

Spontaneous Retrieval for Prospective Memory

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What is Spontaneous Retrieval?

An automatic, cue-less retrieval from long-term memory

- ▶ the original motivation for spreading activation work in Soar

This talk:

- ▶ How does spontaneous retrieval work?
- ▶ What are the benefits of spontaneous retrieval?
 - ▶ Generally?
 - ▶ For prospective memory?

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 - ▶ the most activated element is retrieved

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- ▶ Instead of “deliberate”, retrieval is “spontaneous” every decision cycle
- ▶ Instead of “cued”, retrieval is selected only on base-level and spreading
 - ▶ the most activated element is retrieved
- ▶ Instead of the SMem buffer... actually, it's the same the SMem buffer
 - ▶ retrieval only occurs when SMem is not in deliberate use

Theoretical Benefits of Spontaneous Retrieval

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Claim Spontaneous retrieval allows an agent deal with:

1. not knowing *what cue to use*
2. not knowing *when time to initiate search*

The Missing Link Puzzle

Find a word that forms compound words with all of the clue words

- ▶ Clue (*Stems*): fall, fort, time

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Find a word that forms compound words with all of the clue words

- ▶ Clue (*Stems*): fall, fort, time
- ▶ Answer: night (nightfall, fortnight, nighttime)

- ▶ Stems: ball, fish, piece
- ▶ Answer: eye (eyeball, fisheye, eyepiece)

Missing Link Strategy

1. Use *ball* and retrieve all its compound words
handball, football, eyeball, ...
2. Use *fish* and retrieve all its compound words
fishtail, fisheye, ...
3. Find common links
 $eyeball \cap fisheye = eye$
4. Check if *piece* also forms a compound word
 $eye + piece = eyepiece$
5. Give answer/Give up

Evaluate based on time taken, not correctness of answer

Unknown Search Cue

What if a puzzle has more than 3 stems?

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Instead of

- ▶ Stems: ball, fish, piece

The agent gets

- ▶ Stems: ball, boat, fish, land, piece

Unknown Search Cue: Results

What if a puzzle has more than 3 stems?

No. of Distractors	Decision Cycles		Real Time (msec)	
	Delib.	Spon.	Delib.	Spon.
0	56.1	24.5	2631.6	350.7
1	65.1	26.6	3048.6	341.4
2	70.9	28.2	5752.1	319.4
3	80.8	32.8	3679.1	613.5
4	84.5	40.0	17591.5	840.0

Unknown Search Initiation

What if not all puzzles are solvable?

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What if not all puzzles are solvable?

Instead of

- ▶ ...
- ▶ Stems: fall, fort, time
- ▶ Stems: ball, fish, piece
- ▶ ...

The agent gets

- ▶ ...
- ▶ Stems: fall, fort, drop
- ▶ Stems: ball, fish, piece
- ▶ ...

Unknown Search Initiation: Results

What if not all puzzles are solvable?

Probability Solvable	Decision Cycles		Real Time (msec)	
	Delib.	Spon.	Delib.	Spon.
1.0	56.1	24.5	2631.6	100.5
0.9	56.1	25.9	2602.9	159.6
0.8	55.5	27.6	2464.0	165.4
0.7	56.0	29.8	2555.8	178.0
0.6	55.9	30.5	2459.8	179.9
0.5	53.9	31.9	2099.2	186.5
0.4	51.4	35.3	1677.9	218.3
0.3	50.3	38.1	1574.2	247.0
0.2	49.5	40.0	1400.6	263.4
0.1	49.0	41.2	1324.1	264.3
0.0	47.8	42.7	1099.5	316.8

Summary

Spontaneous retrieval is a fallback heuristic when

1. it's unclear which features are relevant
2. it's unclear whether relevant knowledge exists

Positive results in the Missing Link domain support this claim

Prospective Memory

A “fuzzy set” of intuitions around “remembering to *do something* at a particular *moment (or time period) in the future*” (McDaniel and Einstein, 2007)

Five stages in completing a prospective task:

1. **Encoding** - asked to pass a message to John
2. **Retention** - perform other tasks
3. **Initiation** - see John
4. **Execution** - pass the message
5. **Completion** - remove goal from memory

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Key question: How does the agent know that a goal is relevant if the goal is in long-term memory?

