

# Overview of Industrial Robot Group Activities

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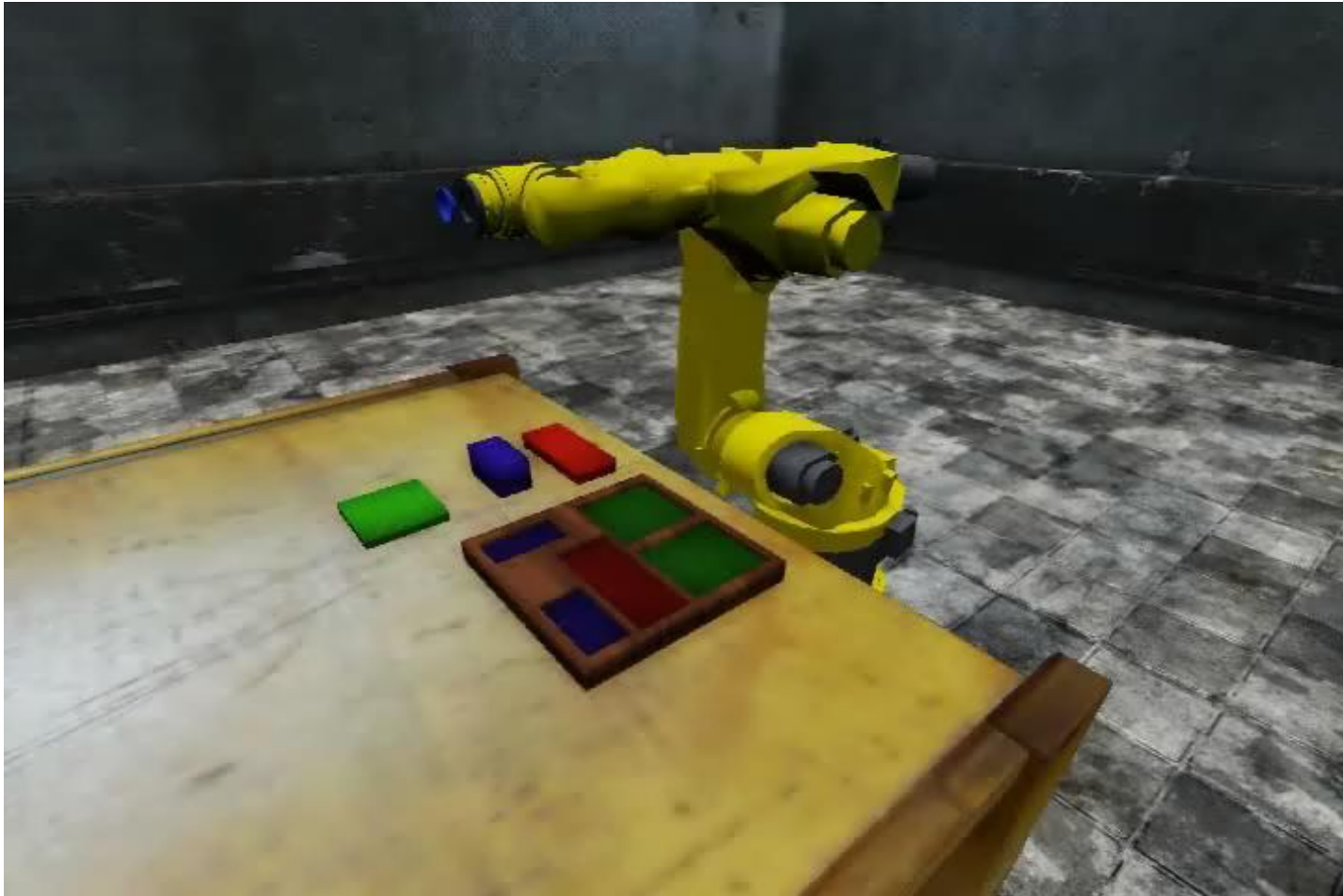
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# Kit Building

