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Table of Contents

1. Document History 3

2. Soar-SMem Motivation 4

3. Working Memory Structure 5

4. Storing Semantic Concepts 6

4.1. Agent Storage 6

4.2. Long-Term Identifiers 6

4.3. Manual Storage 6

4.4. Soar-SMem Storage 7

5. Retrieving Concepts 8

5.1. Soar-SMem Retrieval Commands 8

5.2. Non-Cue-Based Retrievals 8

5.3. Cue-Based Retrievals 8

6. Soar-SMem Parameters 11

6.1. Parameter Configuration 11

6.2. Parameter Descriptions 11

6.2.1. General 11

6.2.2. Storage 11

6.2.3. Performance 12

6.3. Full Parameter Configuration 13

6.4. Parameter Behavior 13

7. Soar-SMem Statistics 14

8. Soar-SMem Timers 15

9. Trace Information 17

10. Soar-SMem Performance 18

10.1. Performance Tweaking 18

11. Other Useful Features 19

11.1. Reinitializing Soar-SMem 19

11.2. Visualizing the Semantic Store 19

12. Soar Integration 20

12.1. Working Memory 20

12.2. Procedural Memory 20

12.3. Episodic Memory 20

13. Soar-SMem Programmer Reference 21

13.1. Useful Commands 21

13.2. Parameters 21

13.3. Agent Commands 22

13.4. Retrieval Agent Meta-Data 22

# Document History

Version 0.2

Added:

* **init** command
* **vis** command
* command-specific status
* @ preface when printing LTIs
* more performance parameters, stats, and timers
* integration section

Version 0.1

Pilot version.

# Soar-SMem Motivation

Soar-SMem is a task-independent, architectural integration of an artificial semantic memory (SMem) with Soar. The SMem mechanism facilitates deliberate recording and querying of semantic chunks as a Soar agent executes.

# Working Memory Structure

Upon creation of a new state within working memory, the architecture will automatically create a structure in working memory called **smem**. Within this structure, agents issue requests to Soar-SMem by populating the **command** identifier with working memory elements (WMEs) and process Soar-SMem generated WMEs in the **result** identifier.

# Storing Semantic Concepts

This section details Soar-SMem storage, including the agent API, long-term identifiers, declarative storage, and format details.

## Agent Storage

An agent stores a concept in semantic memory by issuing a **store** command:

state.smem.command.store <identifier>

Multiple **store** commands can be issued in parallel during a single cycle. Storage commands are processed at the end of Output phase of every decision cycle. Storage is guaranteed to succeed:

state.smem.result.success <identifier>

Soar-SMem will store all WMEs rooted at the identifier. Storing deeper levels of working memory is achieved through multiple **store** commands.

## Long-Term Identifiers

When an identifier is stored in semantic memory it is converted into a *long-term*identifier (LTI). The specific letter-number combination that labels the identifier (i.e. S5 or C7) is now permanently associated with the stored concept. Any future retrievals of the concept are guaranteed to return the associated letter-number pair. For clarity, when printed, a long-term identifier is prefaced with the **@** symbol (i.e. @S5 or @C7).

Subsequent storage of an LTI will overwrite previous contents within semantic memory. It should be noted that between issuing **store** commands it is possible to have children of a concept in working memory be inconsistent with the long-term children stored in semantic memory.

## Manual Storage

Soar-SMem provides the ability to manually store concepts via the **add** switch of the **smem** command. The format of the command is nearly identical to the working memory manipulation components of the RHS of a Soar production (i.e. no RHS-functions). For instance:

smem --add {

(<arithmetic> ^add10-facts <a01> <a02> <a03>)

(<a01> ^digit1 1 ^digit-10 11)

(<a02> ^digit1 2 ^digit-10 12)

(<a03> ^digit1 3 ^digit-10 13)

}

Unlike agent storage, declarative storage is automatically recursive. Thus, this command instance will add a new concept (represented by the temporary “arithmetic” variable) with three children. Each child will be its own concept with two constant attribute/value pairs. Declarative storage can be arbitrarily complex and use standard dot-notation.