Spontaneous Retrieval for Prospective Memory

Why is this hard?

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Prospective memory has:

- ▶ many non-goal-related features
- ▶ no indication of when a goal is relevant
- ▶ ... or if there is a relevant goal at all

Spontaneous Retrieval for Prospective Memory

Why is this hard?

Prospective memory has:

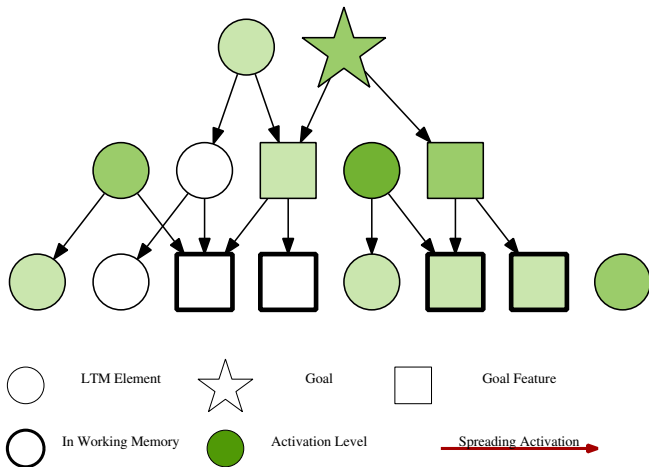
- ▶ many non-goal-related features
- ▶ no indication of when a goal is relevant
- ▶ ... or if there is a relevant goal at all

Spontaneous retrieval is good when:

- ▶ it's unclear which features are relevant
- ▶ it's unclear whether relevant knowledge exists

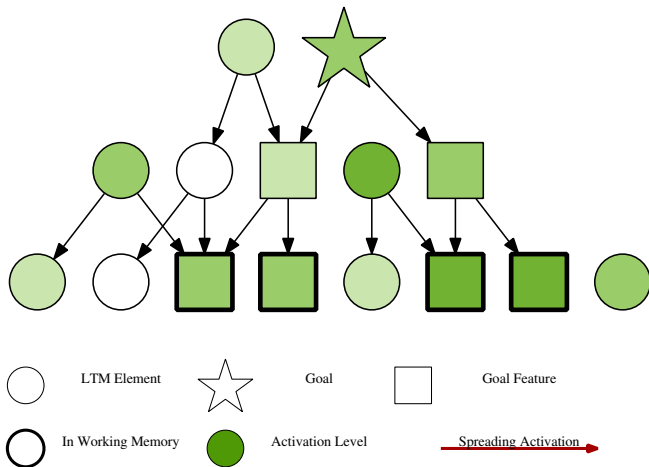
Spontaneous Retrieval Example

Percepts enter working memory, causing activation boost



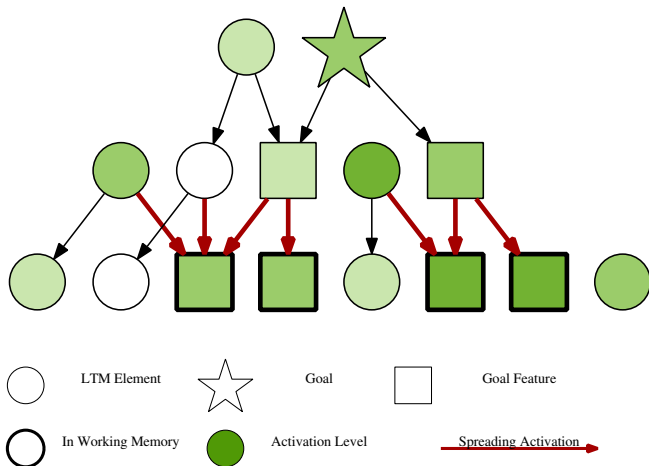
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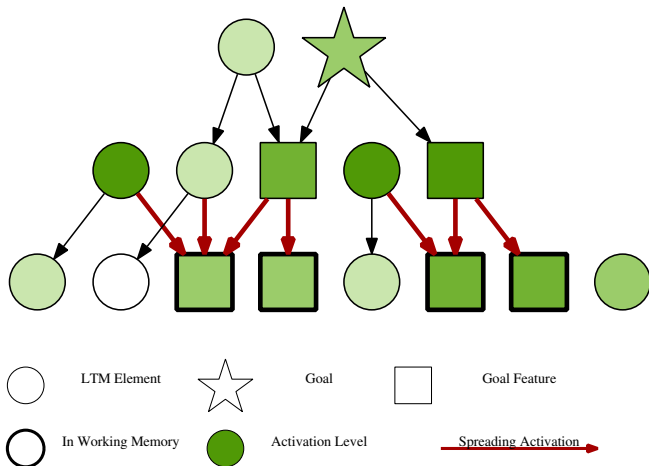
Spontaneous Retrieval Example

