

Soar-EpMem Tutorial

Soar Workshop 30

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Topics

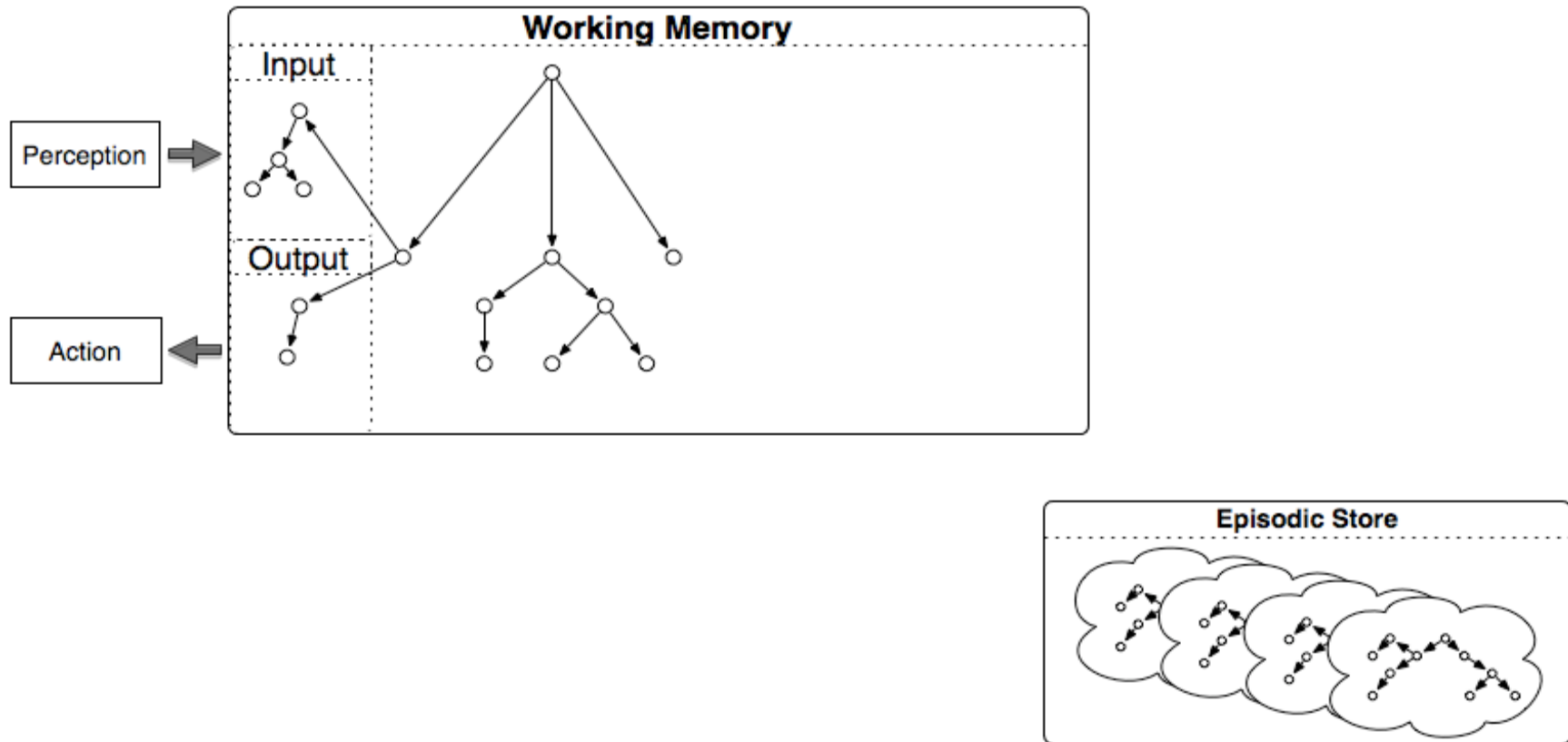
- Big picture
- Demo
- Basic usage
- Additional resources