Declarative concepts are stored immediately. Thus, storage parameters (such as **database** and **path**) should be set before issuing any **add** commands.

## Soar-SMem Storage

SMem currently uses SQLite to facilitate efficient and standardized storage and querying of episodes. The episodic store can be maintained in memory or on disk (per the **database** and **path** parameters). If the store is located on disk, users can use any standard SQLite programs/components to access/query its contents.

The **lazy-commit** parameter is a performance optimization. If set to **on** (default), disk databases will not reflect semantic memory changes until the Soar instance ends, to save disk I/O costs.

# Retrieving Concepts

This section details the agent interface to Soar-SMem retrievals, including command protocol, non-cue-based (NCB) retrievals, cue-based (CB) retrievals, and retrieval meta-data.

## Soar-SMem Retrieval Commands

An agent issues a retrieval command to the Soar-SMem system by populating appropriate WMEs on the **command** identifier of a state’s **smem** structure. At the end of each output phase, after concept storage, Soar-SMem processes each state’s SMem **command** structure. Results, meta-data, and errors are placed on the **result** identifier of that state’s **smem** structure.

Only one type of retrieval command (which may consist of multiple WMEs) can be issued in a single decision cycle (though multiple states may issue commands). Malformed commands (including attempts at multiple commands) will result in an error:

state.smem.result.bad-cmd state.smem.command

After a command has been processed, Soar-SMem will ignore it until some aspect of the **command** structure changes (via addition/removal of WMEs). When this occurs, the **result** structure is cleared and the new command (if one exists) is processed.

## Non-Cue-Based Retrievals

An NCB retrieval is a request to retrieve the direct children of a long-term identifier:

state.smem.command.retrieve <lti>

If the supplied identifier is not a long-term identifier, an error will result:

state.smem.result.failure <lti>

Otherwise, two new WMEs will be placed on the **result** structure:

state.smem.result.success <lti>

state.smem.result.retrieved <lti>

If there are WMEs rooted at the LTI in Working Memory, the **retrieved** LTI will reflect these contents. Otherwise, its direct children will be populated from semantic memory.

## Cue-Based Retrievals

CB retrieval commands are used to search for a concept in the store that exactly matches an agent-supplied cue, while potentially adhering to optional modifiers.

A cue is composed of WMEs that describe a concept’s direct children. A cue WME with a constant value (symbolic or numeric) demands an exact match of both attribute and value. A cue WME with an LTI as its value demands an exact match as well. A cue WME with a non-long-term identifier as its value requires an exact match of attribute, but with any value (constant or identifier).

A cue is issued on the **command** structure as a **query** identifier:

state.smem.command.query <cue>

For instance, consider the following query:

sp {sample\*query

(state <s> ^smem.command <sc>

^lti <lti>

^input-link.foo <bar>)

-->

(<sc> ^query <q>)

(<q> ^name <any-name>

^foo <bar>

^associate <lti>

^age 25)

}

In this example, assume that the “^lti <lti>” match will be an LTI and the value of “foo” from the input-link will be a constant. Thus, the query requests retrieval of a long-term identifier with ALL of the following:

* A child with attribute “name” and ANY value
* A child with attribute “foo” and value equal to the value of variable “<bar>” at the time this rule fires
* A child with attribute “associate” and value referring to the long-term identifier “<lti>” at the time this rule fires
* A child with attribute “age” and integer value 25

If no long-term identifier meets ALL of these qualifications, an error is returned:

state.smem.result.failure <cue>

Otherwise, two WMEs are added:

state.smem.result.success <cue>

state.smem.result.retrieved <lti>

During a cue-based retrieval it is possible that the retrieved LTI is not in Working Memory. If this is the case, Soar-SMem will create a new identifier with letter-number pair as was originally stored.

