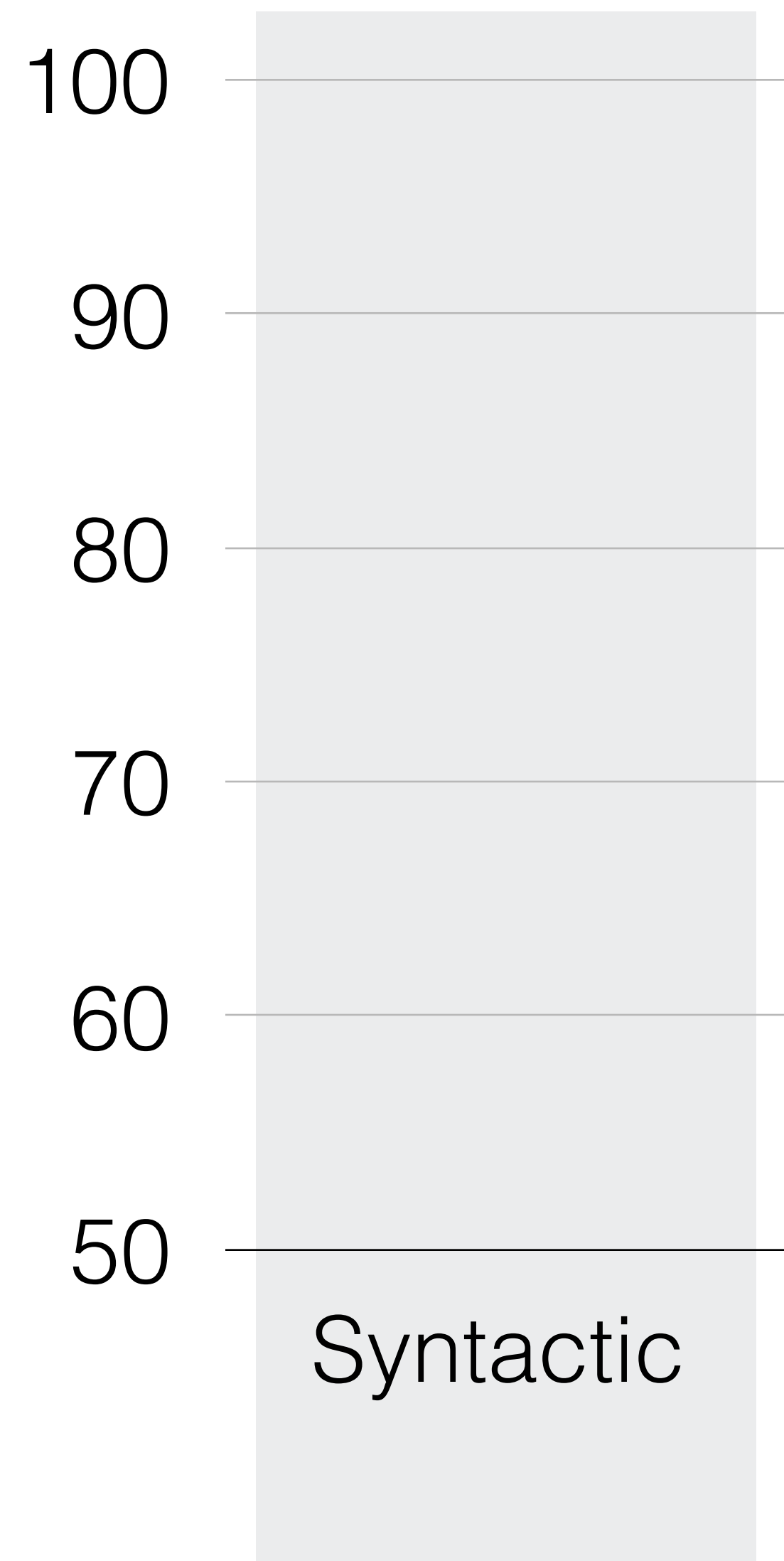
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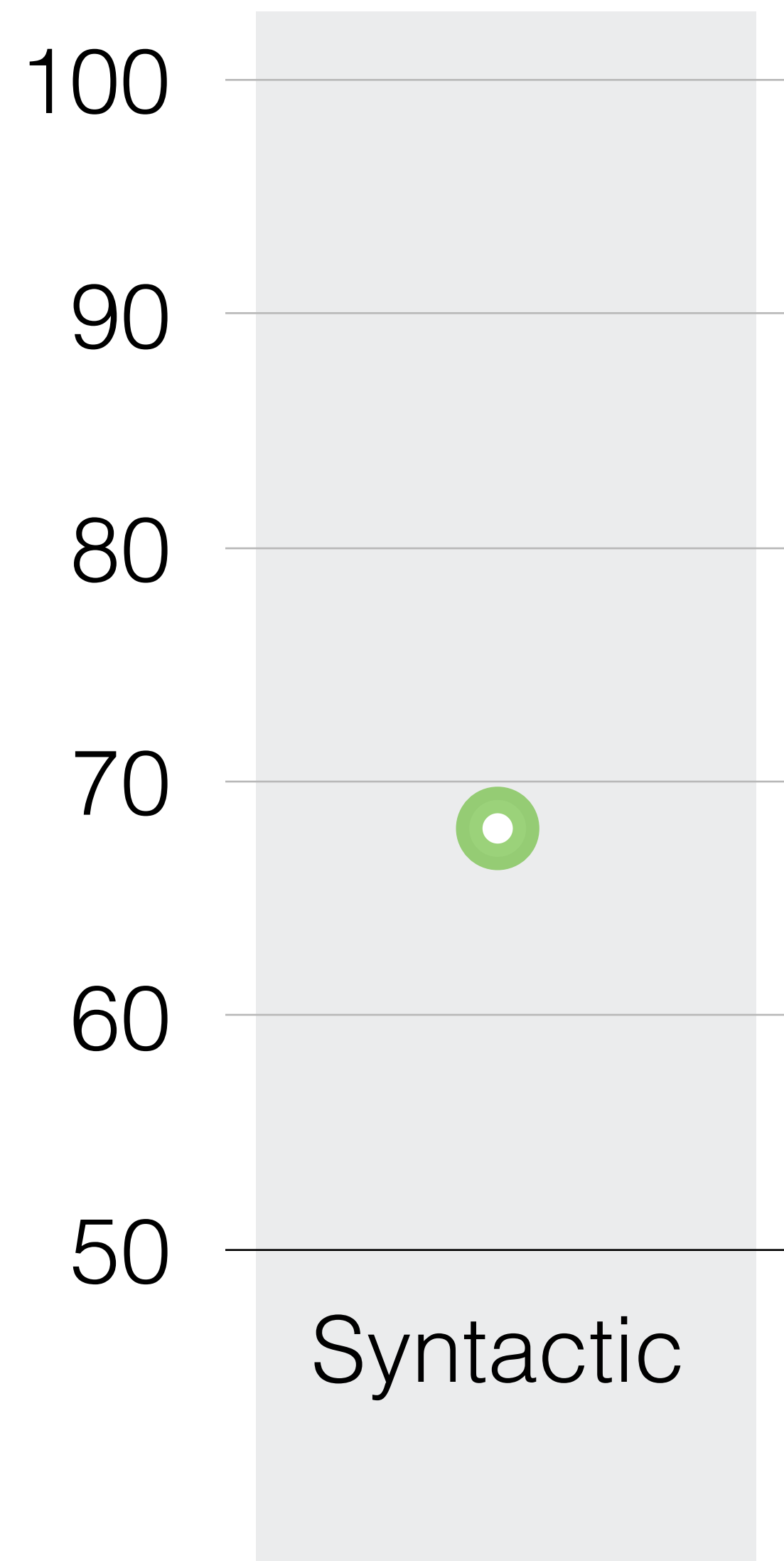
