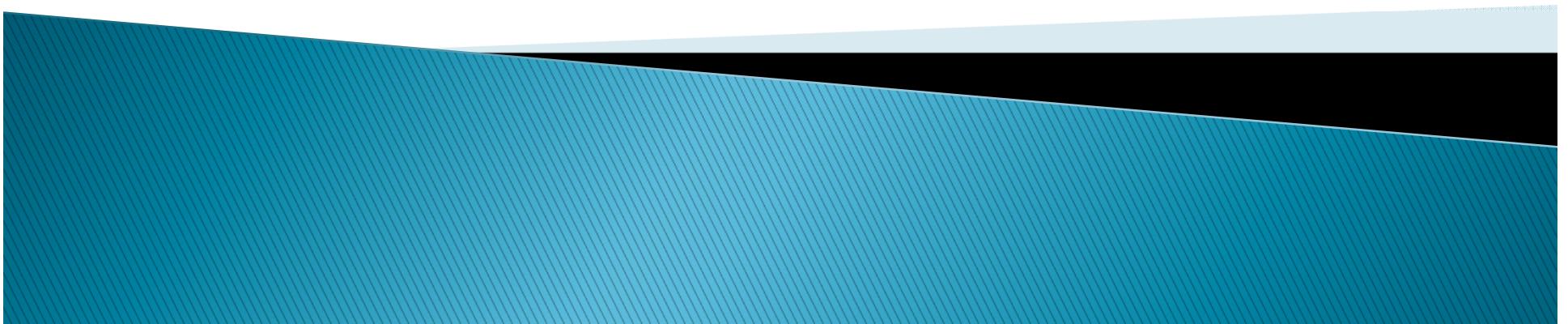


# An Industrial Knowledge Representation for Kit Building Applications

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# Kit Building

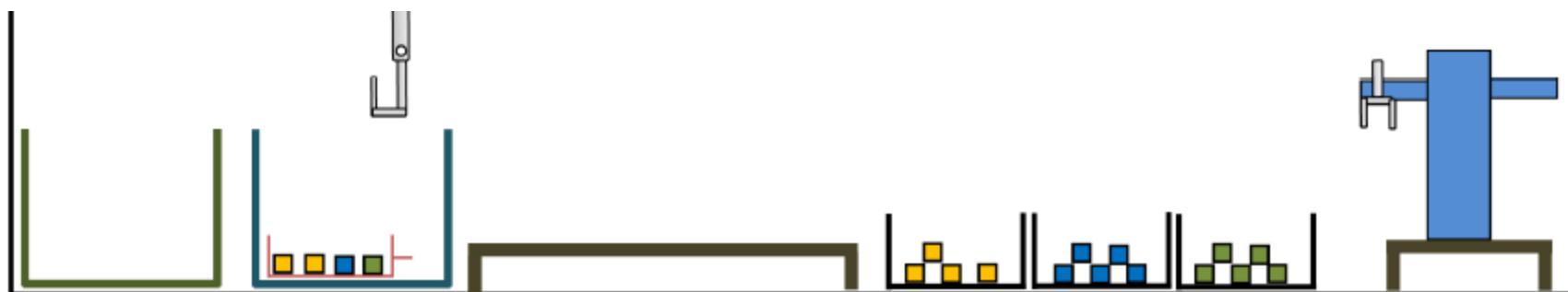
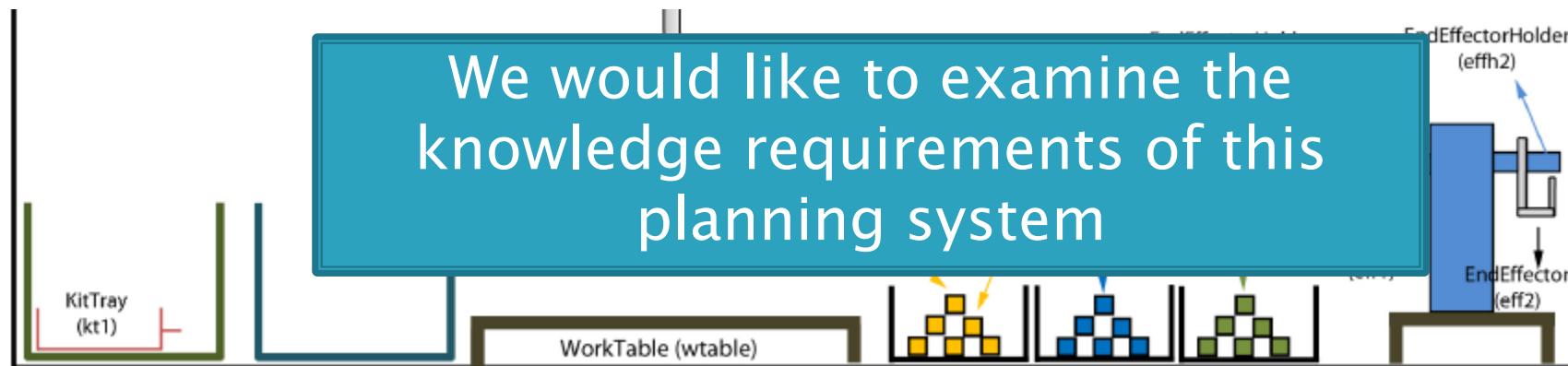
- ▶ Process in which individually separate but related items are grouped, packaged, and supplied together as one unit
- ▶ Utilized in many manufacturing assembly lines
- ▶ Robotic solution requires:
  - Flexibility -Many parts with varying characteristics, part-to-part inconsistencies
  - Agility - Changes in part supply locations, lack of fixturing
  - Rapid re-tasking - Ability to quickly build new varieties of kits