As with NCB retrievals, if there exist WMEs in Working Memory rooted at the LTI, these are not overwritten. Otherwise the direct children of the LTI in Semantic Memory are added to Working Memory.

It is possible that multiple concepts match the cue equally well. In this case, Soar-SMem will retrieve the LTI that was most recently stored/retrieved.

The CB retrieval process can be further tempered using optional modifiers:

* The **prohibit** command requires that the LTI of the retrieved episode is not equal to a supplied LTI:

state.smem.command.prohibit <bad-lti>

Multiple **prohibit** command WMEs may be issued as modifiers to a single CB retrieval. This method can be used to iterate over all matching concepts.

# Soar-SMem Parameters

The following sections discuss how to configure the Soar-SMem parameters discussed in previous sections.

## Parameter Configuration

Individual configuration parameters are retrieved and manipulated using the **get** and **set** switches of the **smem** command:

smem [-g|--get] <parameter>

smem [-s|--set] <parameter> <value>

Agents can retrieve and change parameters in the actions of rules using the **cmd** function.

## Parameter Descriptions

All Soar-SMem parameters are organized below. The *Protected* field is discussed in Section 6.4).

### General

|  |  |
| --- | --- |
| Purpose | Enable or disable Soar-SMem |
| Parameter | **learning** |
| Values | |  |  | | --- | --- | | **off** | Disable Soar-SMem | | **on** | Enable Soar-SMem | |
| Default | **on** |
| Protected | no |

### Storage

|  |  |
| --- | --- |
| Purpose | Specifies whether the semantic store will be maintained in memory or on disk |
| Parameter | **database** |
| Values | |  |  | | --- | --- | | **file** | Semantic store is maintained on disk | | **memory** | Semantic store is maintained in memory | |
| Default | **memory** |
| Protected | yes |

|  |  |
| --- | --- |
| Purpose | Specifies where on disk the semantic store will be saved |
| Parameter | **path** |
| Values | |  |  | | --- | --- | | **<empty>** | Soar-SMem will create a temporary database file on disk during execution (and delete it after use) | | **<valid path>** | Soar-SMem will use the specified path for its database file on disk - if the file doesn’t exist, it will be created | |
| Default | **<empty>** |
| Protected | yes |

|  |  |
| --- | --- |
| Purpose | Specifies how often the semantic store is saved to disk |
| Parameter | **lazy-commit** |
| Values | |  |  | | --- | --- | | **off** | Updates to the store are saved as they occur | | **on** | Updates remain in memory until the Soar instance ends | |
| Default | **on** |
| Protected | yes |

### Performance

|  |  |
| --- | --- |
| Purpose | Specifies the maximum amount of memory used for SQLite cache |
| Parameter | **cache** |
| Values | |  |  | | --- | --- | | **large** | 100MB | | **medium** | 20MB | | **small** | 5MB | |
| Default | **large** |
| Protected | yes |

|  |  |
| --- | --- |
| Purpose | Specifies architectural focus in data safety vs. epmem performance |
| Parameter | **optimization** |
| Values | |  |  | | --- | --- | | **performance** | Data store on disk is left vulnerable to corruption the case of application/OS/hardware malfunction | | **safety** | Data store on disk is guaranteed to be consistent | |
| Default | **performance** |
| Protected | yes |

|  |  |
| --- | --- |
| Purpose | Declares the level to which Soar-SMem timers are enabled (akin to watch levels) |
| Parameter | **timers** |
| Values | |  |  | | --- | --- | | **off** | Timers are disabled | | **one** | Only total Soar-SMem time is recorded | | **two** | High-level timers are enabled (smem\_\*) | | **three** | Detailed timers are enabled (three\_\*) | |
| Default | **off** |
| Protected | no |

## Full Parameter Configuration

Entering simply the **smem** command (with no switches) will return full parameter configuration information. For example, assuming default configuration, the result of executing **smem** is as follows:

>smem

SMem learning: on

Storage

-------

database: memory

path:

lazy-commit: on

Performance

-----------

cache: large

optimization: performance

timers: off

## Parameter Behavior

Upon attempting to set a Soar-SMem parameter, the new value is validated. If the value is found to be invalid, the system will use the previous value.