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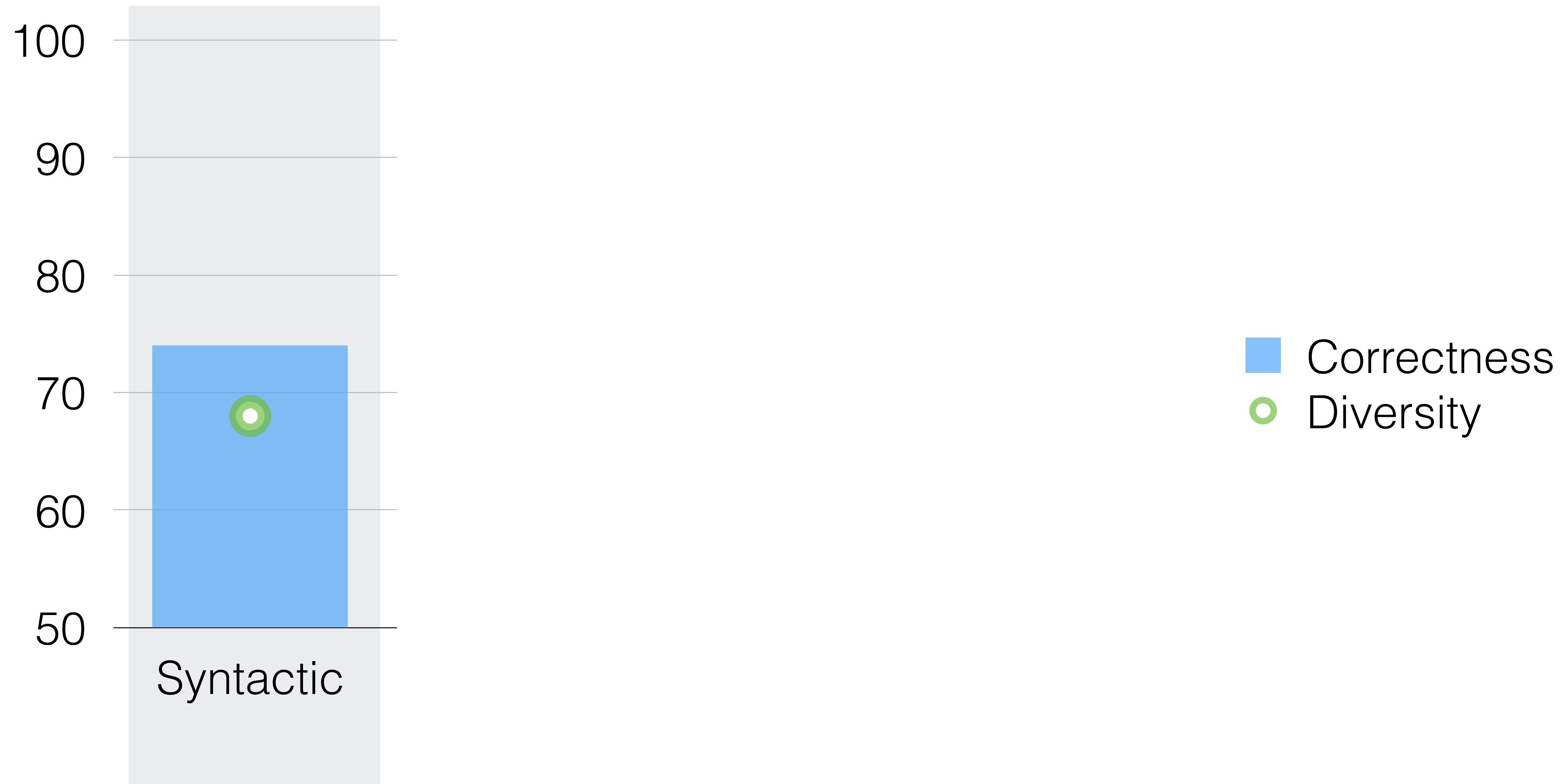
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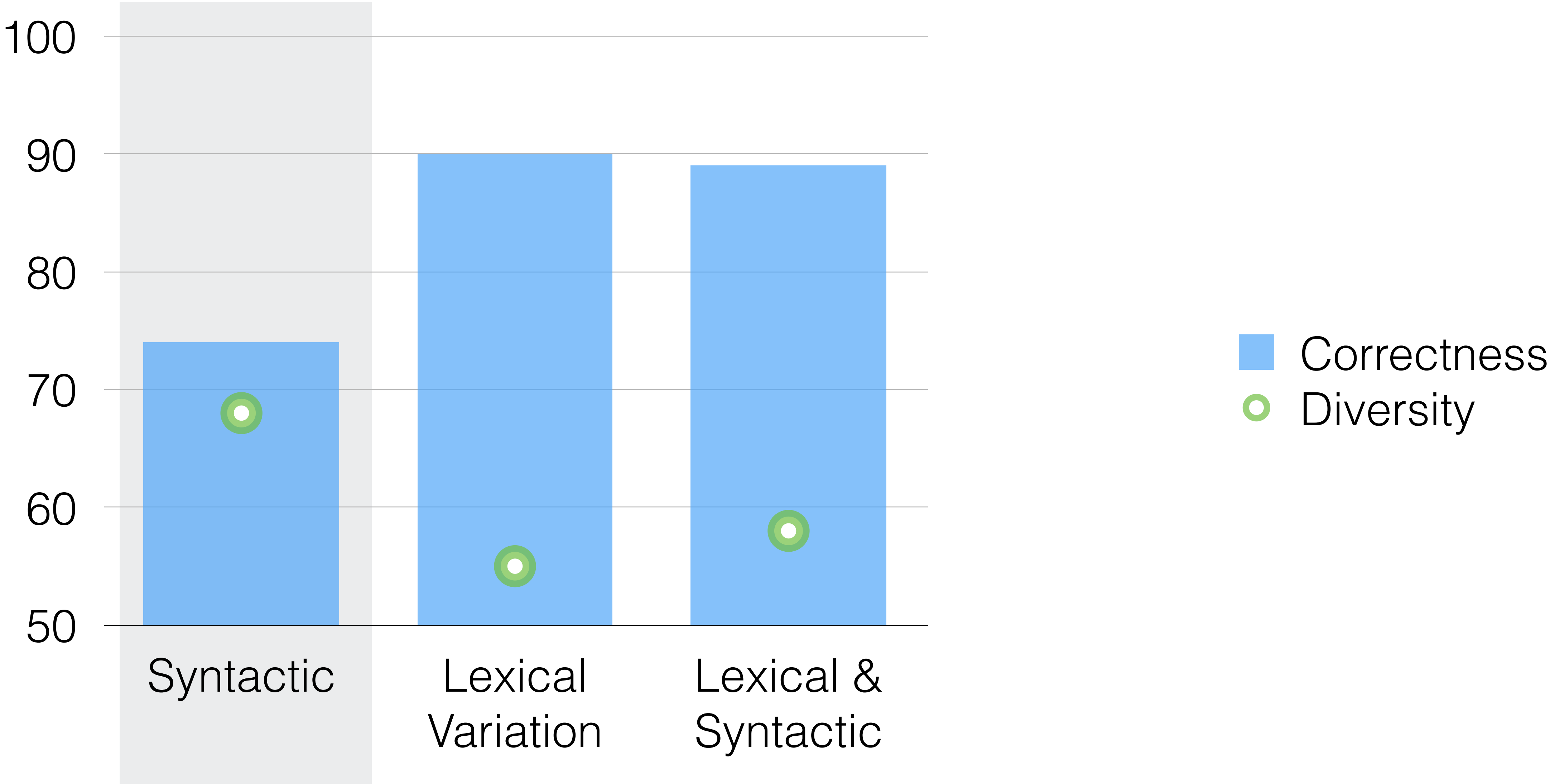