# Planning Problem

$$\mathcal{P} = (\Sigma, s_0, g)$$

- $\Sigma$  – State transition system (possible actions)
- $S_0$  – Initial conditions (objects and relationships)
- $g$  – Goal conditions



# Knowledge Foundation

- ▶ Capture a domain expert's knowledge
  - Actions
    - What actions and attributes are relevant
    - Necessary conditions for an action to occur
    - Likely results of the action
  - Objects
    - What objects and attributes are relevant
    - Taxonomy of objects
    - Relationships between objects



# States and Actions

- ▶ State–Variable Representation<sup>1</sup> (SVR) used to formally define environment’s state and actions
- ▶ Each state is represented by a tuple of values of  $n$  state variables  $\{x_1, \dots, x_n\}$
- ▶ Action is represented by a partial function that maps this tuple into some other tuple of values of the  $n$  state variables



<sup>1</sup>Dana Nau, Malik Ghallab, and Paolo Traverso. 2004. *Automated Planning: Theory & Practice*. Morgan Kaufmann Publishers Inc.

# Compose SVR in Planning Domain Definition Language (PDDL)

- ▶ SVR is not a standard interchange language
  - Can use the PDDL to encode the SVR
- ▶ Entire kitting domain composed of 8 high-level operators: *take-kit-tray*,

*take-kt(r,kt,lbwekt,eff,wtable)*: The *Robot r* equipped with the *EndEffector eeff* picks up the *KitTray kt* from the *LargeBoxWithEmptyKitTrays lbwekt*.

