

Quantifiers and Working Memory

Jakub Szymanik

Joint work with Marcin Zajenkowski

Amsterdam Colloquium 2009

∇
E

∇
E



Outline

Working memory in language

Quantifier verification model

Experiments

Results

Discussion

∇ E
∇ E



Outline

Working memory in language

Quantifier verification model

Experiments

Results

Discussion



Baddeley's model

WM unified system responsible for the performance in complex tasks.

- ▶ The model consists of:
 - ▶ temporary storage units:
 - ▶ phonological loop;
 - ▶ visual loop;
 - ▶ a controlling system (central executive).



Baddeley, Working memory and language: an overview, 2003

Span test

Span test

- ▶ To assess the working memory construct.

Span test

- ▶ To assess the working memory construct.
- ▶ Subjects read sentences.

Span test

- ▶ To assess the working memory construct.
- ▶ Subjects read sentences.
- ▶ They are asked to:
 - ▶ remember the final words.
 - ▶ comprehend the story.

Span test

- ▶ To assess the working memory construct.
- ▶ Subjects read sentences.
- ▶ They are asked to:
 - ▶ remember the final words.
 - ▶ comprehend the story.
- ▶ What is:
 - ▶ the number of correctly memorized words?
 - ▶ the degree of understanding?

'Computational' theory of WM

Observation

A trade-off between processing and storage functions.

'Computational' theory of WM

Observation

A trade-off between processing and storage functions.

Hypothesis

One cognitive resource – competition for a limited capacity.



Daneman and Merikle, Working memory and language comprehension, 1996

Outline

Working memory in language

Quantifier verification model

Experiments

Results

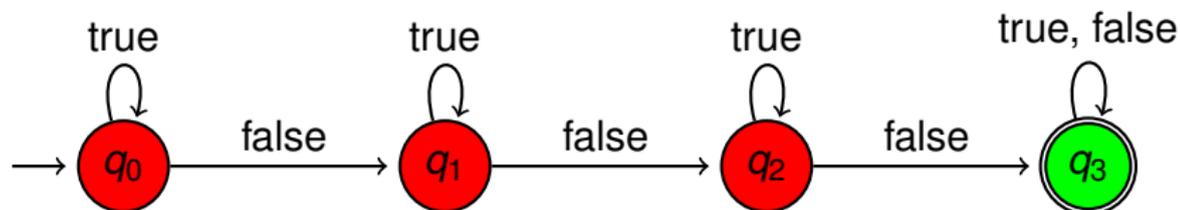
Discussion

Quantifiers determine expressivity

- ▶ **All** poets have low self-esteem.
- ▶ **Some** dean danced nude on the table.
- ▶ **At least 3** grad students prepared presentations.
- ▶ **An even number** of the students saw a ghost.
- ▶ **Most** of the students think they are smart.
- ▶ **Less than half** of the students received good marks.

Cardinal quantifiers

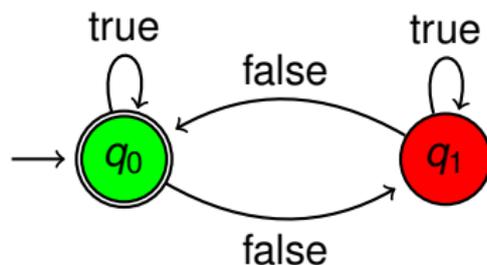
E.g. “at least 3”, “at most 7”, and “between 8 and 11”



At least 3 propositions are false.

Parity quantifiers

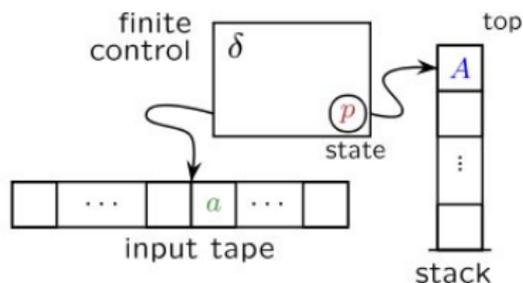
E.g. “an even number”, “an odd number”



An even number of the propositions in my paper is false.

Proportional quantifiers

- ▶ E.g. “most”, “less than half”, “one third”
- ▶ There is no finite automaton recognizing those quantifiers.
- ▶ We need internal memory.
- ▶ A push-down automata will do.



Previous investigations

Differences in brain activity.



Previous investigations

Differences in brain activity.

