

Efficient Control Synthesis and Learning in Distributed Cyber-Physical Systems

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Contributions

University of Delaware

Contributors



Bert Tanner



Jeff Heinz

- Discrete abstractions
- Grammatical inference

Fu, Tanner, Heinz, & Chandlee, IEEE TAC, 2014

Boston University

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Calin Belta

- Abstractions
- Synthesis via model checking

Chen, Tumova, & Belta, IEEE ICRA, 2012

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Building Bridges

Linguistics

- alphabets & strings
- grammars
- inference

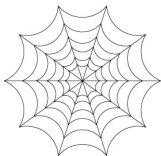
Hybrid systems

- dynamics
- automata & languages
- logics

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formal
languages

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Common threads

Latin Liquid Dissimilation

- a. nav-**al**is 'naval'
- b. episcop-**al**is 'episcopal'
- c. sol-**ar**is 'solar'
- d. lun-**ar**is 'lunar'
- e. flor-**al**is 'floral'
- f. litor-**al**is 'of the shore'

✓ ... l... r... l...

✗ ... l... r... r...



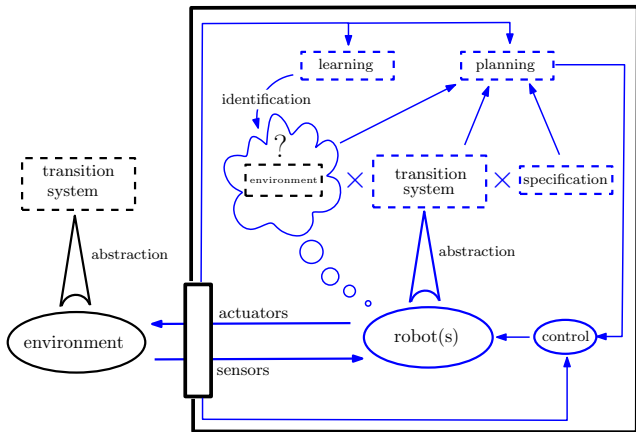
Robot maneuvers

- a base from point A to point B
- b pick an object
- c place an object

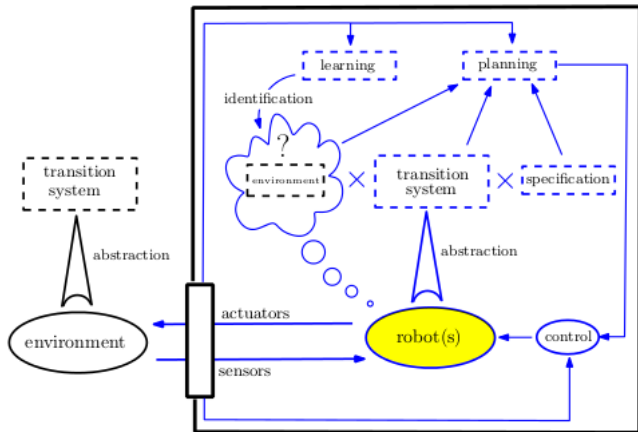
✓ a b a c a b a

✗ a b a b a a c a

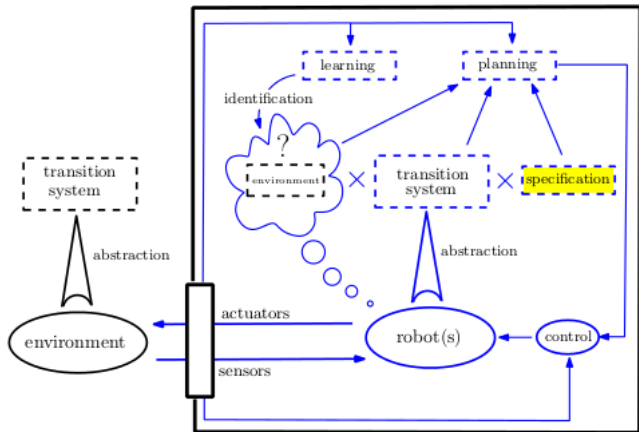
The Big Picture



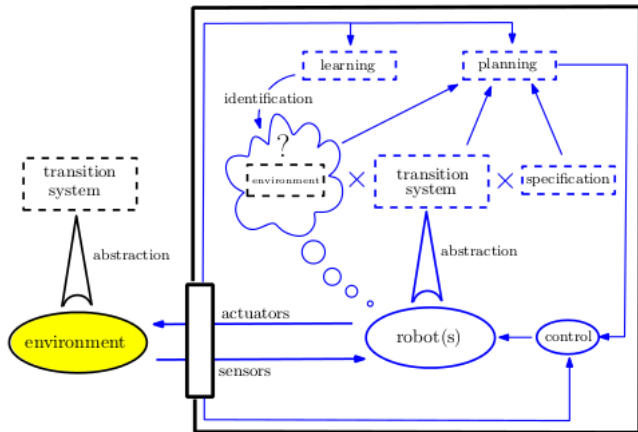
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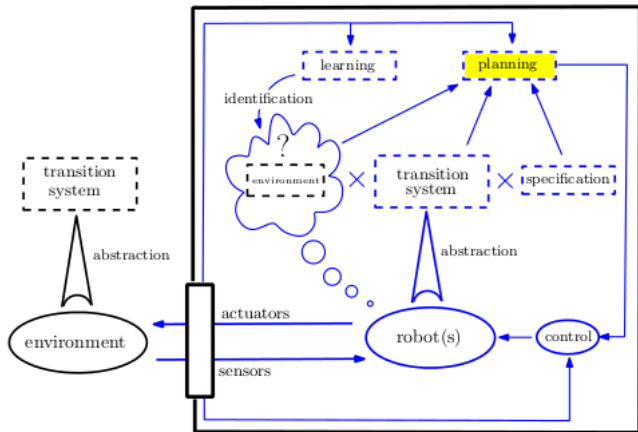
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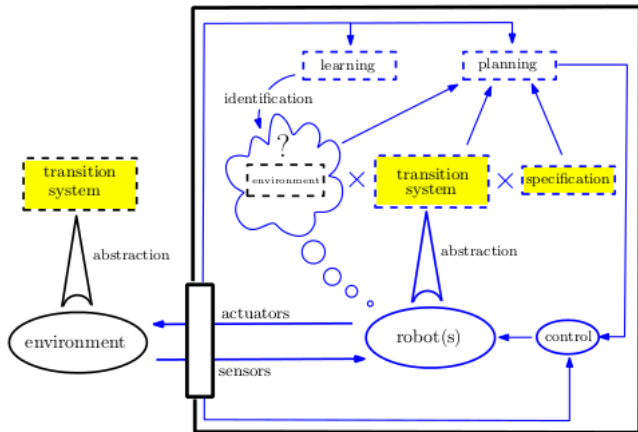