Big Picture

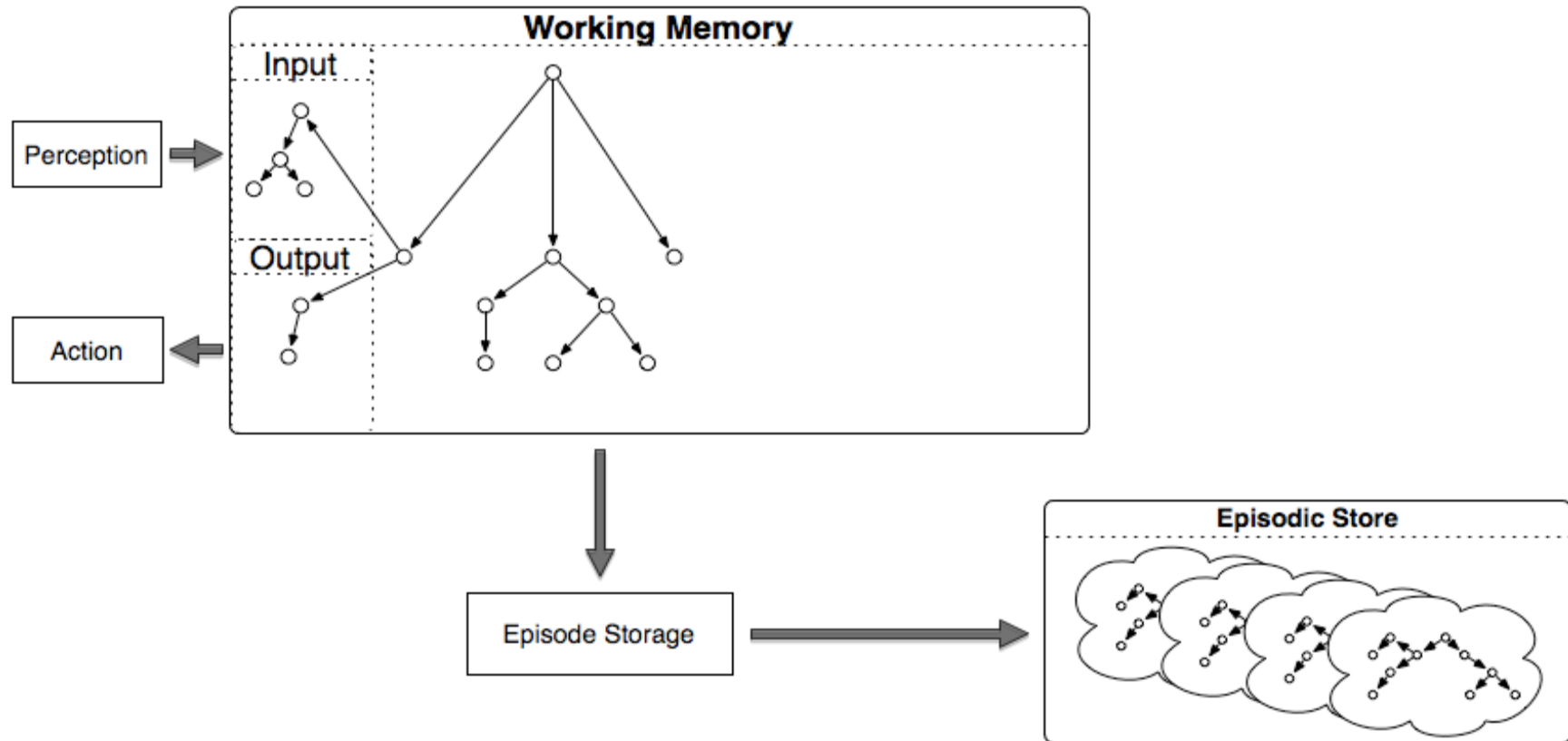
Episodic memory is a weak learning mechanism

- Automatically stores and temporally indexes agent state
- Supports an *efficient*, content-addressable agent interface to auto-biographical prior experience