RT increases along with the computational resources.



McMillan et al., Neural basis for generalized quantifiers comprehension, 2005



van Benthem, Essays in logical semantics, 1986



Szymanik and Zajenkowski, Comprehension of Simple Quantifiers, 2009

Outline

Working memory in language

Quantifier verification model

Experiments

Results

Discussion



Experimental setup

Question

How additional memory load influences quantifier verification?

Experimental setup

Question

How additional memory load influences quantifier verification?

Combined task:

- ▶ memorize sequences of digits;
- ▶ verify quantifier sentences;
- ▶ recall digits.

Predictions

Difficulty (RT and accuracy) should decrease as follows:

- ▶ proportional quantifiers,
- ▶ numerical quantifiers of high rank,
- ▶ parity quantifiers,
- ▶ numerical quantifiers of low rank.

Predictions

Difficulty (RT and accuracy) should decrease as follows:

- ▶ proportional quantifiers,
- ▶ numerical quantifiers of high rank,
- ▶ parity quantifiers,
- ▶ numerical quantifiers of low rank.

Additionally:

- ▶ processing of the PQs should influence storage functions;
- ▶ the effect should be stronger in more demanding situation.

Participants

- ▶ 60 native Polish-speaking adults (42 females).
- ▶ The mean age: 24 years (SD = 4.75).
- ▶ Each participant tested individually.

Sentence verification

64 grammatically simple propositions in Polish, like:

1. More than 7 cars are blue.
2. An even number of cars is yellow.
3. Less than half of the cars are black.

Sentence verification

64 grammatically simple propositions in Polish, like:

1. More than 7 cars are blue.
 2. An even number of cars is yellow.
 3. Less than half of the cars are black.
- ▶ 8 different quantifiers divided into four groups.

Sentence verification

64 grammatically simple propositions in Polish, like:

1. More than 7 cars are blue.
 2. An even number of cars is yellow.
 3. Less than half of the cars are black.
- ▶ 8 different quantifiers divided into four groups.
1. numerical quantifiers of relatively low rank, NQ4/5;

Sentence verification

64 grammatically simple propositions in Polish, like:

1. More than 7 cars are blue.
 2. An even number of cars is yellow.
 3. Less than half of the cars are black.
- ▶ 8 different quantifiers divided into four groups.
1. numerical quantifiers of relatively low rank, NQ4/5;
 2. numerical quantifiers of relatively high rank, NQ7/8;

Sentence verification

64 grammatically simple propositions in Polish, like:

1. More than 7 cars are blue.
 2. An even number of cars is yellow.
 3. Less than half of the cars are black.
- ▶ 8 different quantifiers divided into four groups.
1. numerical quantifiers of relatively low rank, NQ4/5;
 2. numerical quantifiers of relatively high rank, NQ7/8;
 3. parity quantifiers, DQ;

Sentence verification

64 grammatically simple propositions in Polish, like:

1. More than 7 cars are blue.
 2. An even number of cars is yellow.
 3. Less than half of the cars are black.
- ▶ 8 different quantifiers divided into four groups.
1. numerical quantifiers of relatively low rank, NQ4/5;
 2. numerical quantifiers of relatively high rank, NQ7/8;
 3. parity quantifiers, DQ;
 4. proportional quantifiers, PQ.

Sentence verification

64 grammatically simple propositions in Polish, like:

1. More than 7 cars are blue.
 2. An even number of cars is yellow.
 3. Less than half of the cars are black.
- ▶ 8 different quantifiers divided into four groups.
1. numerical quantifiers of relatively low rank, NQ4/5;
 2. numerical quantifiers of relatively high rank, NQ7/8;
 3. parity quantifiers, DQ;
 4. proportional quantifiers, PQ.

Memory Task

- ▶ At the beginning of each trial a sequence of digits.

Memory Task

- ▶ At the beginning of each trial a sequence of digits.
- ▶ 2 experimental conditions:
 - ▶ 4 digits
 - ▶ 6 digits

Memory Task

- ▶ At the beginning of each trial a sequence of digits.
- ▶ 2 experimental conditions:
 - ▶ 4 digits
 - ▶ 6 digits
- ▶ After verification task: recall the string.