The set of parameters listed above that have a “yes” in the *Protected* field cannot be changed once the Soar-SMem system has been “initialized.” The Soar-SMem system initializes during execution of the first storage/retrieval or issuing the **init** switch of the **smem** command.

# Soar-SMem Statistics

Feedback from the Soar-SMem system is retrieved using the **stats** switch of the **smem** command:

smem [-S|--stats] <statistic>

If a **statistic** argument is provided, the command returns the value of a specific statistic. The valid statistic arguments are listed below.

|  |  |
| --- | --- |
| Statistic | **mem\_usage** |
| Description | Current SQLite memory usage in bytes |
| Label | Memory Usage |

|  |  |
| --- | --- |
| Statistic | **mem\_high** |
| Description | Greatest SQLite memory usage in bytes since last database initialization |
| Label | Memory Highwater |

|  |  |
| --- | --- |
| Statistic | **retrieves** |
| Description | Number of times the **retrieve** command has been issued |
| Label | Retrieves |

|  |  |
| --- | --- |
| Statistic | **queries** |
| Description | Number of times the **query** command has been issued |
| Label | Queries |

|  |  |
| --- | --- |
| Statistic | **stores** |
| Description | Number of times the **store** command has been issued |
| Label | Stores |

|  |  |
| --- | --- |
| Statistic | **nodes** |
| Description | Number of nodes in the semantic store |
| Label | Nodes |

|  |  |
| --- | --- |
| Statistic | **edges** |
| Description | Number of edges in the semantic store |
| Label | Edges |

Agents can retrieve specific statistics in rule actions using the **cmd** function.

Note that SQLite memory stats are shared amongst all SQLite databases, meaning these numbers include memory used by episodic memory (Soar-EpMem).

Entering the **smem --stats** command with no statistic, or an invalid statistic, will return all statistics. A sample execution may look as follows:

>smem --stats

Memory Usage: 0

Memory Highwater: 0

Retrieves: 0

Queries: 0

Stores: 0

Nodes: 0

Edges: 0

# Soar-SMem Timers

Time spent on Soar-SMem operations is retrieved using the **timers** switch of the **smem** command:

smem [-t|--timers] <timer>

If a **timer** argument is provided, the command returns the value of a specific timer. The valid statistic arguments are listed below (with their associated level, respecting the **timers** parameter).

|  |  |
| --- | --- |
| Timer | **\_total** |
| Description | Total time spent by Soar-SMem |
| Level | one |

|  |  |
| --- | --- |
| Timer | **smem\_api** |
| Description | Time spent validating agent commands |
| Level | two |

|  |  |
| --- | --- |
| Timer | **smem\_hash** |
| Description | Time spent hashing symbols |
| Level | two |

|  |  |
| --- | --- |
| Timer | **smem\_init** |
| Description | Time spent initializing the semantic store |
| Level | two |

|  |  |
| --- | --- |
| Timer | **smem\_ncb\_retrieval** |
| Description | Time spent adding concepts (and children) to working memory |
| Level | two |

|  |  |
| --- | --- |
| Timer | **smem\_query** |
| Description | Time spent searching for cues |
| Level | two |

|  |  |
| --- | --- |
| Timer | **smem\_storage** |
| Description | Time spent storing concepts |
| Level | two |

|  |  |
| --- | --- |
| Timer | **three\_activation** |
| Description | Time spent maintaining storage/retrieval recency information |
| Level | three |

Agents can retrieve specific timer values in rule actions using the **cmd** function. Timer values are re-initialized at the same time points as Soar timers.