- ▶ 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



# Real Planning / Simulated Robot

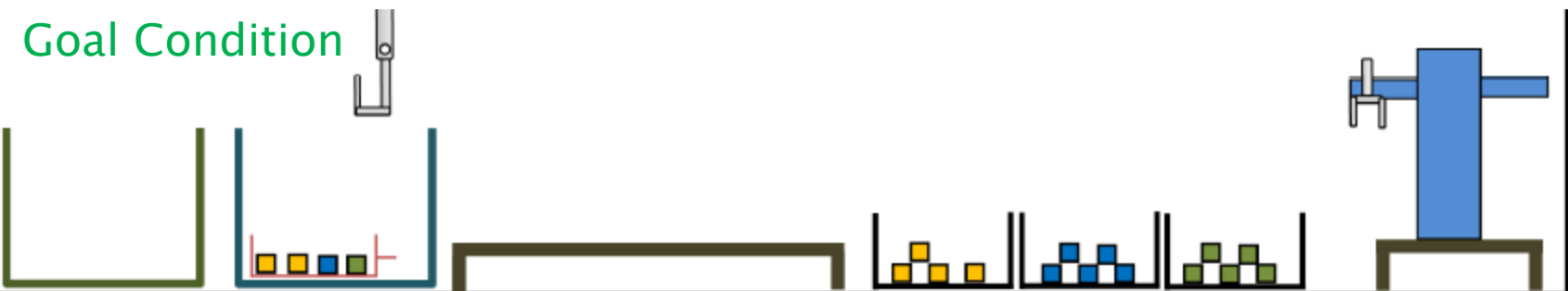
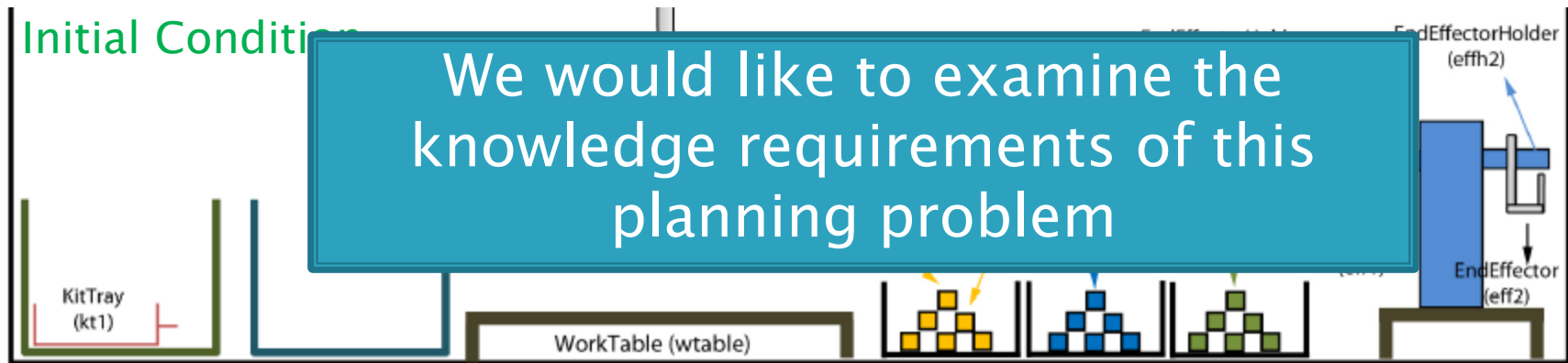


Video is 2x real time

# Planning Problem

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

- $\Sigma$  – State transition system (possible actions)
- $s_0$  – Initial conditions (objects and relationships)
- $g$  – Goal conditions



# Underlying Knowledge Representation

## ▶ Objects

- What objects and attributes are relevant
- Taxonomy of objects
- Relationships between objects

## ▶ Actions

- What actions and attributes are relevant
- Necessary conditions for an action to occur
- Likely results of the action