Outline

Working memory in language

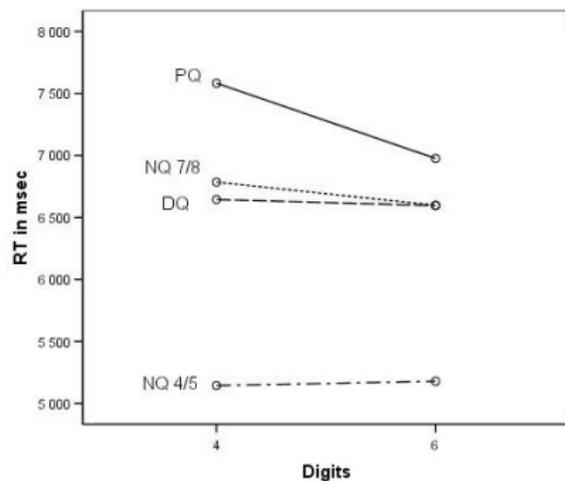
Quantifier verification model

Experiments

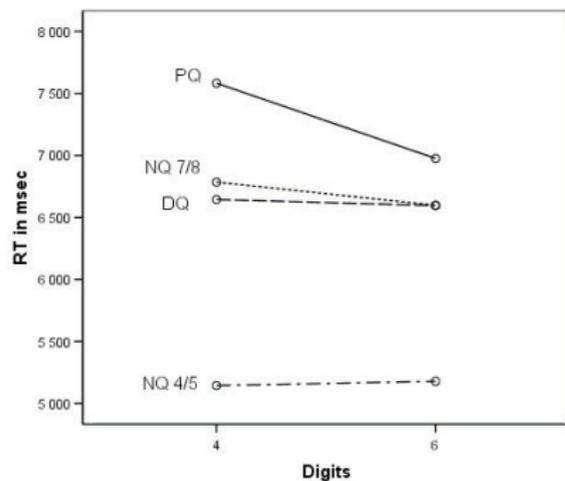
Results

Discussion

RT in verification task

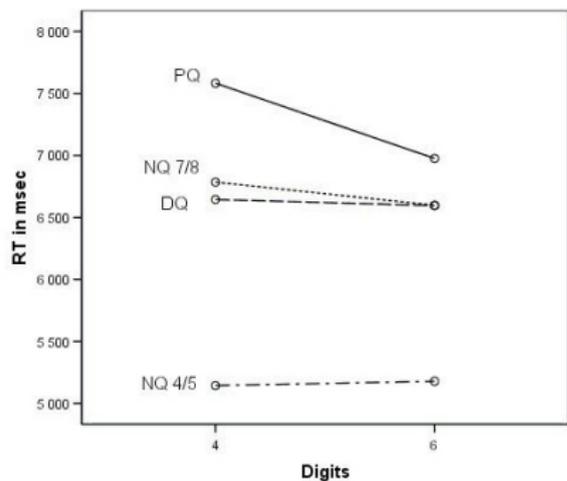


RT in verification task



RT determined by quantifier type in 4-digit:

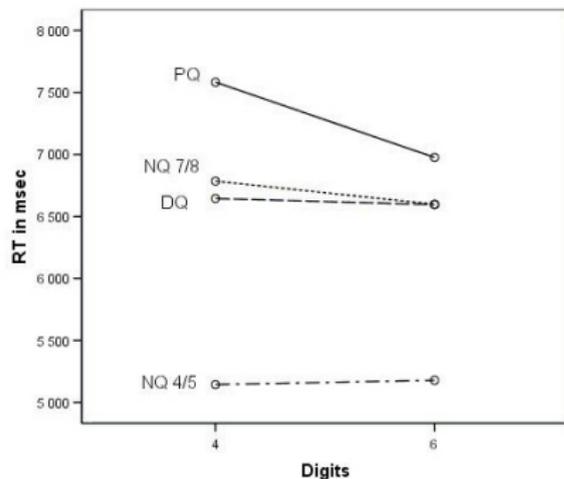
RT in verification task



RT determined by quantifier type in 4-digit:

- ▶ PQ solved longer than others;