Activation spreads, causing addition boosts



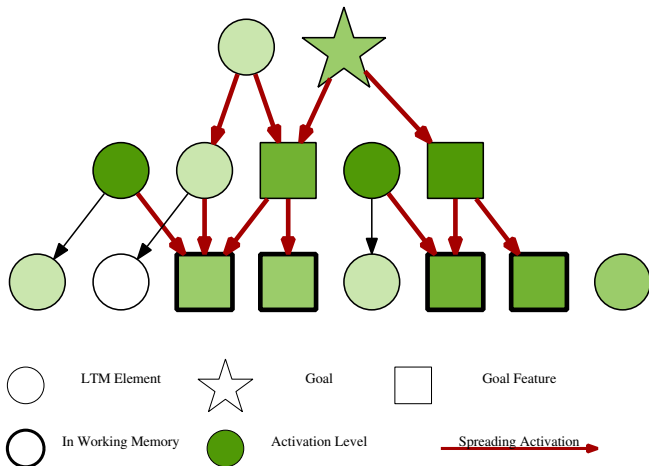
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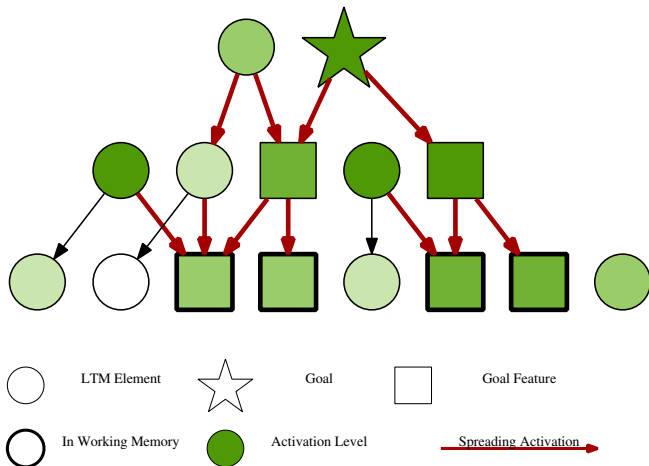
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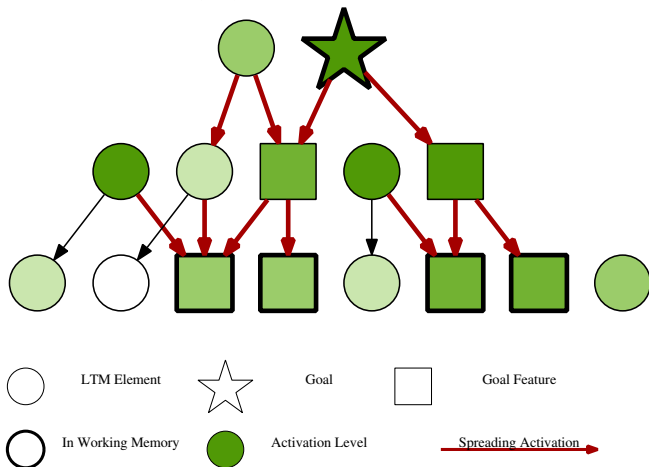
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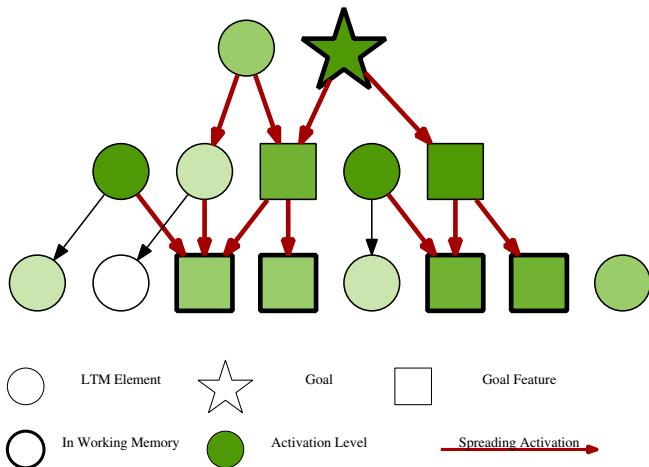
Spontaneous Retrieval Example