<i>precond</i>	<i>effects</i>
$r\text{hold-empty}(r),$ $lbwekt\text{-non-empty}(lbwekt),$ $r\text{-with-eff}(r, eff),$ $ktlocation(kt, lbwekt),$ $efflocation(eff, r),$ $wtable\text{-empty}(wtable),$ $efftype(eff, kt)$	$\neg r\text{hold-empty}(r),$ $ktlocation(kt, r),$ $r\text{hold}(r, kt),$ $\neg ktlocation(kt, lbwekt)$

# SVR – PDDL Limitations

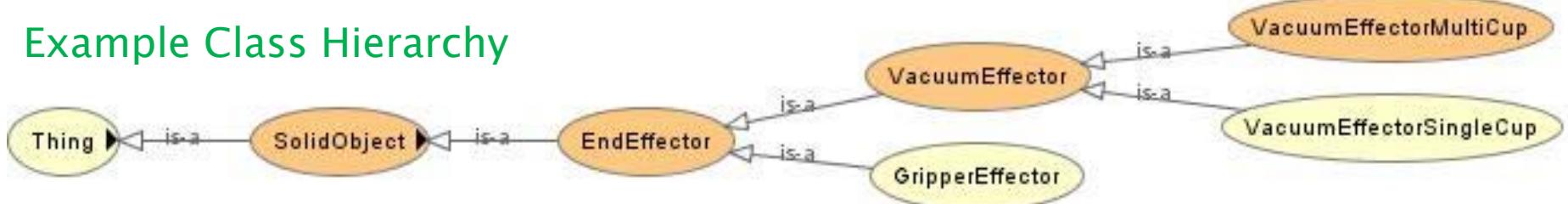
- ▶ Lacks a taxonomy of objects
  - ▶ No representation of relationships or constraints between objects
  - ▶ No ability to reason or infer information
- 
- ▶ An ontology provides for all of the above through entities, data properties, and object properties



# Ontology

- ▶ IEEE Robotics and Automation Society's Ontologies for Robotics and Automation Working Group has chosen the Web Ontology Language (OWL) as the representation language

## Example Class Hierarchy



# Limitations of OWL

- ▶ Set of static files with no real-time information
  - Can auto-generate MySQL database from OWL instance file and maintain database with sensor processing
  - Can re-generate OWL instance file to allow for continued reasoning
- ▶ No way to encode preconditions and effects of actions
  - OWL Services (OWL-S) and the Semantic Web Rule Language (SWRL) are extensions that provide for actions with preconditions and effects



# Knowledge System in Action

File

```
1 (attach-eff r1 eff2 eff1)
2 (take-kt r1 kt1 lbwekt)
3 (put-kt r1 kt1 wtable)
4 (create-kins kins1 kt1)
5 (remove-eff r1 eff2 eff1)
6 (attach-eff r1 eff1 eff2)
7 (take-part r1 partb parta1)
8 (put-part r1 partb kin1)
9 (take-part r1 parta1 partb)
10 (put-part r1 parta1 kins1)
11 (take-part r1 partc parta2)
12 (put-part r1 partc kins1)
13 (take-part r1 parta2 partb)
14 (put-part r1 parta2 kin1)
15 (remove-eff r1 eff1 eff2)
16 (attach-eff r1 eff2 eff1)
17 (take-kins r1 kins1 wtable)
18 (put-kins r1 kins1 lbwk)
(goal)
```

ut-part r1 ... (take-part r1...) (put-part r1...) (remove-eff r1...) (attach-eff r1...) (take-kins r1...) (put-kins r1...) (goal)

(kinslocation-lbwk kins1 lbwk1)

(partlocation-kins partb kins1)  
(partlocation-kins parta1 kins1)  
(partlocation-kins partc kins1)  
(partlocation-kins parta2 kins1)

Full Action Information World State Change

**(goal)**

Before action:  
(partlocation-kins partb kins1), (effhold-eff effh1 eff1), (lbwekt-non-empty lbwekt1), (eff-for-kt eff2 kt1), (efflocation-r eff2 r1),  
(eff-for-part eff1 partb), (eff-for-kins eff2 kins1), (lbwk-non-full lbwk1), (partlocation-kins parta1 kins1), (eff-for-part eff1 parta2),  
(partlocation-kins parta2 kins1), (efflocation-eff eff1 effh1), (ktlocation-wtable kt1 wtable), (eff-for-part eff1 partc), (rhold-empty r1),  
(partlocation-kins partc kins1), (worktable-empty wtable), (r-with-eff r1 eff2), (eff-for-part eff1 parta1), (part-tray-non-empty ptb),  
(part-tray-non-empty pta), (kinslocation-lbwk kins1 lbwk1), (part-tray-non-empty ptc),