○ Diversity



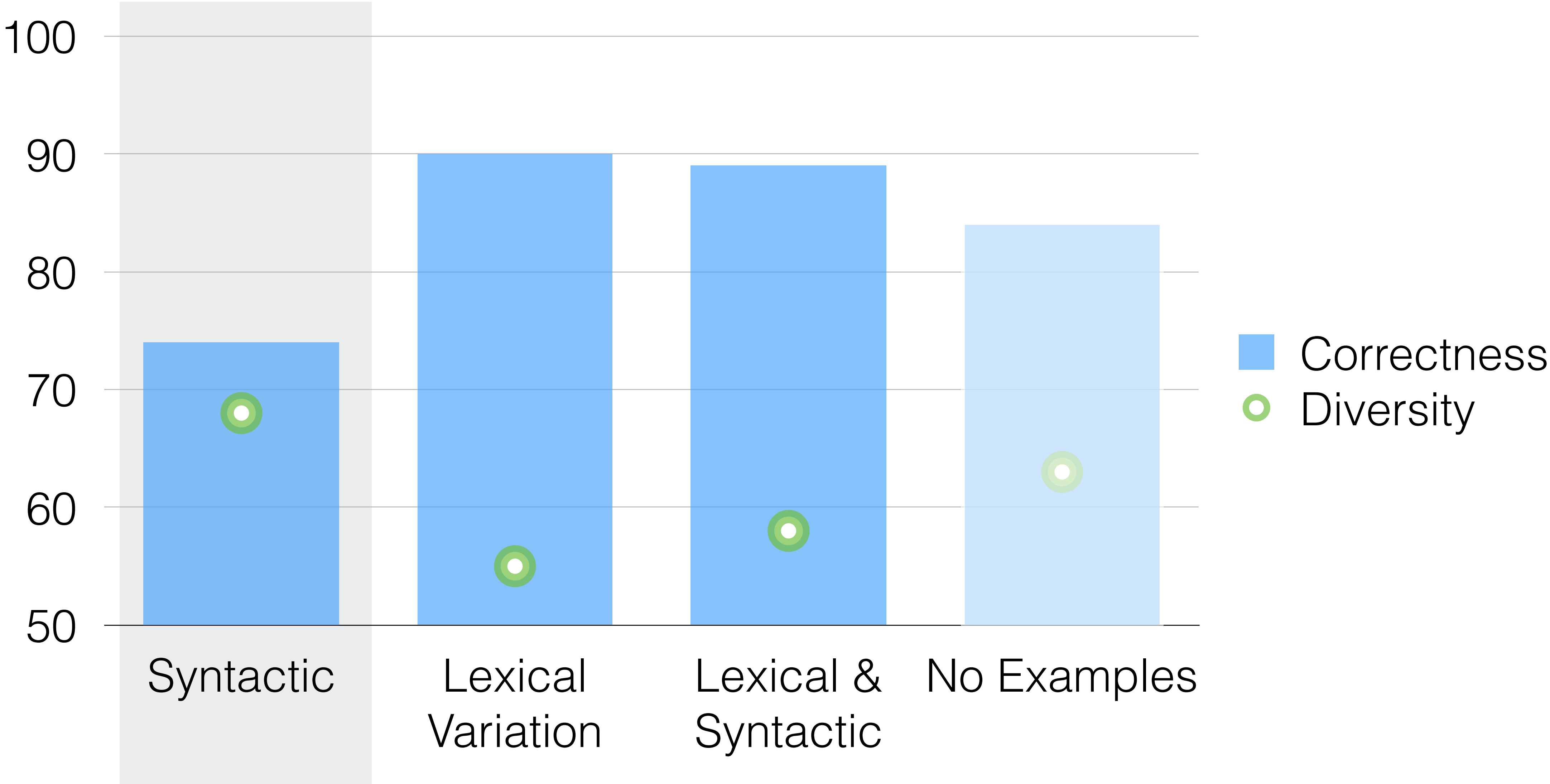
Priming has a significant impact

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Priming