## ▶ Dynamic world

- Object attributes change over time
- Actions do not always accomplish what we want them to

# Objects, Relationships, and Actions

- ▶ State–Variable Representation<sup>1</sup> (SVR) used to formally define environment's objects, object relations (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
- ▶ SVR is not a standard interchange language
  - Can encode the SVR into Planning Domain Definition Language (PDDL)

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



# Planning Domain Definition Language (PDDL)

## Initial Condition

$r\text{-no-eff}(r_1)$	$ktlocation(r_1, lbwekt_1)$
$lbwekt\text{-non-empty}(lbwekt_1)$	$partlocation(part_{A-1}, pt_A)$
$lbwek\text{-non-full}(lbwk_1)$	$partlocation(part_{A-2}, pt_A)$
$part\text{-tray-non-empty}(pt_A)$	$partlocation(part_B, pt_B)$
$part\text{-tray-non-empty}(pt_B)$	$partlocation(part_C, pt_C)$
$part\text{-tray-non-empty}(pt_C)$	$efftype(eff_1, part_{A-1})$
$efflocation(eff_1, effh_1)$	$efftype(eff_1, part_{A-2})$
$efflocation(eff_2, effh_2)$	$efftype(eff_1, part_B)$
$effhhold\text{-eff}(effh_1, eff_1)$	$efftype(eff_1, part_C)$
$effhhold\text{-eff}(effh_2, eff_2)$	$efftype(eff_2, kt_1)$
$worktable\text{-empty}(wtable)$	$efftype(eff_2, kins_1)$

Initial Condition  
encoded as set of  
predicate  
expressions

Goal Condition  
encoded as set of  
predicate  
expressions

Plan and actions are necessary to move  
from initial predicates to goal predicates

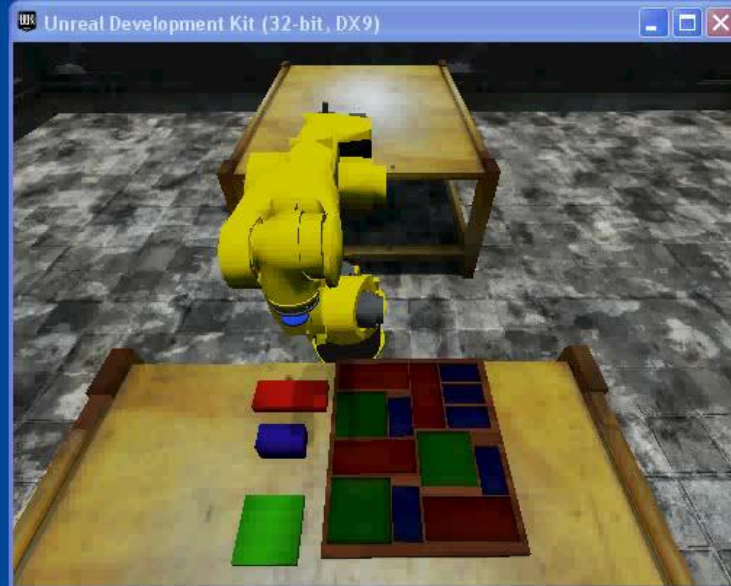
## Goal Condition

$partlocation(part_{A-1}, kins_1)$   
 $partlocation(part_{A-2}, kins_1)$   
 $partlocation(part_B, kins_1)$   
 $partlocation(part_C, kins_1)$   
 $kinslocation(kins_1, lbwk_1)$



# Auto- Determination of Predicates

- ▶ Sensor processing simulated from ground truth
- ▶ Each table line is new system state (set of predicates)
- ▶ Each table column is “watched” predicate
- ▶ Bottom area shows state deltas



RCCB Checker

Capture ON

State	# under effector	# A on Table	# A in Kit Tray	# B on Table	# B in Kit Tray	# C on Table	# C in Kit Tray
1	0	1	0	1	0	1	0