After action:  
(partlocation-kins partb kins1), (effhold-eff effh1 eff1), (lbwekt-non-empty lbwekt1), (eff-for-kt eff2 kt1), (efflocation-r eff2 r1),  
(eff-for-part eff1 partb), (eff-for-kins eff2 kins1), (lbwk-non-full lbwk1), (partlocation-kins parta1 kins1), (eff-for-part eff1 parta2),  
(partlocation-kins parta2 kins1), (efflocation-eff eff1 effh1), (ktlocation-wtable kt1 wtable), (eff-for-part eff1 partc), (rhold-empty r1),  
(partlocation-kins partc kins1), (worktable-empty wtable), (r-with-eff r1 eff2), (eff-for-part eff1 parta1), (part-tray-non-empty ptb),

# PDDL Plan Instance File

**(attach-eff r1 eff2 effh2)**

Before action:

(ktlocation-lbwekt kt1 lbwekt1), (effhold-eff effh1 eff1), (~~effhold-eff effh2 eff2~~), (lbwekt-non-empty lbwekt1), (eff-for-kt eff2 kt1), (eff-for-part eff1 partb), (eff-for-kins eff2 kins1), (lbwk-non-full lbwk1), (~~efflocation-eff eff2 effh2~~), (eff-for-part eff1 parta2), (efflocation-eff eff1 effh1), (partlocation-pt partb ptb), (eff-for-part eff1 partc), (~~r-no-eff r1~~), (worktable-empty wtable), (partlocation-pt partc ptc), (partlocation-pt parta2 pta), (partlocation-pt parta1 pta), (eff-for-part eff1 parta1), (part-tray-non-empty ptb), (part-tray-non-empty pta), (part-tray-non-empty ptc),

After action:

(ktlocation-lbwekt kt1 lbwekt1), (effhold-eff effh1 eff1), (lbwekt-non-empty lbwekt1), (eff-for-kt eff2 kt1), (**efflocation-r eff2 r1**), (eff-for-part eff1 partb), (eff-for-kins eff2 kins1), (lbwk-non-full lbwk1), (eff-for-part eff1 parta2), (efflocation-eff eff1 effh1), (partlocation-pt partb ptb), (eff-for-part eff1 partc), (**rhold-empty r1**), (worktable-empty wtable), (**r-with-eff r1 eff2**), (partlocation-pt partc ptc), (partlocation-pt parta2 pta), (partlocation-pt parta1 pta), (eff-for-part eff1 parta1), (part-tray-non-empty ptb), (part-tray-non-empty pta), (part-tray-non-empty ptc),