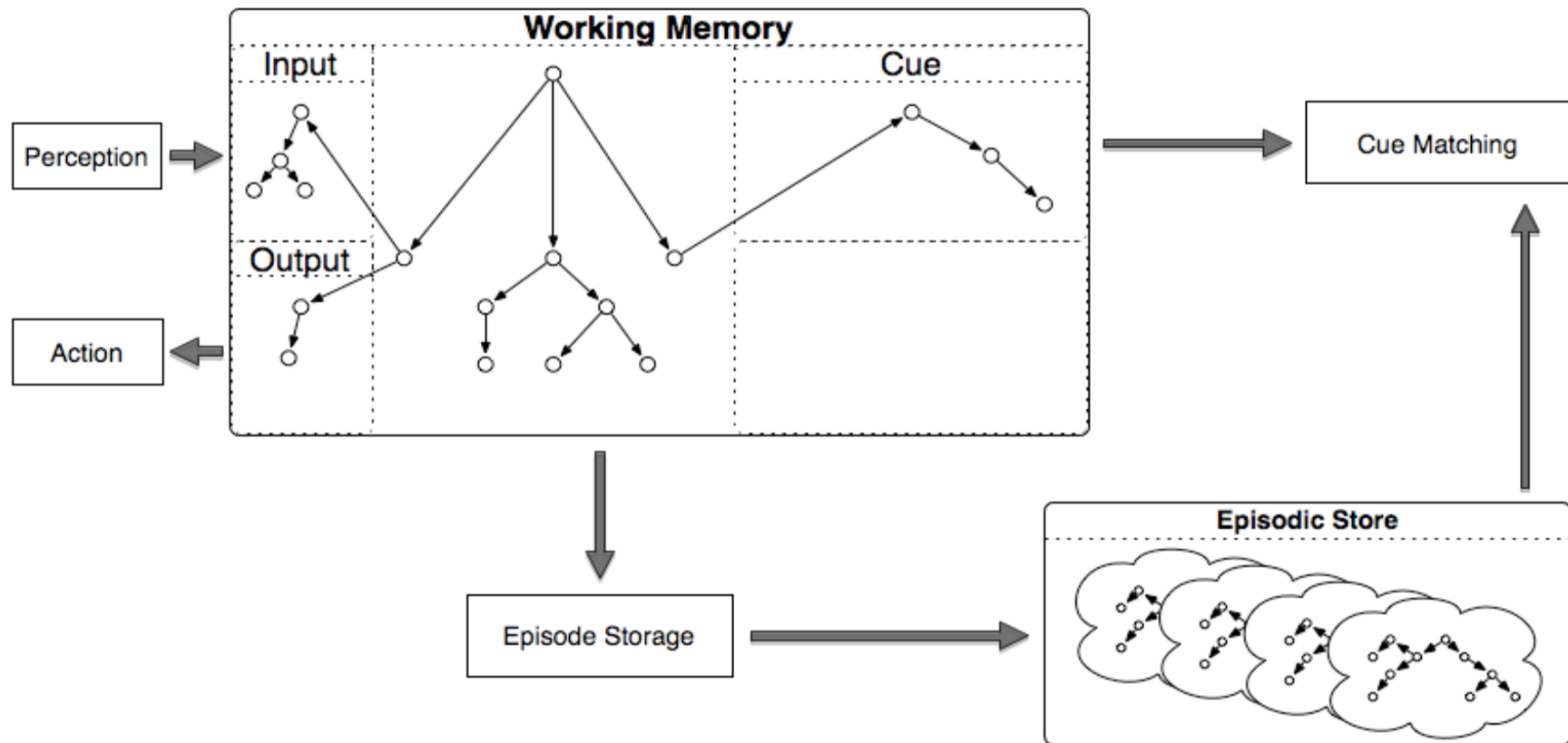
Episodic Operations



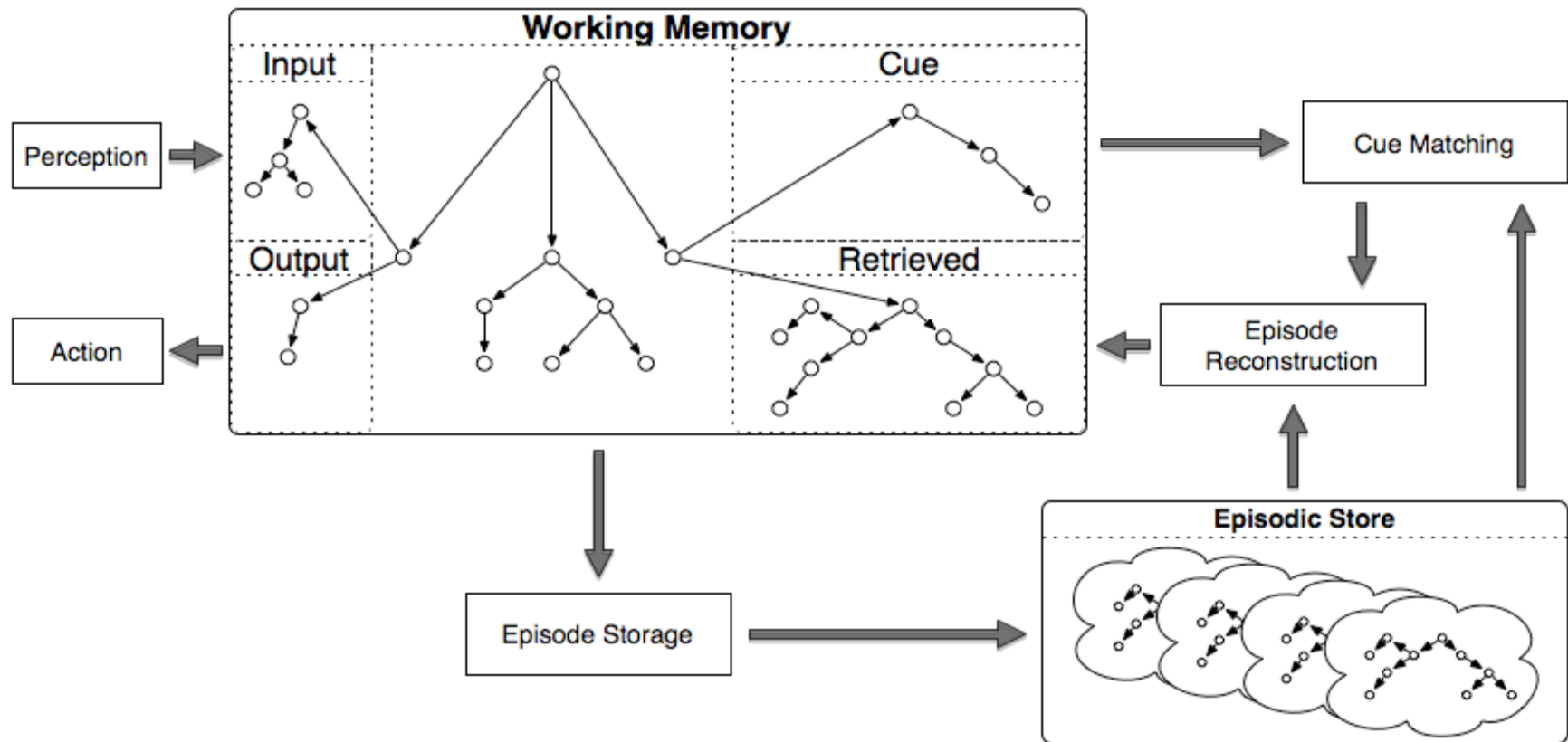
Episodic Operations



Episodic Operations

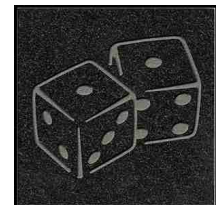
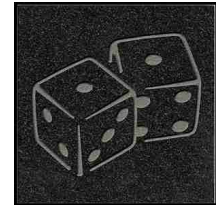


Episodic Operations

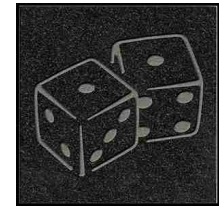


Demo Task

- Produce a random number in WM
 - EpMem automatically records this episode
- Remove the number from WM
 - Write to the trace (for later verification)
- Query episodic memory
 - When did I last see a random number?
- Reason about the retrieved episode
 - Extract and print the number



Produce a Random Number



```
sp {propose*initialize-epmem-rand
  (state <s> ^superstate nil
    -^name)
-->
  (<s> ^operator <o> +)
  (<o> ^name initialize-epmem-rand)
}

sp {apply*initialize-epmem-rand
  (state <s> ^operator <op>)
  (<op> ^name initialize-epmem-rand)
-->
  (<s> ^name epmem-rand
    ^random.num (float (cmd rand)))