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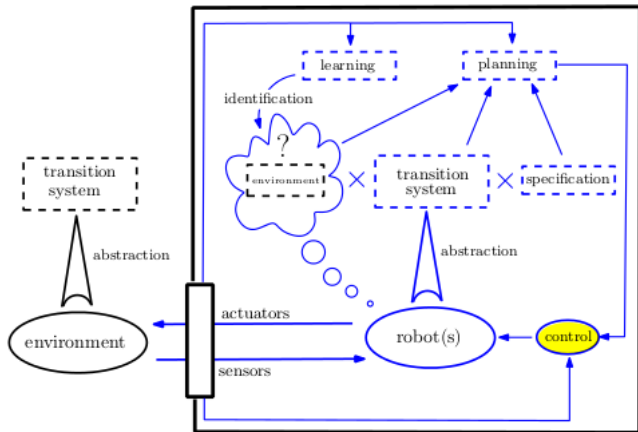
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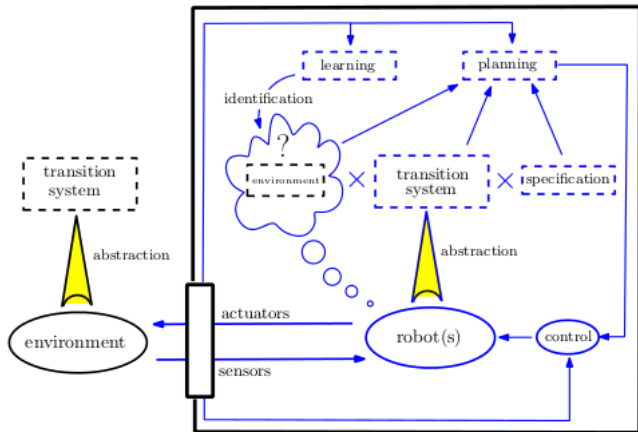
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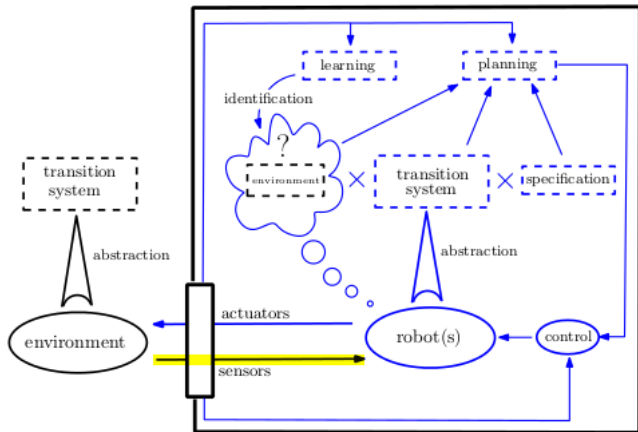
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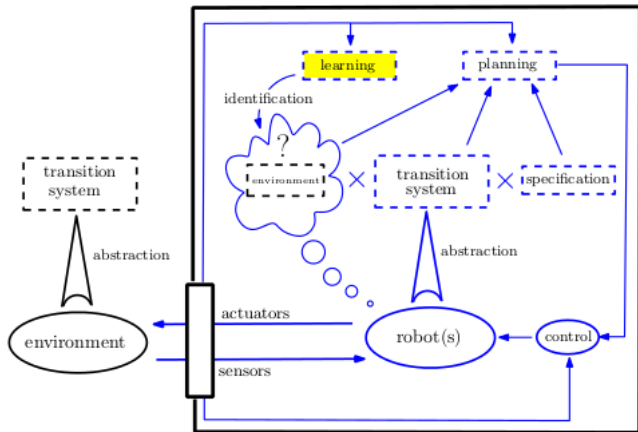
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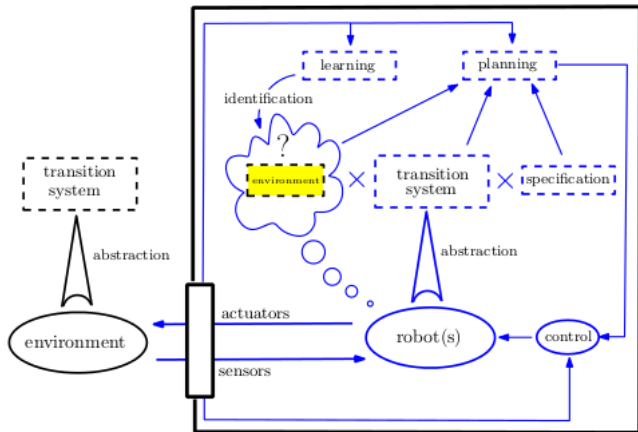
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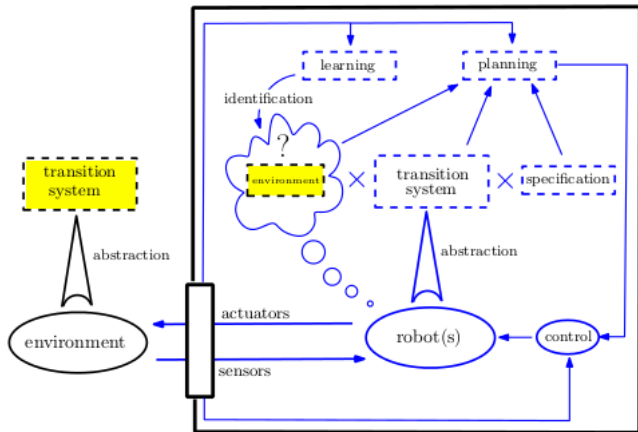
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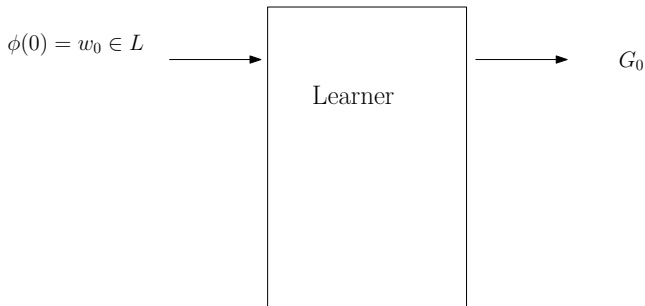
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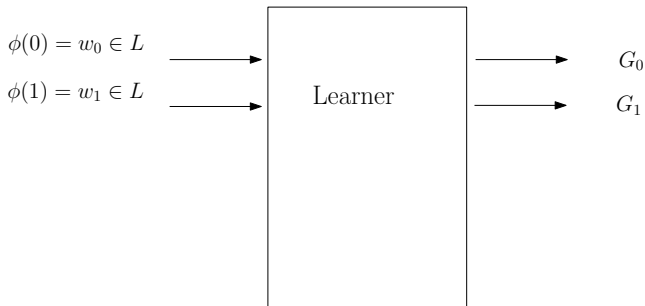
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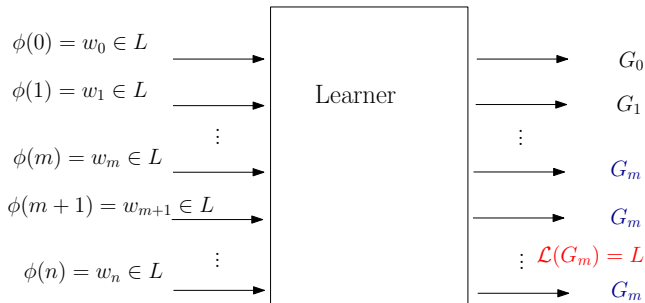
Inference on languages



