Preemptive Strategies for Overcoming the Forgetting of Goals To be presented at AAAI 2013

Justin Li John Laird

Computer Science and Engineering University of Michigan justinnh,laird@umich.edu

2013-06-05

Forgetting in ACT-R and Soar

- Memory elements are removed architecturally
- Soar
 - working memory elements decay via base-level activation
- ACT-R
 - limited working-memory size require memory elements be over-written
 - long-term memory elements decay via base-level activation

Forgetting in ACT-R and Soar

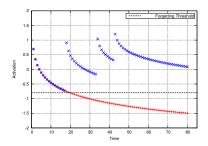
- Memory elements are removed architecturally
- Soar
 - working memory elements decay via base-level activation
- ACT-R
 - limited working-memory size require memory elements be over-written
 - Iong-term memory elements decay via base-level activation
- To understand preemptive strategies, need to first understand base-level activation

Base-Level Activation

 Memory elements are forgotten if their activation falls below a threshold

$$A = \ln(\sum_{j=1}^n t_j^{-d})$$

- d the decay rate (an architectural parameter)
- t_j time since access j
- Activation increases with recency and frequency of access



Preemptive Actions

- Two actions
 - rehearsal: boost the activation of an existing goal
 - retrieval: bring back a forgotten goal
- When should the agent perform these actions?

Preemptive Triggers

When do goals come to mind in human behavior?

- ► For *time-based* targets, periodically
- For event-based targets, during context switches

Preemptive Triggers

When do goals come to mind in human behavior?

- ► For *time-based* targets, periodically
- For event-based targets, during context switches

Two triggers:

- timing: periodically, over some time span
- context: at context-switches, which precede large changes in perception

Preemptive Strategies

This gives four variations:

- Two actions
 - rehearsal: boost the activation of an existing goal
 - retrieval: bring back a forgotten goal
- Two triggers:
 - timing: periodically, over some time span
 - context: at context-switches, which precede large changes in perception

Preemptive Strategies

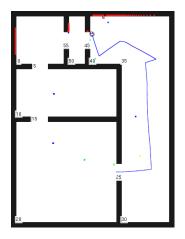
This gives four variations:

- Two actions
 - rehearsal: boost the activation of an existing goal
 - retrieval: bring back a forgotten goal
- Two triggers:
 - timing: periodically, over some time span
 - context: at context-switches, which precede large changes in perception
- Two questions:
 - 1. How do preemptive strategies scale to large numbers of intentions?
 - 2. How successful are these strategies?

Forgetting Methods Evaluation Summary

Mobile Robot Domain

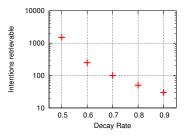
- Strategies implemented in simulated indoor mobile robot
- Robot must pick up and deliver objects while keeping to a patrol
- Robot does not know the location of objects
- Measure deliveries completed in various conditions



Forgetting Methods Evaluation Summary

Scalability Results

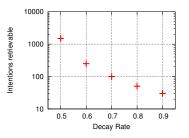
 Soar: Number of intentions retrievable until the first is forgotten



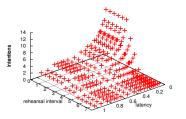
Forgetting Methods Evaluation Summary

Scalability Results

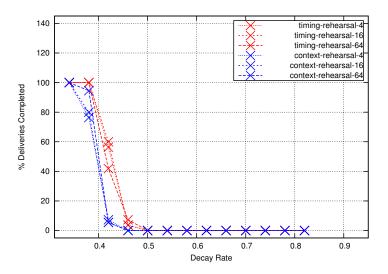
 Soar: Number of intentions retrievable until the first is forgotten



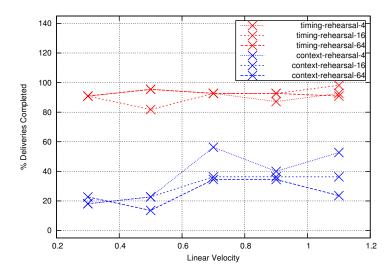
 ACT-R: Number of intentions retrievable after 20 sec, d = 0.5



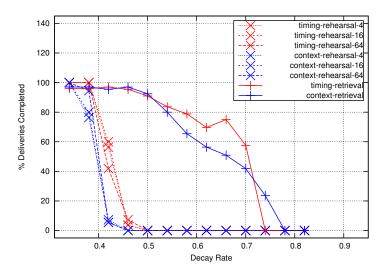
Strategy Comparison Results



Strategy Comparison Results



Strategy Comparison Results



Nuggets and Coal

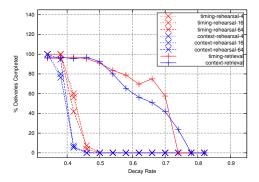
Nuggets

- Preemptive strategies are a viable solution to prospective memory
- Functional Soar agent implementing preemptive strategies
- Delivery domain for prospective memory evaluation
- Understanding of effects of domain parameters on preemptive strategies

Coal

- Preemptive strategies are domain dependent
 - rehearsal strategies require agent knowledge of decay rate and temporal dynamics
 - timing triggers also require the same
 - context-switch triggers require domain knowledge
- Mixture of strategies were not explored

For details: Li, Laird (2013). Preemptive Strategies for Overcoming the Forgetting of Goals. In *Proceedings of the 27th AAAI Conference on Artificial Intelligence*, Bellevue, WA.



Trigger Comparison Results

- Timing triggers are expensive
 - for 64 rehearsals, take up 9% of agent decisions
 - for retrievals, require 50% more retrievals than context-switches
- Context-switches are more predictive of opportunity