----- State : 1 -----

On top with contact(WCKitTray\_0,StaticMeshActor\_0)  
 On top with contact(PartC\_0,StaticMeshActor\_0)  
 On top with contact(PartB\_0,StaticMeshActor\_0)  
 On top with contact(PartA\_0,StaticMeshActor\_0)  
 Under with contact(StaticMeshActor\_0,WCKitTray\_0)  
 Under with contact(StaticMeshActor\_0,PartC\_0)  
 Under with contact(StaticMeshActor\_0,PartB\_0)  
 Under with contact(StaticMeshActor\_0,PartA\_0)



# Planning Domain Definition Language (PDDL)

- ▶ Entire kitting domain composed of:
  - 28 predicate expressions that act as preconditions or are acted upon during effects: *rhold-empty*, *r-with-eff*, *kit-tray-location*, *worktable-empty*, ...
  - 9 high-level operators (actions): *take-kit-tray*,

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

<i>precond</i>	<i>effects</i>
<i>rhold-empty</i> ( <i>r</i> ), <i>lbwekt-not-empty</i> ( <i>lbwekt</i> ), <i>r-with-eff</i> ( <i>r</i> , <i>eff</i> ), <i>kit-tray-location</i> ( <i>kt</i> , <i>lbwekt</i> ), <i>eff-location</i> ( <i>eff</i> , <i>r</i> ), <i>worktable-empty</i> ( <i>wtable</i> ), <i>efftype</i> ( <i>eff</i> , <i>kt</i> )	$\neg$ <i>rhold-empty</i> ( <i>r</i> ), <i>kit-tray-location</i> ( <i>kt</i> , <i>r</i> ), <i>rhold</i> ( <i>r</i> , <i>kt</i> ), $\neg$ <i>kit-tray-location</i> ( <i>kt</i> , <i>lbwekt</i> )

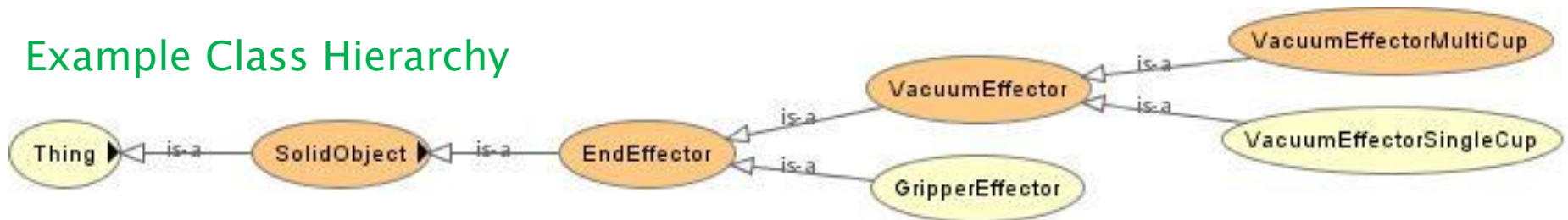
# Implementation of PDDL Actions

- ▶ Interface to many simulated and real robots
- ▶ Provide lowest common denominator actions for robot execution
  - Move
  - Open/Close Gripper
  - ...
- ▶ PDDL actions implemented as scripted sequence of these actions (called the Canonical Robot Command Language)