Entering the **smem --timers** command with no timer will return all timers. A sample execution may look as follows:

>smem --timers

\_total: 0

smem\_api: 0

smem\_hash: 0

smem\_init: 0

smem\_ncb\_retrieval: 0

smem\_query: 0

smem\_storage: 0

three\_activation: 0

# Trace Information

To view Soar-SMem debugging information, use the following watch switch:

watch [-s|--smem]

This function is not enabled by default or through any watch level. At present, this watch level does not serve a function.

# Soar-SMem Performance

Initial empirical results with the *arithmetic* demo agent show that SMem queries carry up to a 40% overhead as compared to comparable rete matching. However, Soar-SMem implements some basic query optimization: statistics are maintained about all concept storage. When a query is issued, Soar-SMem re-orders the cue such as to minimize expected query time. Because only perfect matches are acceptable, semantic memory retrievals will not suffer the same combinatorial search space as the rete. Preliminary empirical study shows that Soar-SMem maintains sub-millisecond retrieval time in very large stores (millions of nodes/edges).

Once the number of concepts overcomes initial overhead (~1000 nodes/edges), initial empirical study shows that semantic storage requires about 70-90 bytes per node/edge.

## Performance Tweaking

When using a database stored to disk, several parameters become crucial to performance. The first is **lazy-commit** which controls when the database is actually committed to disk. The default setting (**on**) will keep all writes in memory and only commit to disk upon re-initialization (quitting the agent or issuing the **init** command). The **off** setting will write each change to disk and thus incurs massive I/O delay.

The next parameter is **cache**. Greater settings afford SQLite greater amounts of memory in which to store B-Tree nodes, thus reducing disk I/O for searches. This memory is not pre-allocated, so short/small runs will not automatically make use of this space. Some situations may benefit from smaller cache allocation, to reduce memory allocation calls.

The next parameter is **optimization**. The **safety** parameter setting will use SQLite default settings. If data integrity is of importance, this setting is ideal. The **performance** setting will make use of lesser data consistency guarantees for significantly greater performance. First, writes are no longer synchronous with the OS (*synchronous* pragma), thus Soar-EpMem won’t wait for writes to complete before continuing execution. Second, transaction journaling is turned off (*journal\_mode* pragma), thus groups of modifications to the episodic store are not atomic (and thus interruptions due to application/os/hardware failure could lead to inconsistent database state). Finally, upon initialization, Soar-EpMem maintains an continuous exclusive lock to the database (*locking\_mode* pragma), thus other applications/agents cannot make simultaneous read/write calls to the database (thereby reducing the need for potentially expensive system calls to secure/release file locks).

Finally, timers are currently very expensive in Soar. The Soar-EpMem timers use Soar timer code. Thus, these should be enabled with caution and understanding of their limitations. First, they *will* affect performance, depending on the level (set via the **timers** parameter). A level of **three**, for instance, times every modification to node recency statistics. Furthermore, because these iterations are relatively cheap (typically a single step in the linked-list of a b-tree), timer values are typically unreliable (depending upon the system, resolution is 1 microsecond more).

# Other Useful Features

## Reinitializing Soar-SMem

For Soar-SMem to be reinitialized, all reference to long-term identifiers in all of Soar’s memories must be removed. Consequently, the **init** command was introduced to reinitialize all memories: episodic, semantic, procedural, and working:

smem [-i|--init]

Internally, this command closes the episodic store (**epmem --close**), closes the semantic store, and excises all productions (**excise --all**), which in turn reinitializes Soar (**init-soar**).

## Visualizing the Semantic Store

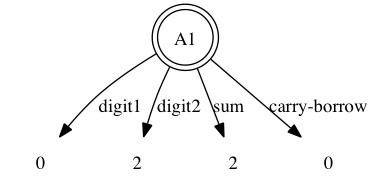
For debugging purposes, Soar-SMem supports a visualization command:

smem [-v|--viz] <lti> <depth>

This command will output the contents of the semantic store in Graphvis (http://www.graphviz.org) format. By optionally specifying an **lti** (does not have to exist in working memory), visualization is rooted at the specified long-term identifier. Optionally specifying a **depth** will depth-limit the visualization (akin to the **--depth** switch of the **print** command).