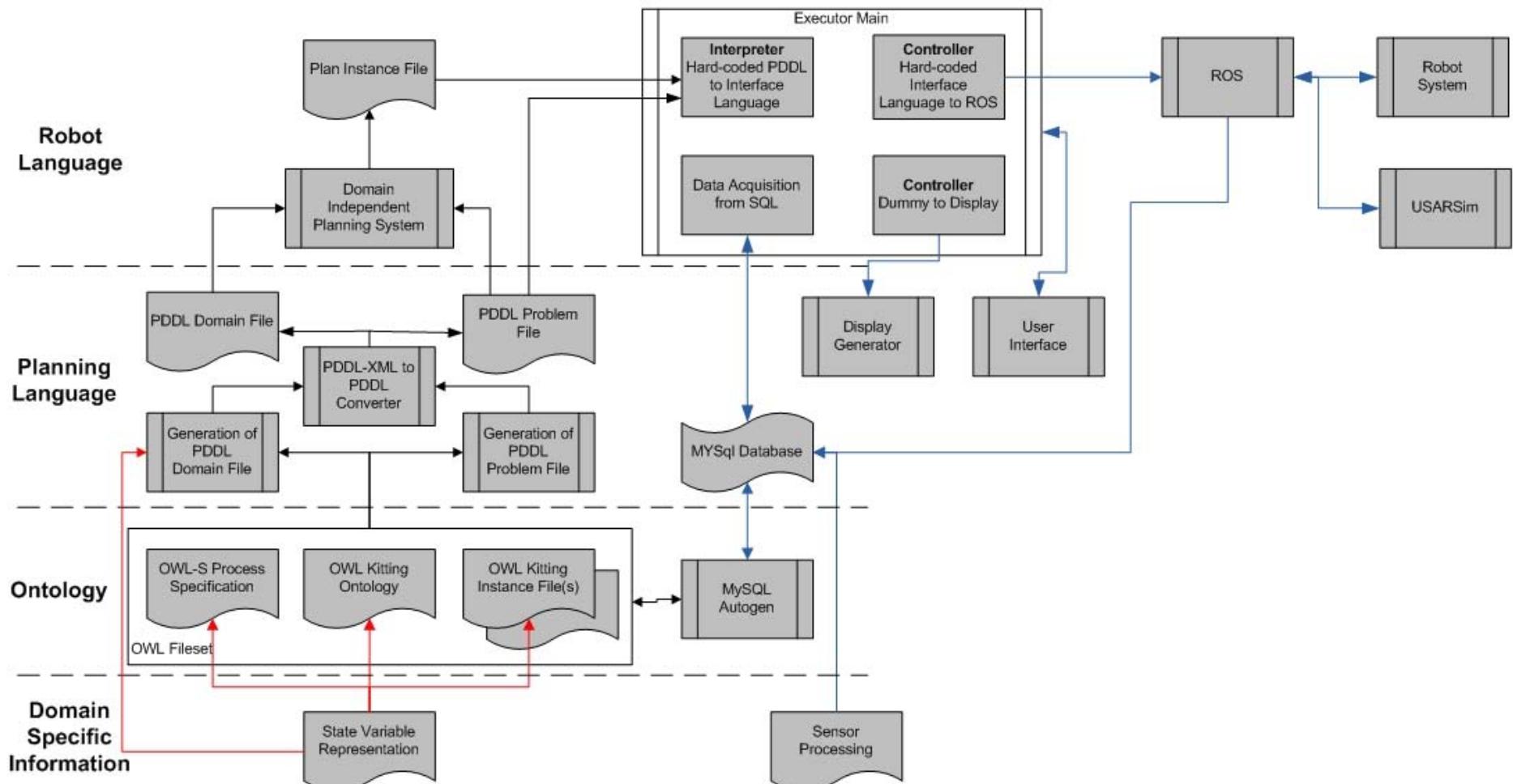
- ▶ Intentionally incomplete information
  - Command provides task-level information; most robots will not know how to “attach–eff”
  - Specific information needed to accomplish task is missing
  - This intentional lack of information provides for decoupling of task knowledge and environment knowledge
- ▶ Executor module populates the details
  - Combines task knowledge from PDDL with environment knowledge from MySQL
  - Utilizes “Canonical Robot Command Language” as an Interlingua