# SVR – PDDL Limitations

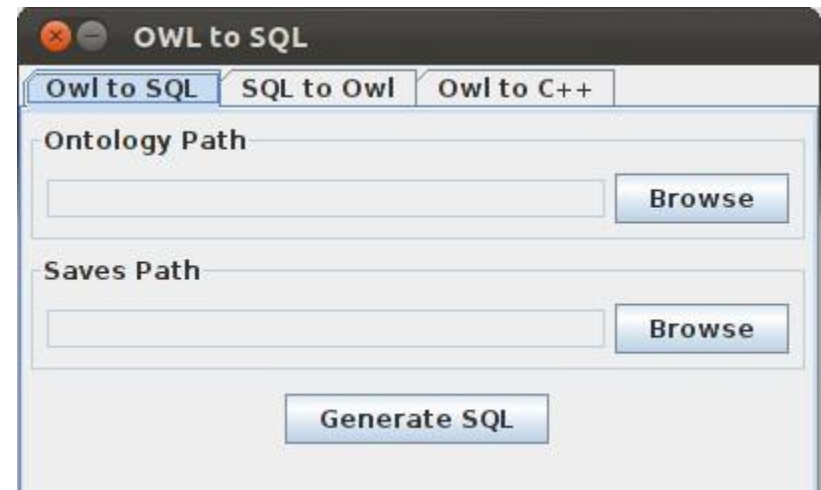
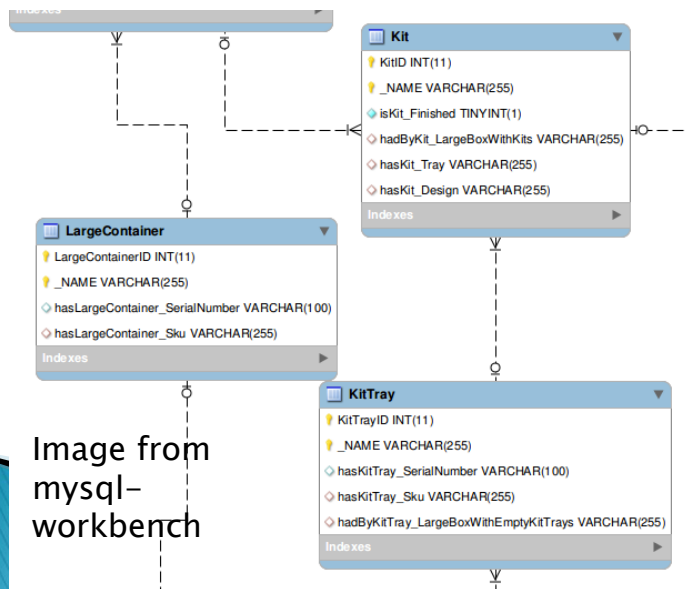
- ▶ Planning language not designed for knowledge representation
  - Lacks a taxonomy of objects
  - No representation of relationships or constraints between objects
- ▶ An ontology provides for all of the above through entities, data properties, and object properties
  - Web Ontology Language (OWL) can be used to represent objects, relationships, and constraints
  - OWL Services (OWL-S) and the Semantic Web Rule Language (SWRL) can be used to represent actions, preconditions, and effects
- ▶ Tools exist to move from OWL and OWL-S/SWRL to PDDL representations

## Example Class Hierarchy



# Issues With Dynamics

- ▶ PDDL/OWL representation is a set of static files with no real-time information
  - Can auto-generate MySQL database from OWL instance file and maintain database with sensor processing (access functions also auto-generated)
  - Can automatically re-generate OWL instance file to allow for continued reasoning