}
```

Remove the Number



```
sp {epmem-rand*propose*remember
  (state <s> ^name epmem-rand
    ^random)
-->
  (<s> ^operator <op> + =)
  (<op> ^name remember)
}

sp {apply*remember*cue
  (state <s> ^operator <op>
    ^random <rand>
    ^epmem.command <cmd>)
  (<op> ^name remember)
  (<rand> ^num <num>)
-->
  (write |Removing: | <num>)
  (<s> ^random <rand> -)
  (<cmd> ^query.random <remember-random>)
}
```

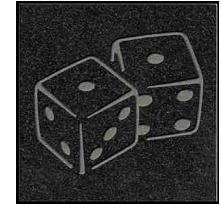
Query EpMem



```
sp {epmem-rand*propose*remember
  (state <s> ^name epmem-rand
    ^random)
-->
  (<s> ^operator <op> + =)
  (<op> ^name remember)
}

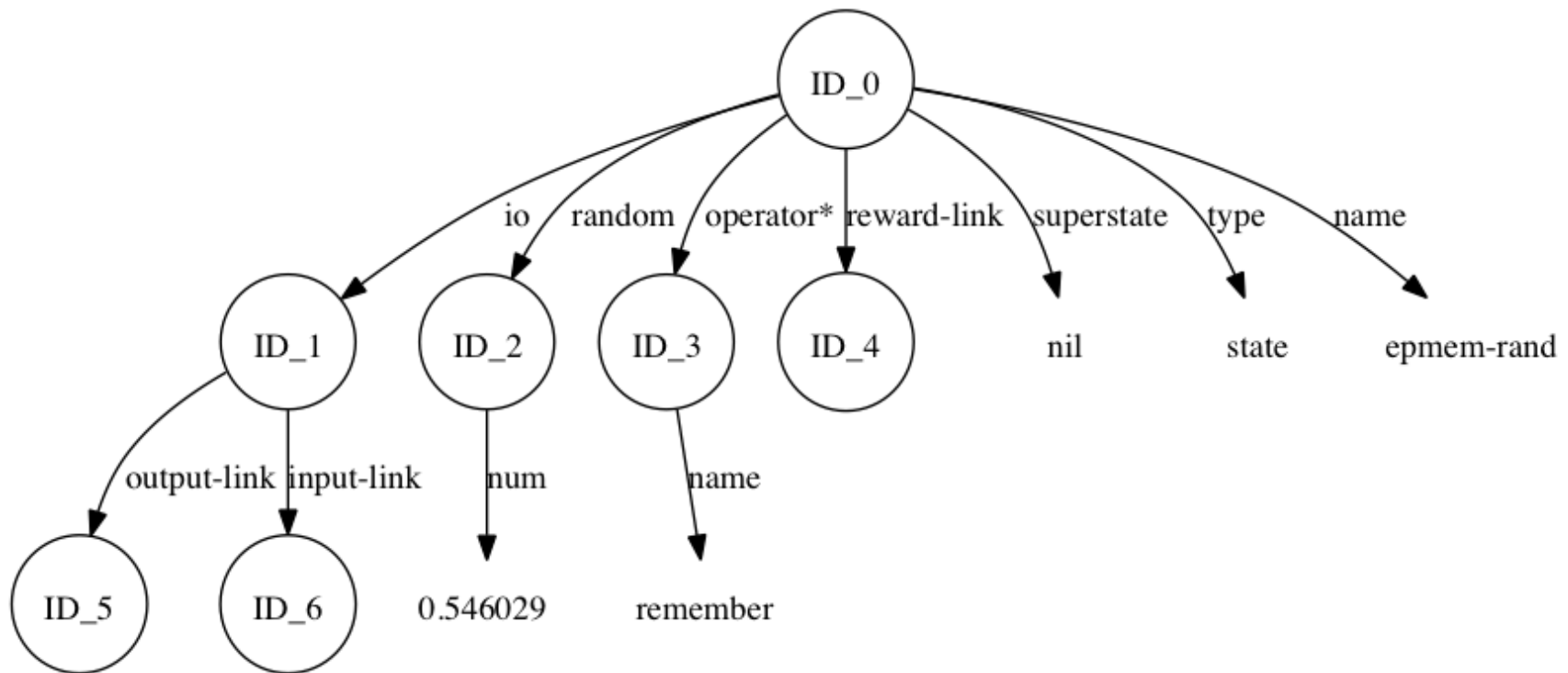
sp {apply*remember*cue
  (state <s> ^operator <op>
    ^random <rand>
    ^epmem.command <cmd>)
  (<op> ^name remember)
  (<rand> ^num <num>)
-->
  (write |Removing: | <num>)
  (<s> ^random <rand> -)
  (<cmd> ^query.random <remember-random>)
}
```