The output of the command will be text and is likely of little use within Soar. Thus, combining visualization with the Soar **command-to-file** command is ideal. Below is the rendered form of the following command issued during the *arithmetic* demo:

smem -v a1



# Soar Integration

Integrating long-term identifiers in Soar presents a number of theoretical and implementation challenges. This section discusses the state of integration with each of Soar’s memories/learning mechanisms.

### Working Memory

Long-term identifiers exist as peers with short-term identifiers in Working Memory. For clarity, long-term identifiers, when printed, are prefaced with an **@** symbol.

### Procedural Memory

Soar’s production parser (i.e. the **sp** command) has been modified to allow specification of long-term identifiers (prefaced with an **@** symbol) in any context where a variable is valid. Once added to the rete, the long-term identifier is treated as a constant for matching purposes. If specified as the value of a WME in an action, an LTI will be added to working memory if it does not already exist. There is also preliminary support for chunking over long-term identifiers.

It is currently possible to create production actions wherein the id of a new WME is an LTI that exists neither in the production conditions, nor as the attribute or value of a prior action. Such rules will wreak havoc within Soar and are not supported. They will be detected and disallowed in future versions of Soar-SMem.

### Episodic Memory

Currently, episodic memory does not differentiate between long- and short-term identifiers.

# Soar-SMem Programmer Reference

The following tables list basic information about each of the Soar-SMem related commands. It is not intended to substitute for this document, but a quick reference for commonly used commands and options.

### Useful Commands

|  |  |  |
| --- | --- | --- |
| Command |  | Description |
| smem |  | Summary table of parameter settings |
| smem [-g|--get] <parameter> |  | Retrieve a Soar-SMem parameter value |
| smem [-s|--set] <parameter> <value> |  | Set a Soar-SMem parameter value |
| smem [-S|--stats] <statistic> |  | Access Soar-SMem statistics |
| smem [-t|--timers] <timer> |  | Access Soar-SMem timers |
| smem [-a|--add] |  | Declaratively store concepts |
| smem [-v|--viz] <lti> <depth> |  | Output semantic store in Graphvis format |
| smem [-i|--init] |  | Reinitialize all Soar memories |
|  |  |  |
| watch [-s|--smem] |  | Soar-SMem debugging trace |

### Parameters

Parameters noted with a \* are *protected*.

|  |  |  |  |  |
| --- | --- | --- | --- | --- |
| **General** | | | | |
| Parameter Name |  | Acceptable Values |  | Default |
| learning |  | on  off |  | on |
|  |  |  |  |  |
| **Storage** | | | | |
| Parameter Name |  | Acceptable Values |  | Default |
| database\* |  | file  memory |  | memory |
|  |  |  |  |  |
| path\* |  | <empty>  <system path> |  | <empty> |
|  |  |  |  |  |
| lazy-commit\* |  | off  on |  | on |
|  |  |  |  |  |
| **Performance** | | | | |
| Parameter Name |  | Acceptable Values |  | Default |
| cache\* |  | large  medium  small |  | large |
|  |  |  |  |  |
| optimization\* |  | performance  safety |  | performance |
|  |  |  |  |  |
| timers |  | off  one  two  three |  | off |
|  |  |  |  |  |

### Agent Commands

*Storage*

state.smem.command.store <identifier>

*NCB Retrieval*

state.smem.command.retrieve <lti>

*CB Retrieval*

state.smem.command.query <cue>

CB Retrieval Optional Modifiers

state.smem.command.prohibit <bad-lti>

### Retrieval Agent Meta-Data

state.smem.result

^retrieved <lti>

^<< success failure bad-cmd >> <identifier>