The most-highly activated element is retrieved



Spontaneous Retrieval Example

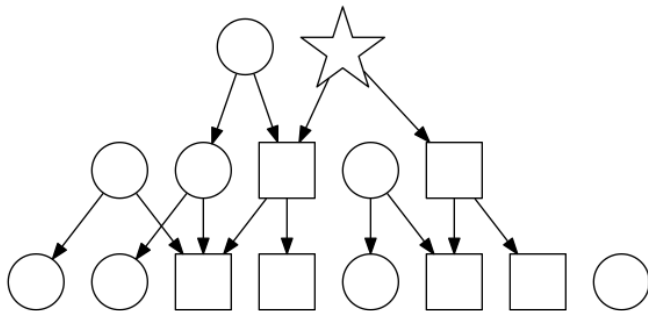
The goal is now in working memory and can be executed



Effects of Encoding Specificity

Encoding specificity: When the cues at encoding matches those at retrieval

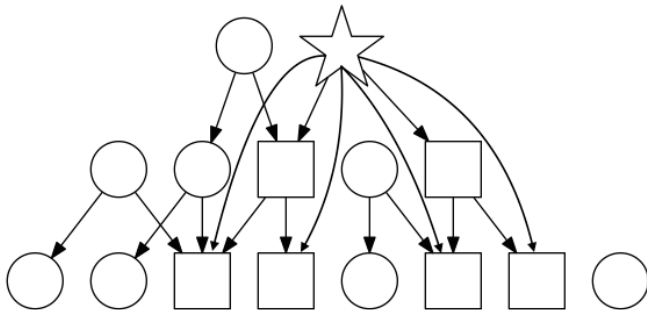
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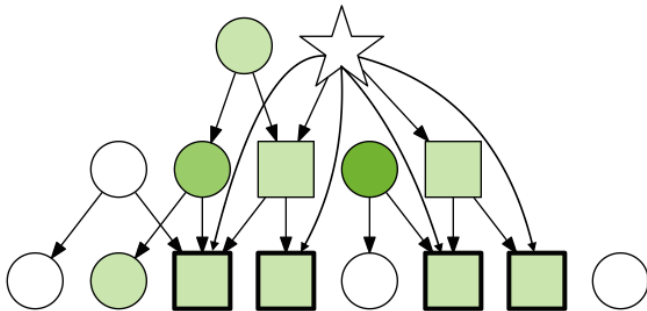