has a significant impact

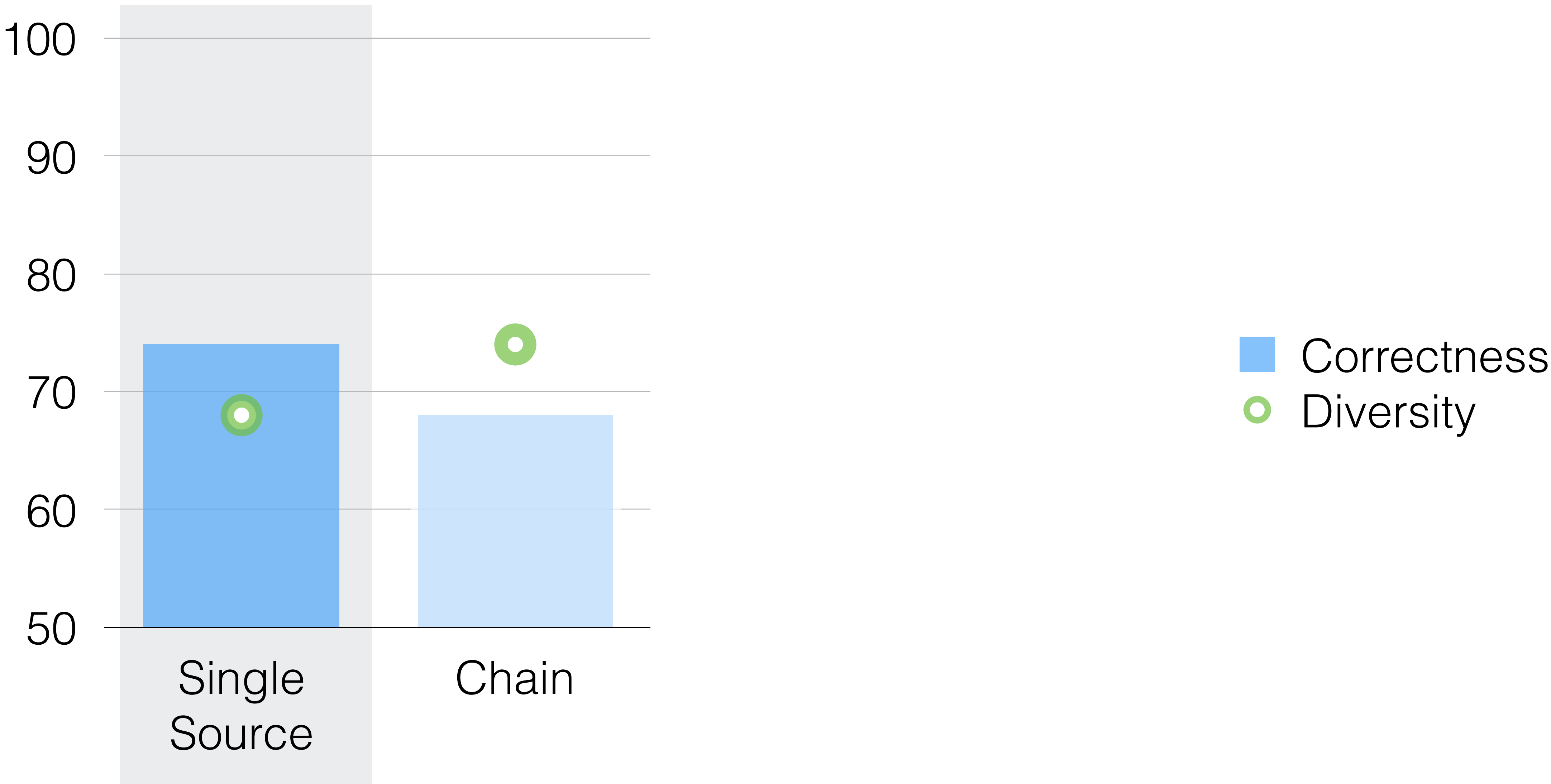
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