

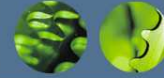


## The Need for Architecture Simulation: Lessons from Computer Architecture

Bob Wray

Inspired and informed by collaborations with:

- Jacob Crossman
- Randolph Jones
- Christian Lebiere



Where are we...?

- Cognitive Architecture has not made the revolutionary impact one might expect from the anticipatory rhetoric of the late 1980's
- Continuing concern that there is little/poorly-founded scientific basis for cognitive architecture research as practiced

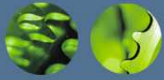
Larger Agenda: Return to the computer science notion of computer-systems architecture as a basis for cognitive architecture (e.g., Bell & Newell)

Today's talk:

- What can our community learn from the ways CS architectures are researched, developed, and deployed?

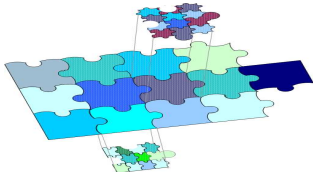
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## Computer Systems Architecture

- Traditional computer systems: successive levels of abstraction
- Each level describes an *architecture*, together with one or more languages running programs at that level
  - Architecture defines the primitive representations and processes
  - The language defines the instruction set for instantiating the representations and processes



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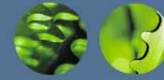
### Outside ("user") level

- Users design, compose, and implement solutions (via arch-defined language)
- Abstracts lower-level details

### Inside ("implementation") level:

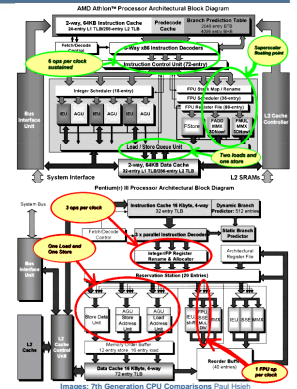
- "User" level is implemented via composition of lower-level components
- *Implementation* of user-level constructs can change without changing the *definition* of those constructs

Every technology follows this pattern...



## Computer Architecture

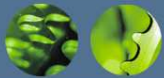
- Common functional components
- Similar organization and data flows
- Differences in implementation (design and fabrication)
- Look (mostly) the same at the user level



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Images: 7th Generation CPU Comparisons Paul Hsieh



## How do computer-system architectures get created today?

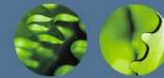
### General pattern:

- Discrete levels of abstraction
  - Transistor/gate level
  - Microprogramming level
  - Assembly language level
  - "High-level" languages
- Tools and R&D teams focused (almost) solely on one level
- Defined fabrication pipeline (path for putting levels together)
- Application developers provide requirements; use the end product & provide feedback
- Simulation is primary methodology for research and development
  - System-level simulation: VHDL, Verilog, SystemC
  - Power, heat, layout simulations
  - Logic-circuit simulations (SPICE)
- Benchmarks and data analysis of patterns of prior use inform simulations for future iterations
  - Pipeline & cache modeling

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## How do cognitive architectures get created today?

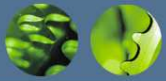
### General pattern:

- 2-3 (indistinct) levels
  - User level ("Soar", "ACT-R")
  - *Algorithm Level* (JTMS, RL)
  - Implementation level (C/Lisp/Java)
- Tools and R&D teams effort spread across all levels
- "Release," not fabrication, model
- Application developers mostly get what they get; many architecture developers are also application developers
- Simulation is almost non-existent for the purposes of architecture-level simulation
- Benchmarks inform testing and verification of releases

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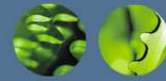


## Simulation for Cognitive Architectures

- **Recommendations:**
  - Recognize consensus and common design patterns
  - Formalize & encapsulate recurring functional elements
- **Foundation for cognitive-architecture simulation**
  - Enable rapid, empirical design space explorations
  - Facilitate composition of novel architectures
  - Make applying lessons and design principles of computer architecture more feasible
    - Don't optimize early / Make the common case fast
  - Fabricate, not release

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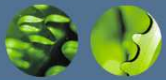


## Consensus and Commonality

- There is significant commonality across a range of cognitive (and agent) architectures
  - Mechanisms for associative memory & retrieval
  - Unification over relational representations
  - Integrating parallel associations and serial decisions
  - Reason maintenance, etc.
  - Examples:
    - Soar, ACT-R, Epic, APEX, GLEAN, CAPS, SESAME, ...
    - JACK, JAM, RETSINA, SPARK, ...
- **Convergent evolution?**
  - Emergence of similar solutions in different design spaces

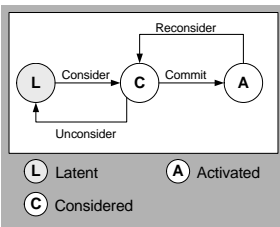
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## Formalizing Common Themes

- Generalized model of memory for cognitive architectures (CCRU)

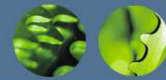


(Crossman, Wray, Jones, Lebiere, 2004)

- **Unique property:**
  - Three-state vs. two-state memories
  - Quite common in cog archs
- For each data structure / representational element supported at the user level of an architecture:
  - What process allows that element to be considered (part of a decision set)
  - What process allows that element to be committed (selected, activated)
  - What process leads to the reconsideration of commitment?
  - What process leads to complete removal/deactivation?

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## Representational Level for Simulation

- CCRU Model could potentially be extended to a full framework for architecture simulation
  - Components for all representational primitives
  - Define stubs for each CCRU process
  - Simple, configurable control loop (e.g., Wooldridge, 2000)
- Result: "Primitives" for composing and instantiating existing & novel architectures

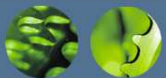
### Examples

- Soar "beliefs" (i-support)
  - Slots: Id, attr, value, timetag
  - Con/Com: Matching
  - Reconsider: JTMS
  - Uncommit: JTMS
- What are the consequences of different approaches to belief reconsideration?
  - ACT-R: Activation threshold
  - Soar: JTMS
  - 4D/RCS: FIFO
  - SPARK: Belief revision

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## Summary & Conclusions

**Emerging architectural consensus suggests that this field is learning something powerful & important**

### Nuggets

- Cognitive architectures are CS architectures
- CS methods & tools offer insights for:
  - Speeding cognitive architecture R&D
  - Exploiting architectural advances for applications
  - Organizing community around common concepts and standards
- Common themes & solutions recur across cognitive arch. research

### Coal

- Are cognitive architectures *in practice* more like s/w architectures than computer architectures?
- Investment in simulation tools will require a lot of commitment
- What's the compelling technical (or sociological?) demonstration that could trigger sustained investment?

*A good topic re future workshop formats? @*

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