Report Result

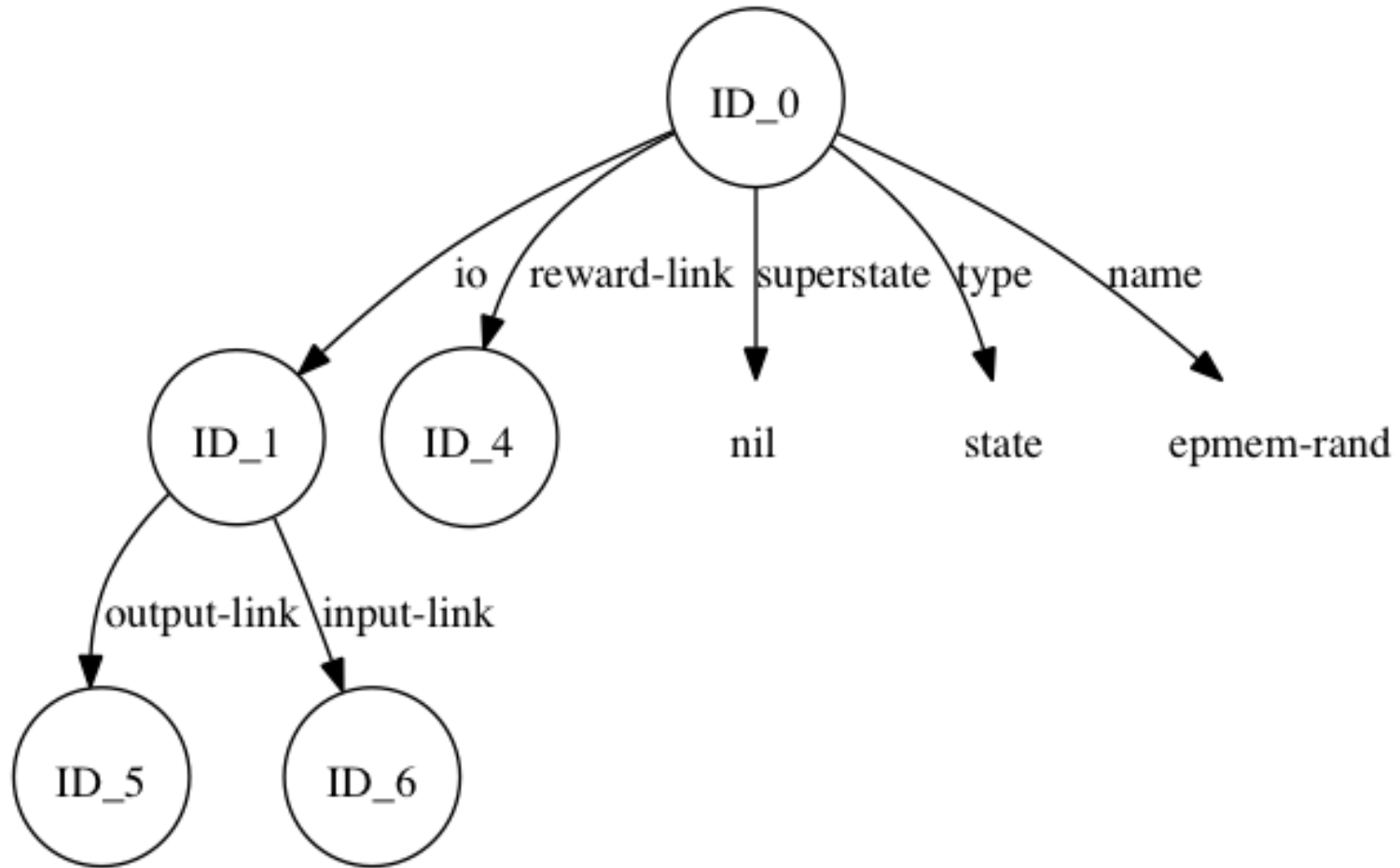


```
sp {done
  (state <s> ^epmem.result.retrieved.random.num <num>)
-->
  (write |Remebered number: | <num>)
  (halt)
}
```