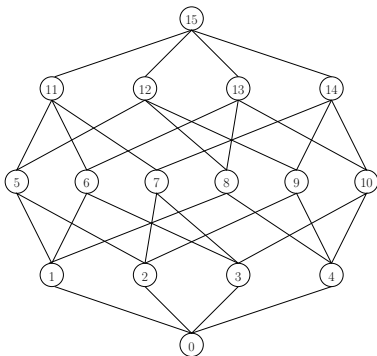
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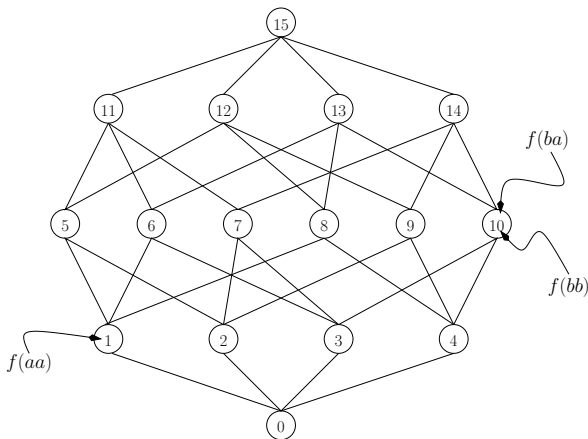


What's in the box



Definition 3 $\sqcup(S) \stackrel{def}{=} \text{minimum } x \in V \text{ such that } (\forall y \in S)[y \sqsubseteq x]$