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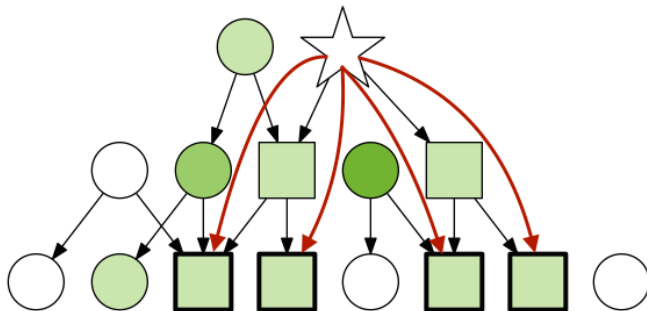
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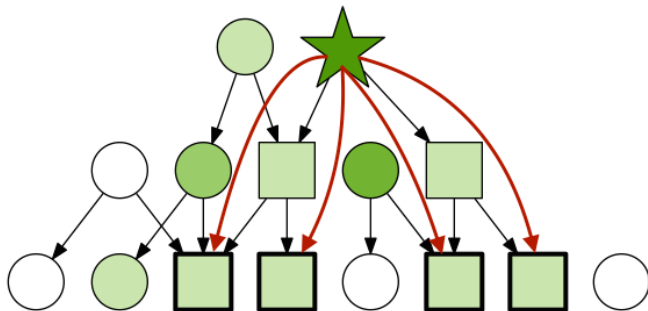
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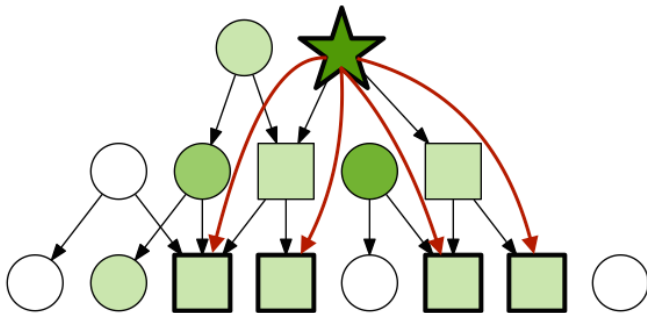
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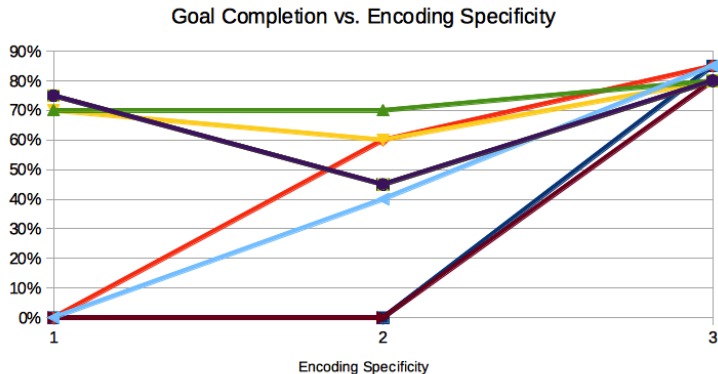
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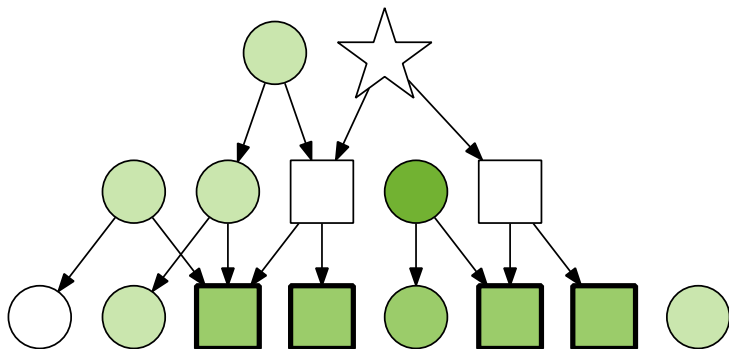