Demo Episode 1



Demo Episode 2

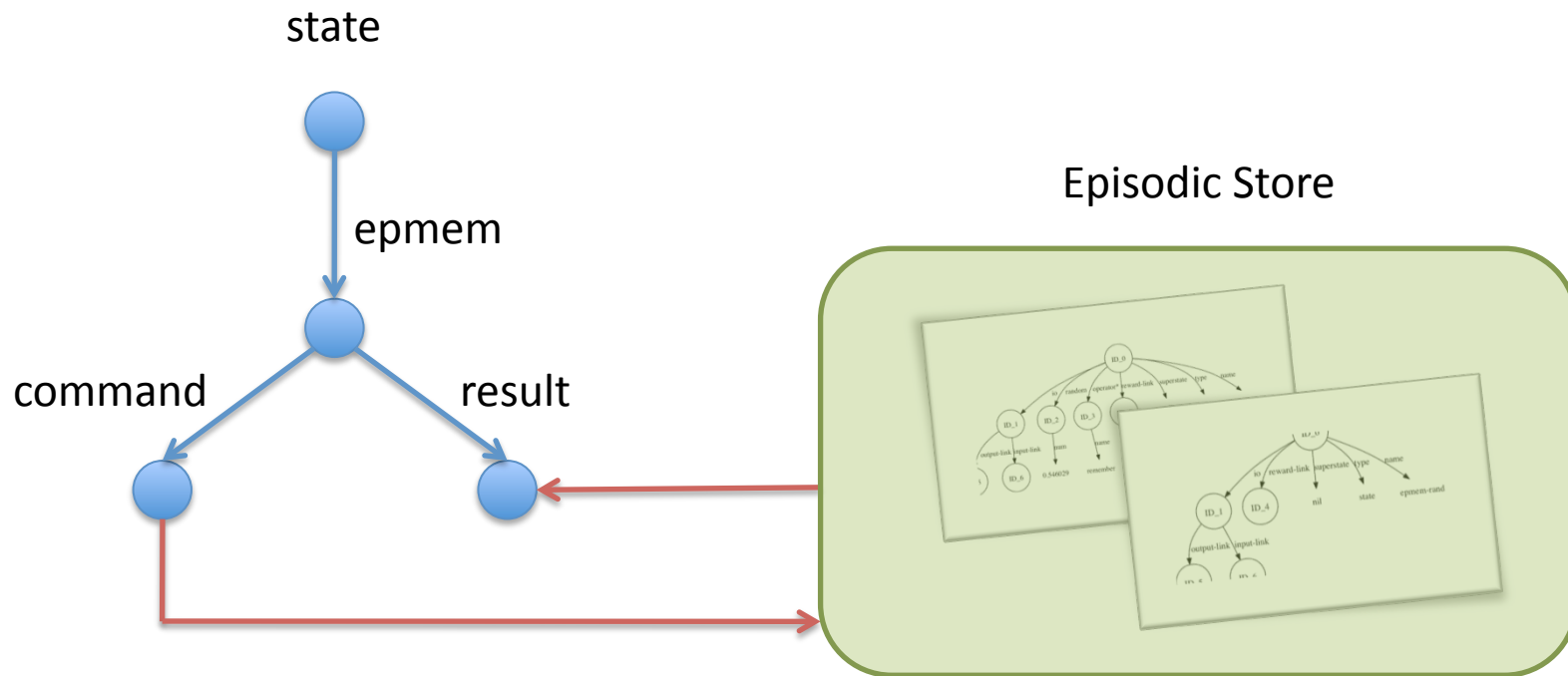


Basic Usage

- Working Memory structure
- Storage
- Retrievals

Working Memory Structure

Agents interact with an **epmem** structure on each state



Episodic Storage

Storage is automatic when EpMem is enabled

```
> epmem --set learning on
```

Events trigger storage of new episodes

```
> epmem --set trigger << dc output >>
```

dc: decision cycle

output: new identifier on output-link (default)