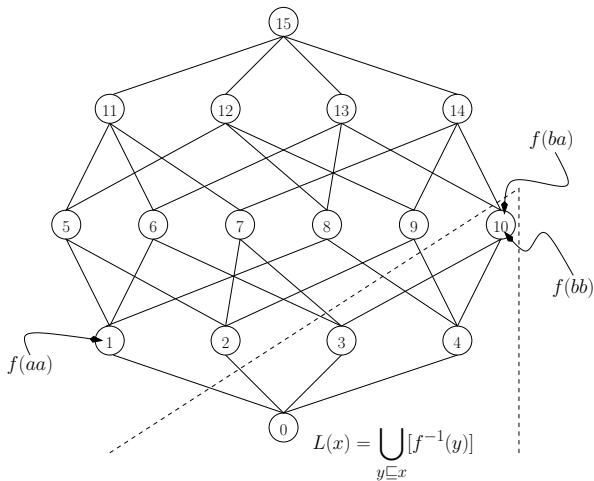
What's in the box



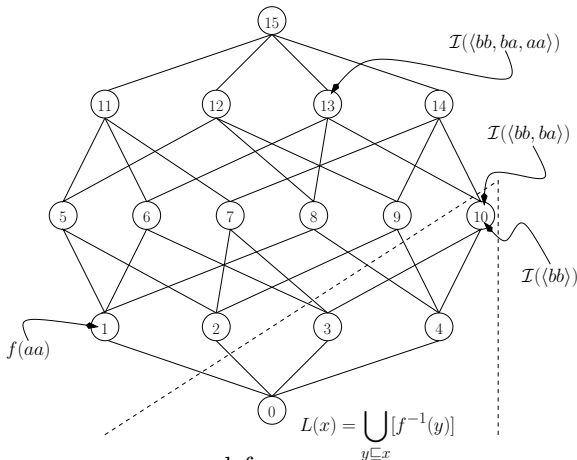
$$f : \Sigma^* \rightarrow V$$

$$(\forall x \in V)[\exists D \subseteq \Sigma^*, \text{finite}, x = \bigsqcup \{f(y) \mid y \in D\}]$$

What's in the box



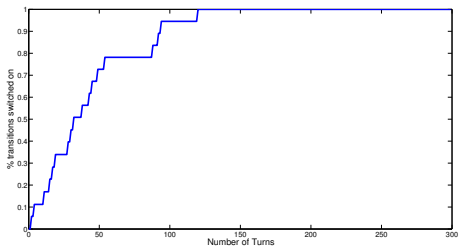
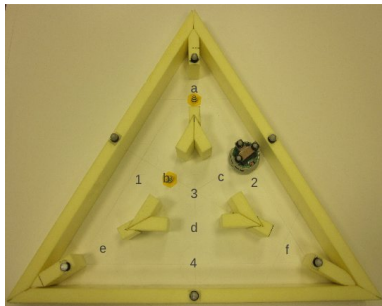
What's in the box



$$\mathcal{I}(t[0]) \stackrel{\text{def}}{=} f(t(0)),$$

$$\mathcal{I}(t[i+1]) \stackrel{\text{def}}{=} \mathcal{I}(t[i]) \sqcup f(t(i+1))$$

What game am I playing?



Theorem

Let \mathcal{L} be identifiable in the limit from positive presentation by a normal-form learner GIM. If, for all $A_2 \in \text{SA}(\text{GIM})$, there exists $A_2 \in \text{range}(\text{GIM})$ such that $L(\mathcal{A}_2) = L_2((A_1 \circ A_2) \times \mathcal{A}_s)$, then $\text{GAMES}(A_1, \mathcal{A}_s, \text{SA}(\text{GIM}))$ is identifiable in the limit from positive presentations.

What is different and useful

- A different learning paradigm:
 - Reinforcement learning: learning to control
vs
 - Grammatical inference: learning the context
- Modular: does not constrain synthesis nor inference
- Probabilistic modeling not the only option
- Efficient: structure allows factoring

Outcomes

Research

- Publications
 - 8 Journal
 - 13 Conference
- Software

Education & Outreach

- Graduates: 2 MSc, 2 PhD
- RISE mentorship (BU)
- BSA merit badges (UD)
- Interdisciplinary training

Broader overarching goals

- bridges between different disciplines
- cross-cutting problems
- “multi-lingual” new generation of scholars

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