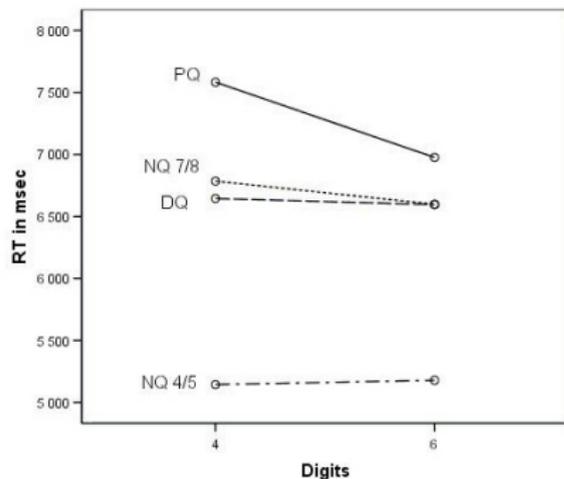
RT in verification task



RT determined by quantifier type in 4-digit:

- ▶ PQ solved longer than others;
- ▶ NQ 4/5 processed shorter than the rest;

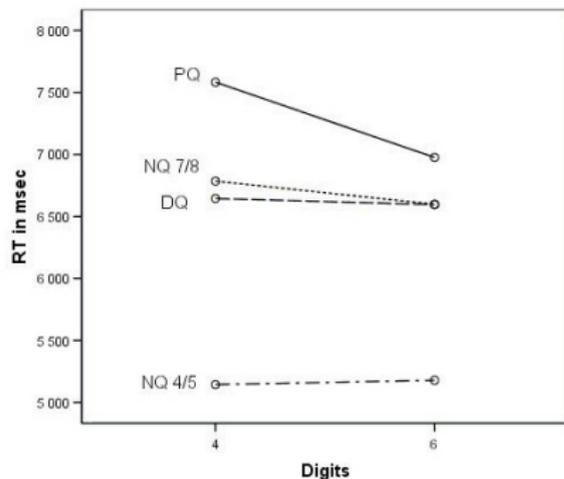
RT in verification task



RT determined by quantifier type in 4-digit:

- ▶ PQ solved longer than others;
- ▶ NQ 4/5 processed shorter than the rest;
- ▶ No difference between DQ and NQ 7/8.

RT in verification task

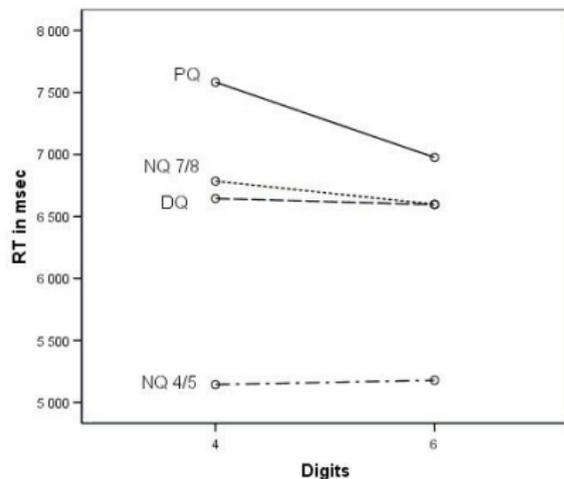


RT determined by quantifier type in 4-digit:

- ▶ PQ solved longer than others;
- ▶ NQ 4/5 processed shorter than the rest;
- ▶ No difference between DQ and NQ 7/8.

6-digit condition:

RT in verification task



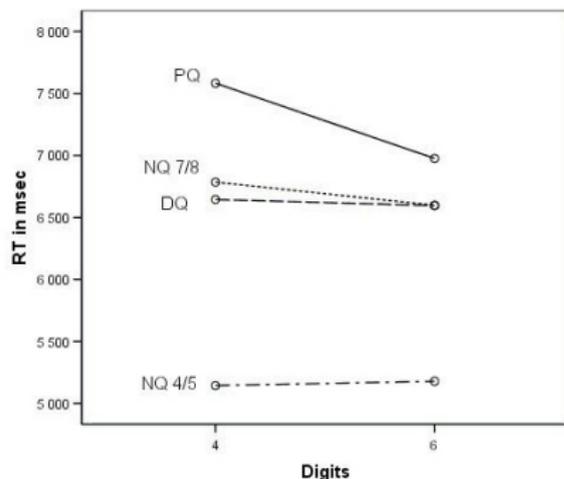
RT determined by quantifier type in 4-digit:

- ▶ PQ solved longer than others;
- ▶ NQ 4/5 processed shorter than the rest;
- ▶ No difference between DQ and NQ 7/8.

6-digit condition:

- ▶ NQ 4/5 had the shortest average RT.