Storage takes place at the end of a phase

```
> epmem --set phase << output selection >>
```

output is default

EpMem captures the top state of working memory

Retrieving Knowledge

Command Types

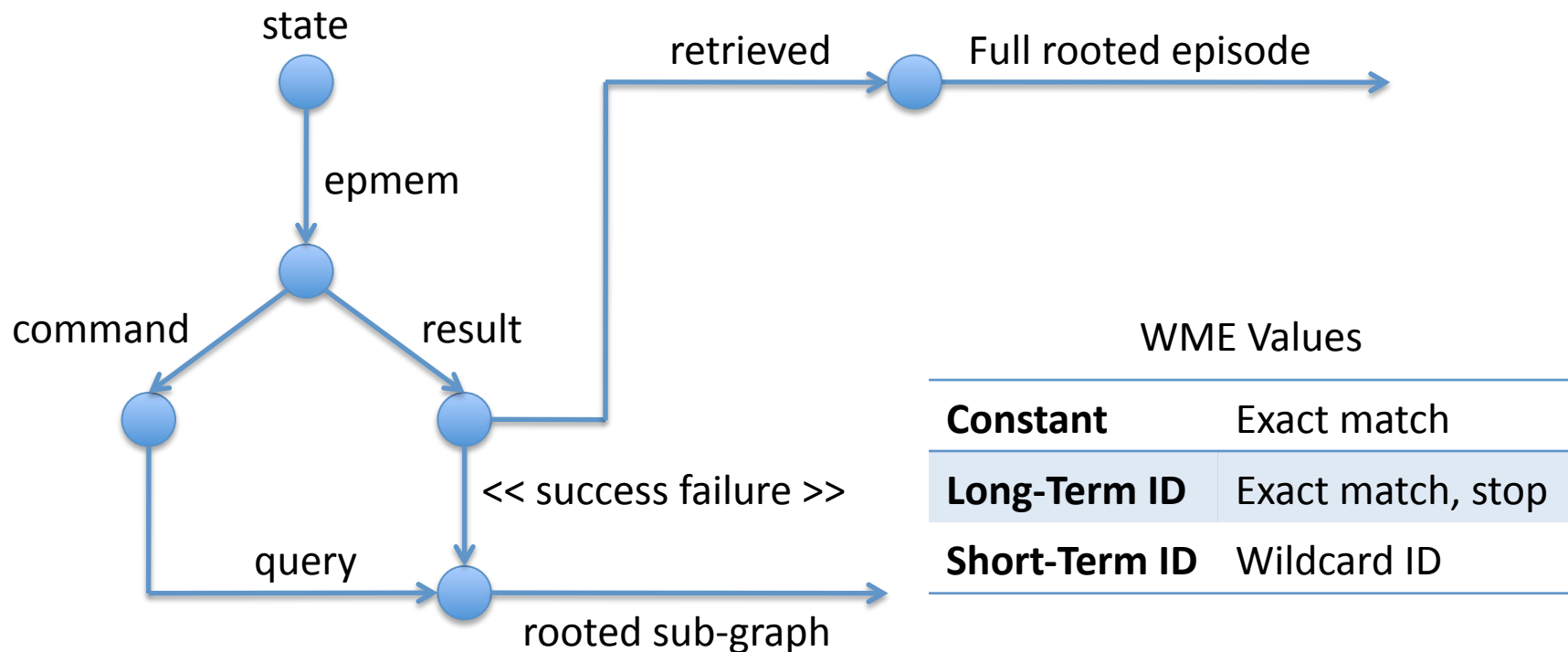
- Cue-Based (content-addressability)
- Temporal progression
- Non-Cue-Based