Encoding Specificity Results



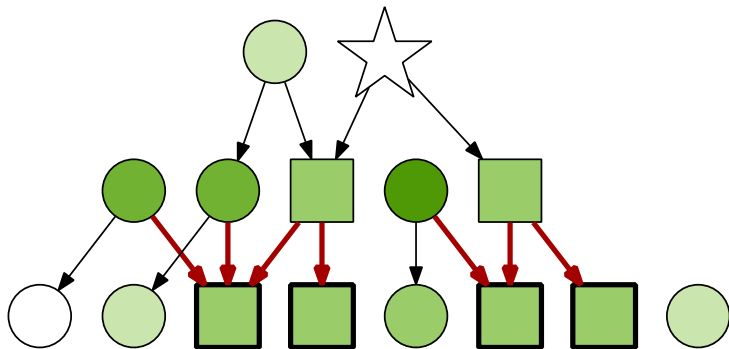
Effects of Retention Length

Assumption: goal features are perceived infrequently during retention



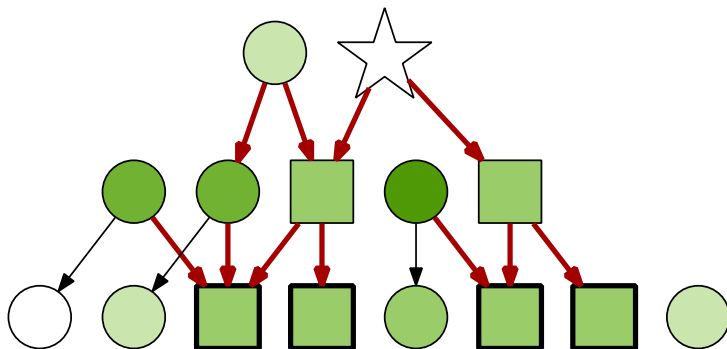
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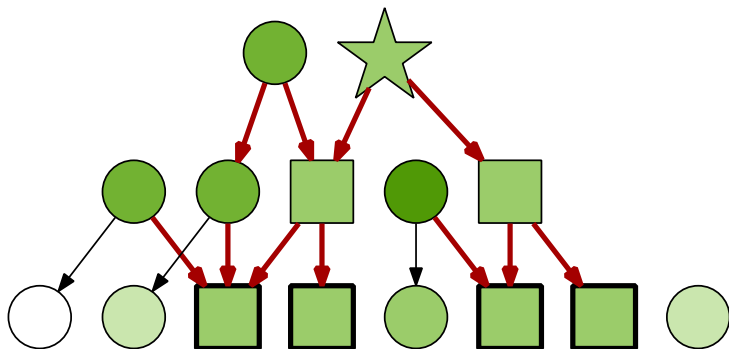
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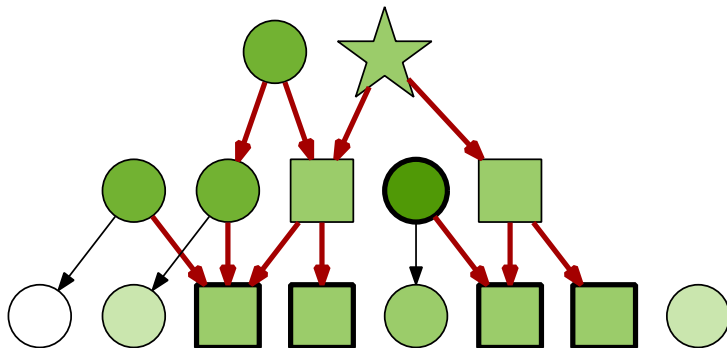
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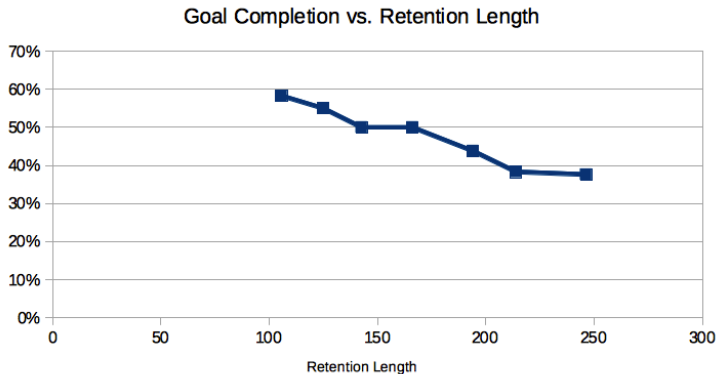


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Retention Length Results



Summary

Human prospective memory performance:

- ▶ increases with more specific encodings
- ▶ decreases with longer retention periods

These trends fall out of a spontaneous retrieval strategy that uses spreading activation

Nuggets and Coal

The Good

- ▶ Spontaneous retrieval seems useful

The Bad

- ▶ Large space of spontaneous retrieval mechanisms
- ▶ Lack of real-world domain for prospective memory evaluation

Questions?