RT in verification task



RT determined by quantifier type in 4-digit:

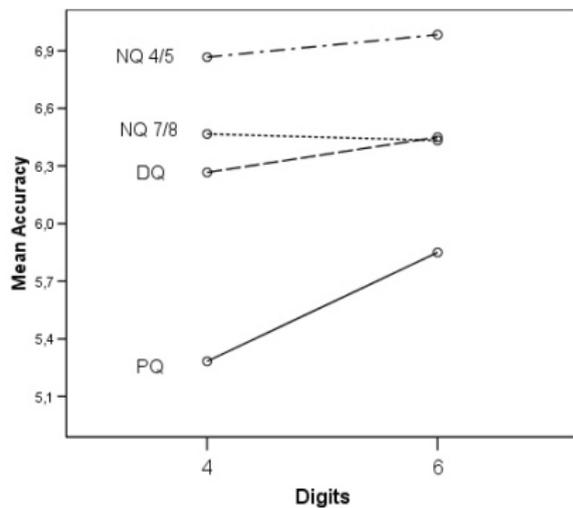
- ▶ PQ solved longer than others;
- ▶ NQ 4/5 processed shorter than the rest;
- ▶ No difference between DQ and NQ 7/8.

6-digit condition:

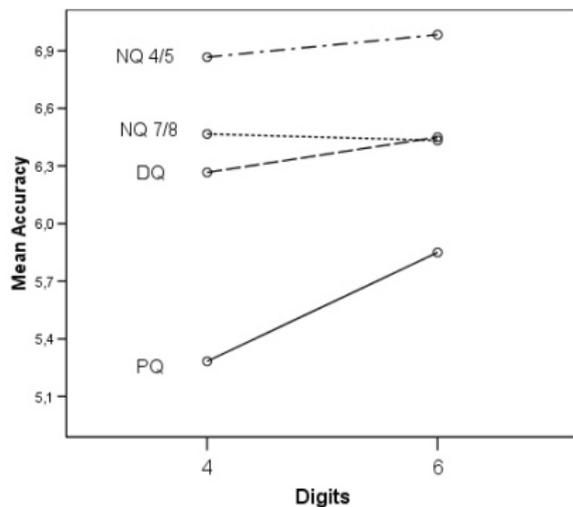
- ▶ NQ 4/5 had the shortest average RT.

Only PQ differed between memory load conditions.

Accuracy in verification task

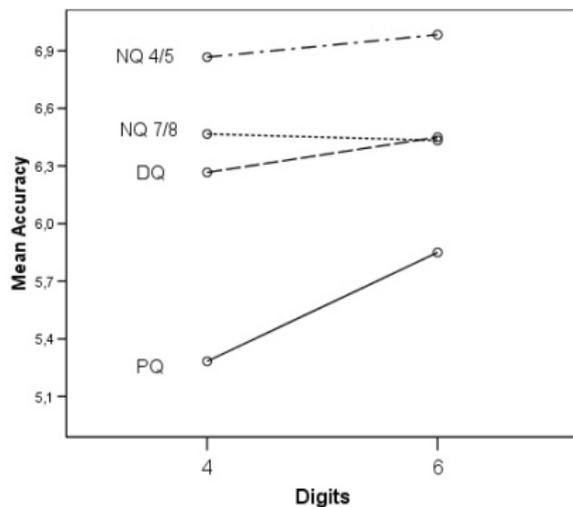


Accuracy in verification task



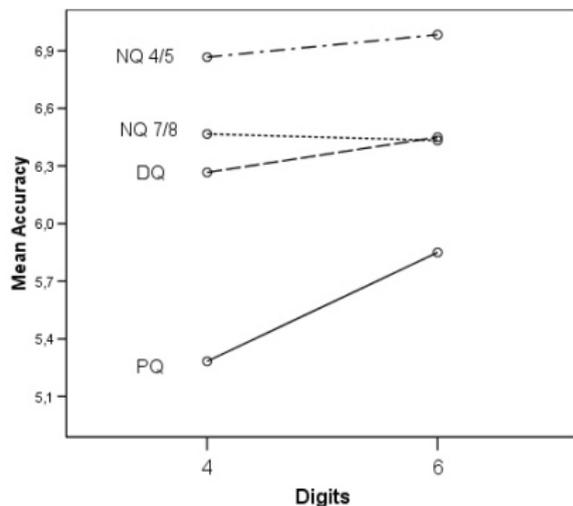
- ▶ All quantifiers differed significantly,
- ▶ besides DQ and NQ 7/8.