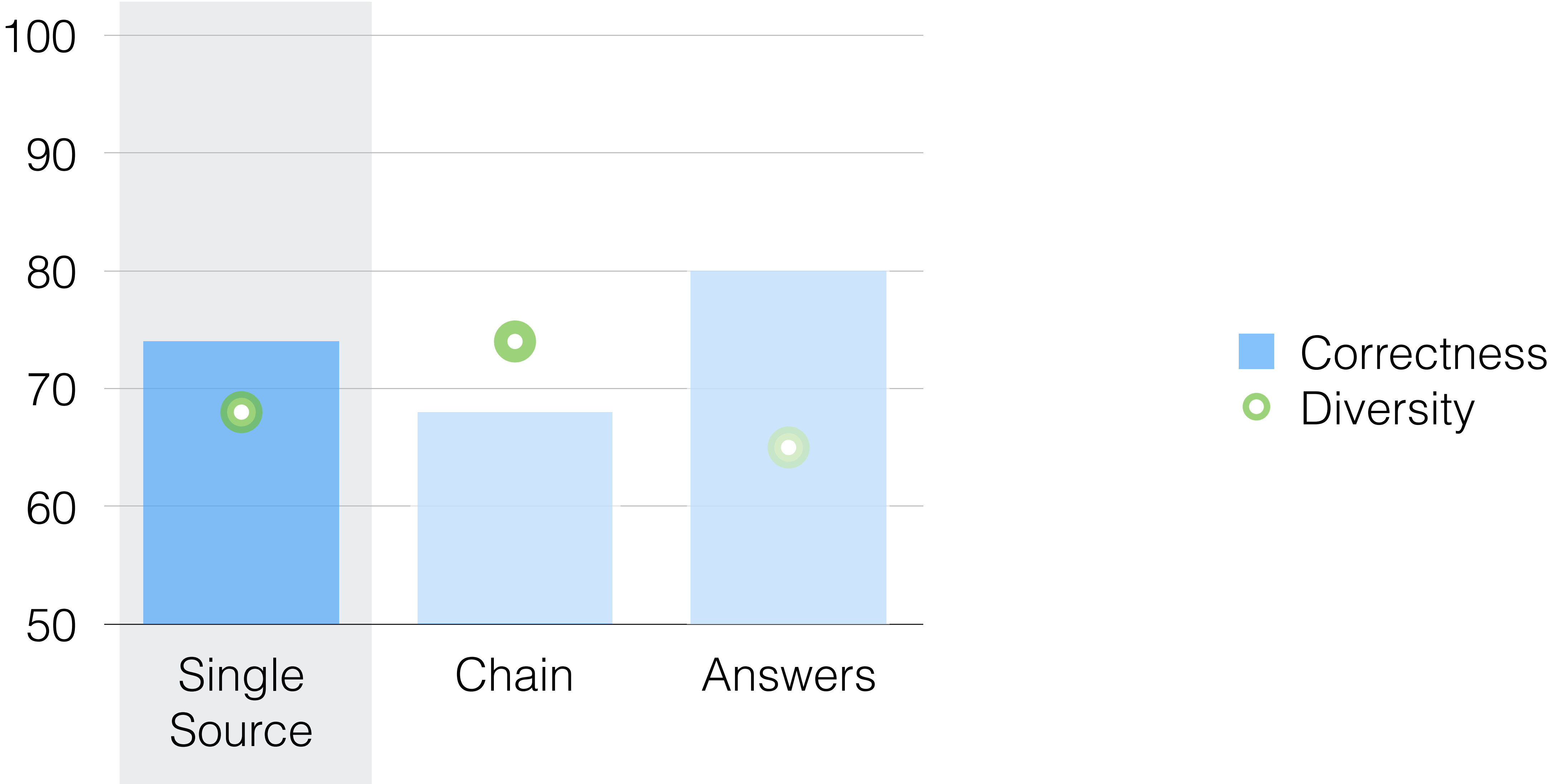
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Priming has a significant impact



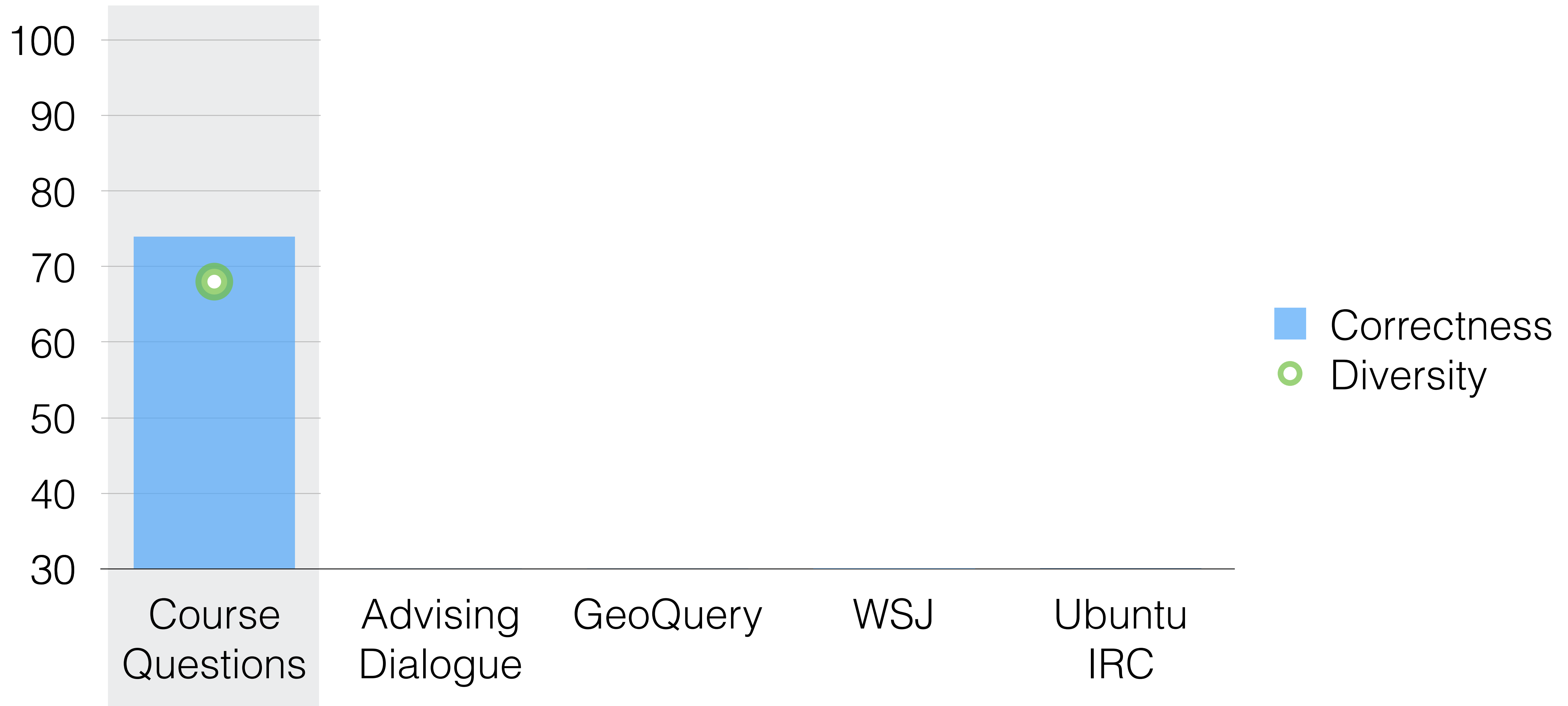