Notes

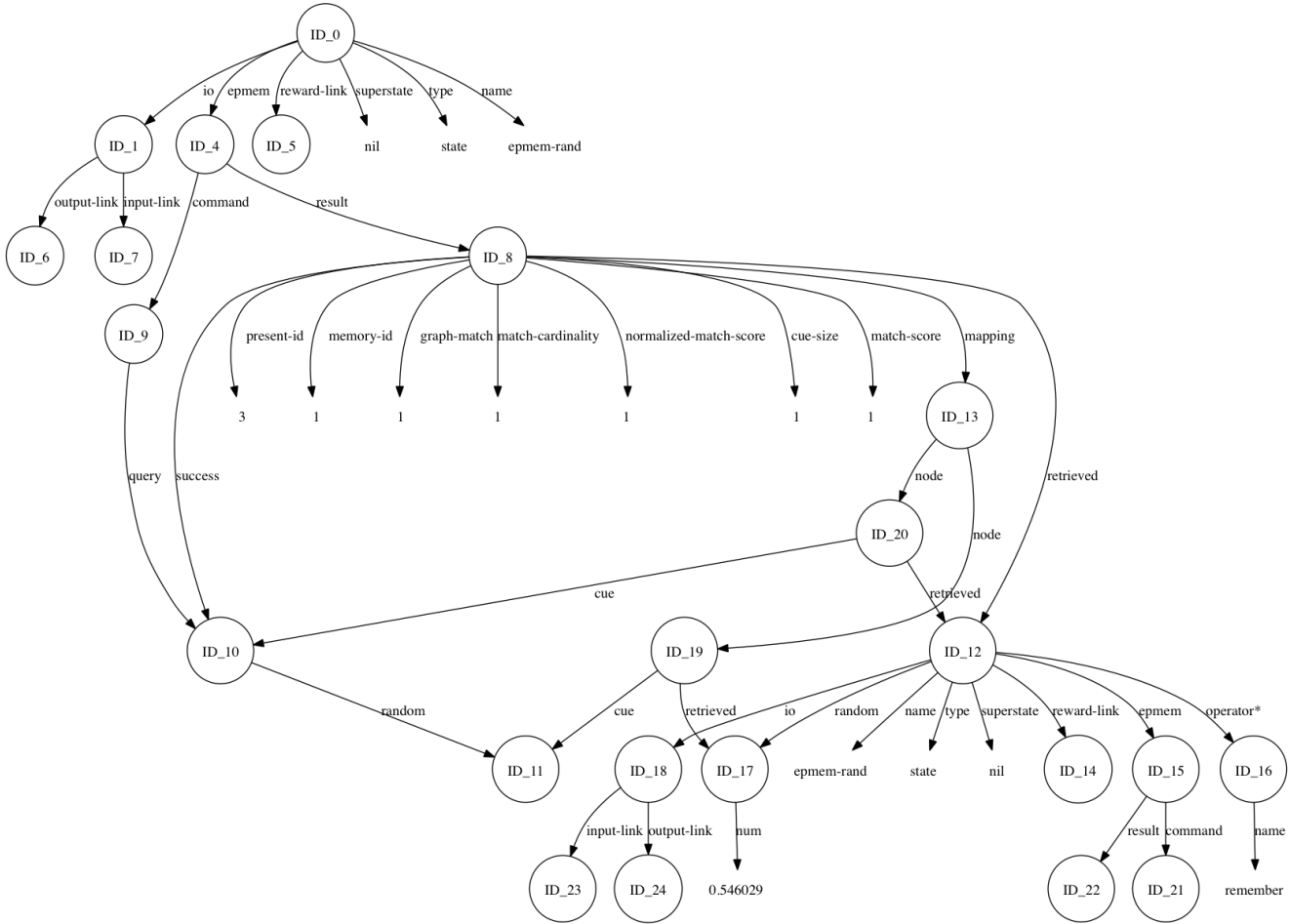
- Only one per state, per decision

Cue-Based Retrievals

Acyclic graph rooted at **query** identifier forms contextualized soft constraint(s) of the top state of the retrieved episode (ties broken by storage recency)



Example Retrieval Result



Other Retrievals

Temporal progression

```
state.epmem.command.next <n>
```

```
state.epmem.command.previous <p>
```

Non-Cue-Based

```
state.epmem.command.retrieve <episode #>
```

Useful Commands

```
> watch --epmem
```

Graphviz

```
> epmem [v|--viz] <episode #>
```

Save episodic store to disk (SQLite3)

```
> epmem --set path /path/to/file.db
```

Additional Resources

- Soar-EpMem Documentation
- Soar-EpMem Demos
- Readings

Soar-EpMem Documentation

Manual

`$$SOAR_HOME/share/soar/Documentation`

- Topics
 - Additional storage/retrieval details
 - Performance
 - Working Memory Activation
 - Usage: commands, parameters, statistics, etc.

Soar-EpMem Demos

KB (Knowledge Base)

`$SOAR_HOME/share/soar/Demos`

– Unit tests that use most of agent retrieval API

Readings

2004

- A Cognitive Model of Episodic Memory Integrated with a General Cognitive Architecture
Andrew M. Nuxoll, John E. Laird (ICCM)

2007

- Extending Cognitive Architecture with Episodic Memory
Andrew M. Nuxoll, John E. Laird (AAAI)
- Enhancing Intelligent Agents with Episodic Memory
Andrew M. Nuxoll (Dissertation)

2009

- Efficiently Implementing Episodic Memory
Nate Derbinsky, John E. Laird (ICCBR)
- A Year of Episodic Memory
John E. Laird, Nate Derbinsky (IJCAI Workshop)
- Learning to Use Episodic Memory
Nicholas A. Gorski, John E. Laird (ICCM)

2010

- Extending Soar with Dissociated Symbolic Memories
Nate Derbinsky, John E. Laird (AISB)
- Instance-Based Online Learning of Deterministic Relational Action Models
Joseph Xu, John E. Laird (AAAI)