Accuracy in verification task



- ▶ All quantifiers differed significantly,
- ▶ besides DQ and NQ 7/8.
- ▶ Large effect for PQ!

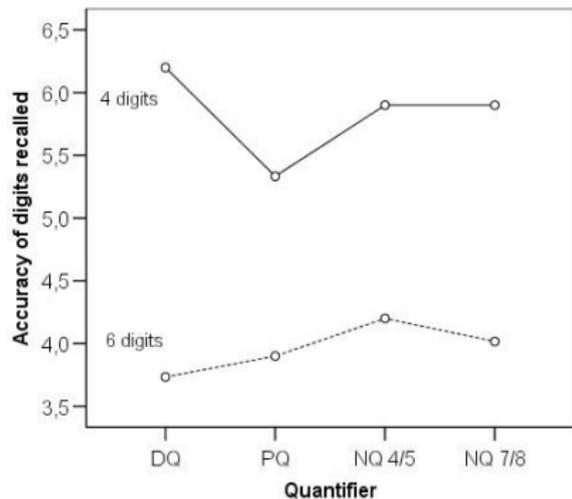
Accuracy in verification task



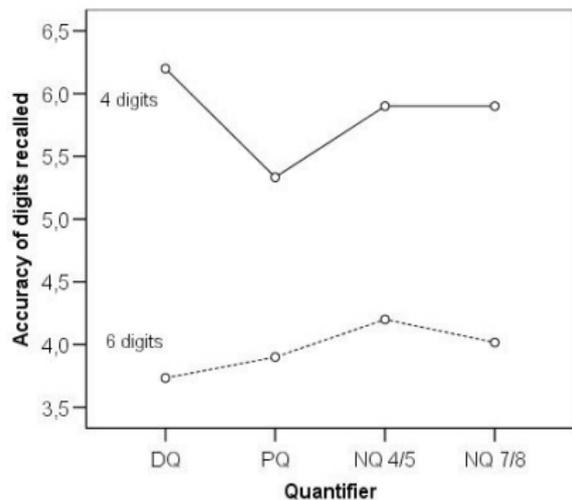
- ▶ All quantifiers differed significantly, besides DQ and NQ 7/8.
- ▶ Large effect for PQ!

In 4-digit condition all quantifiers were performed worse.

Memory task: recall accuracy

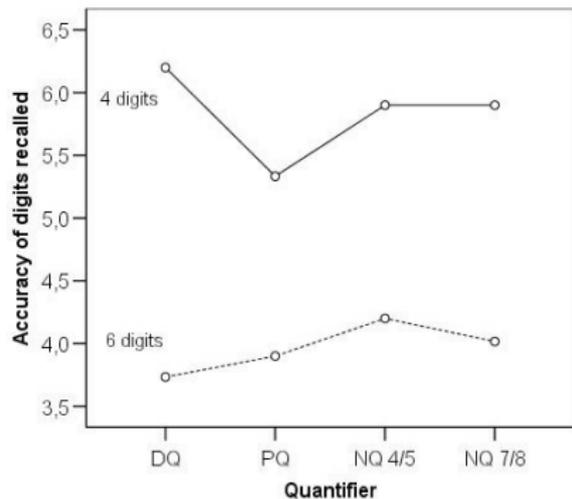


Memory task: recall accuracy



- ▶ In 4-digit with PQ: the worst;

Memory task: recall accuracy



- ▶ In 4-digit with PQ: the worst;
- ▶ In 6-digit: no differences.

Outline

Working memory in language

Quantifier verification model

Experiments

Results

Discussion



Summary

Summary

- ▶ In 4-digit automata were good predictors of difficulty.

Summary

- ▶ In 4-digit automata were good predictors of difficulty.
- ▶ Discrepancy under two memory load conditions:
 - ▶ The real differences occurred only in 4-digit condition.
 - ▶ Holding six elements in memory was probably too difficult.
 - ▶ Trade-off between processing and storage.

Proportional quantifiers

- ▶ 4-digit strings accompanying this class were recalled worst.
- ▶ But no differences in 6-digit condition:
 - ▶ RT decreased: subjects ignored recalling.
- ▶ WM engagement PQ processing is qualitatively different.

Numerical quantifiers

Hypothesis

The number of states is a good predictor of cognitive load.

Difference between numerical quantifiers of low and high ranks.

Thank you!

E
A

E
A