Jargon is a challenge

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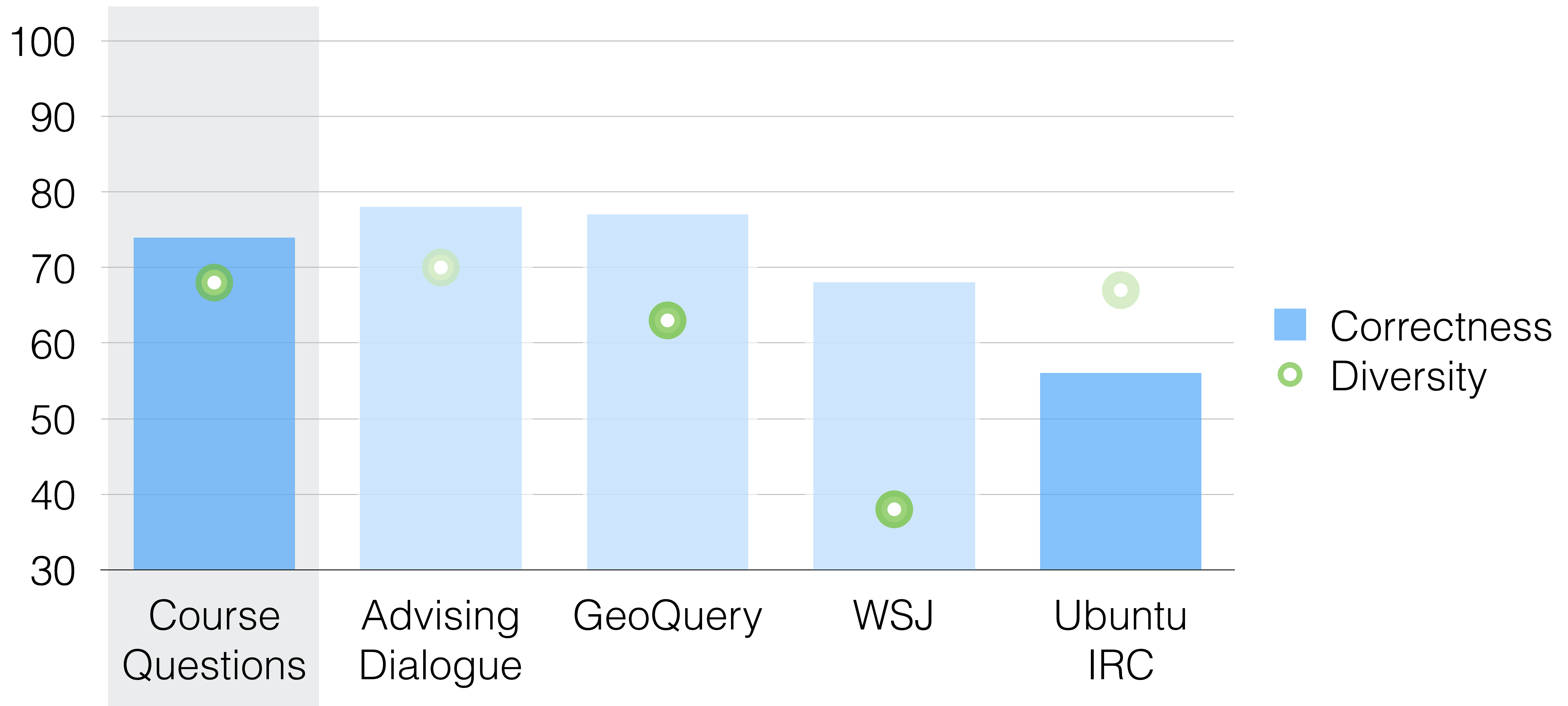
Jargon is a challenge

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Jargon is a challenge

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The first systematic study of trade-offs when crowdsourcing paraphrases

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Thank you!

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