# Example: attach-eff r1 eff2 effh2

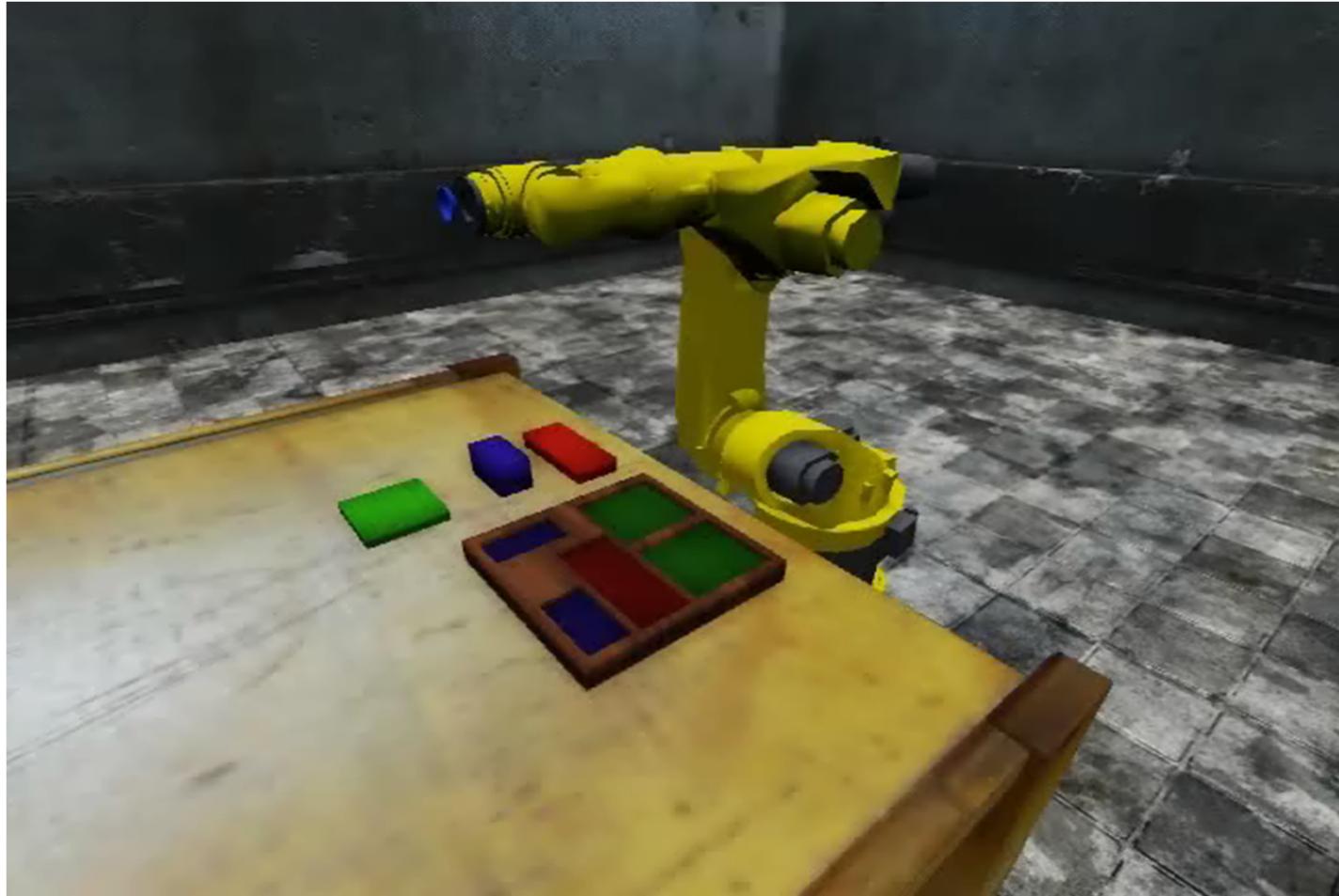
Subcommand	PDDL	MySQL	Data Update
Move	R1 , effh2	Actual locations, offsets	---
Actuate	R1		R1 holds eff2 Effh2 empty
Move	R1	Offsets	---

- ▶ Must have mapping between PDDL actions and required robot sub-actions
- ▶ Must update knowledge base (MySQL)
- ▶ MySQL knowledge base contains all data from ontology needed by planner

# Complete Knowledge Architecture



# Operational System



Video is 2x real time

# Future Work

- ▶ Current work assumes perfect actions; need techniques to gracefully cope with errors
- ▶ Migrate techniques onto real hardware with real image processing
- ▶ Extend work to apply to general assembly operations