# Knowledge Generation

System Execution

Auto-gen

MySQL database, PDDL  
plan file

Auto-gen

PDDL Domain, Problem  
files

Hand created

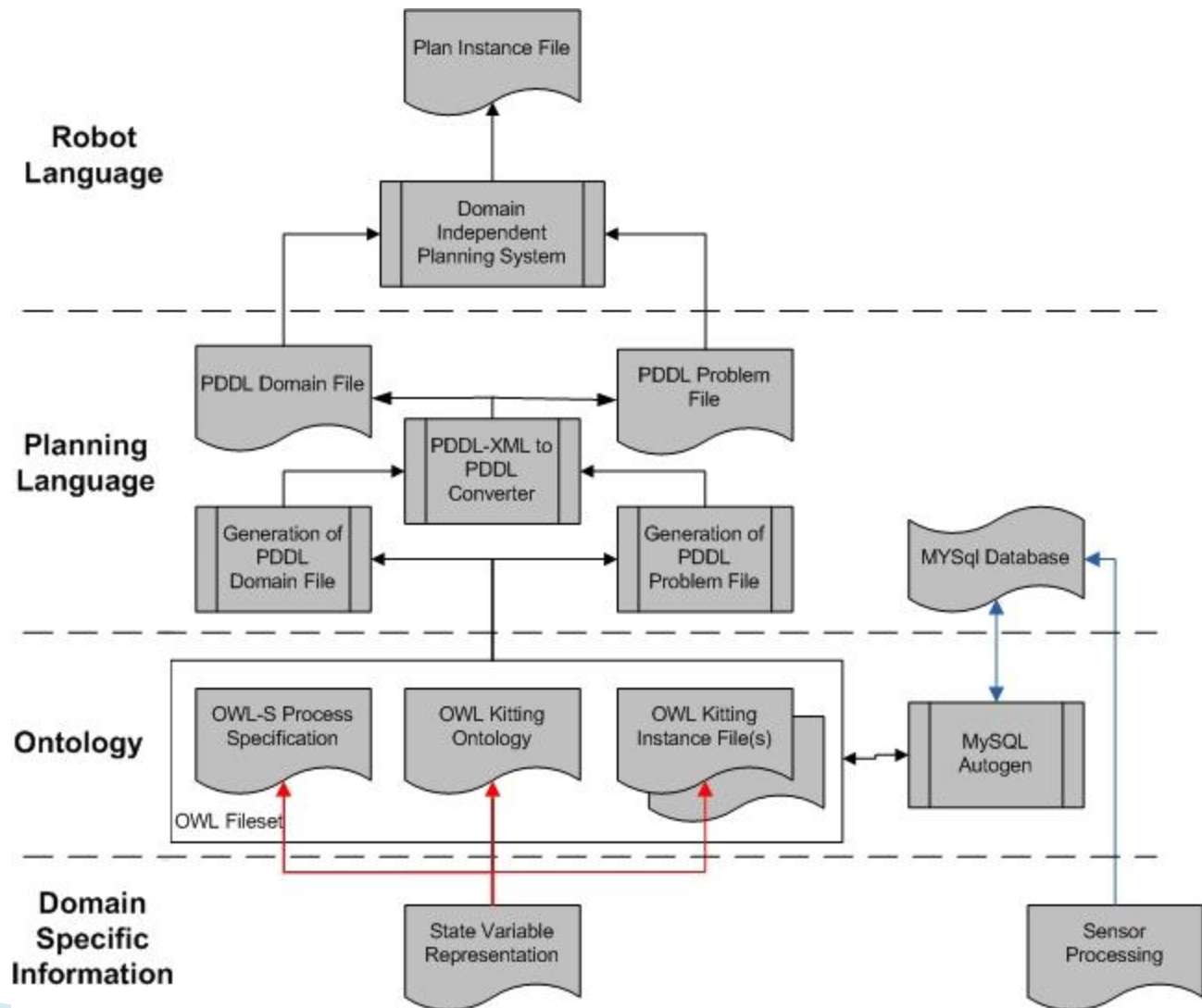
OWL-S, SWRL Rule files

Hand created

OWL Model, Initial  
Condition, Goal  
Condition files



# Knowledge Architecture



# Implementation Issues: OWL/OWL-S

## ► Naïve user, but...

### ◦ SWRL Rules

- Very verbose data entry for rule, pre-conditions, and effects
- Difficult/impossible to represent negation

### ◦ OWL Instance Modification

- Open world assumption allows spelling errors
- Required to typecast every data entry
- Need to follow complex trail of tables and pointers
- Removal of instance requires careful clean-up to remove “hanging” entries

## ► Is there another way?

- Investigated use of XML and PDDL with automatic generation of OWL files

```
<!-- http://www.nist.gov/el/ontologies/IPMAS-Activities10.owl#KitTrayInLargeBoxWithEmptyKitTrays -->
```

```
<owl:NamedIndividual rdf:about="&ontologies;IPMAS-Activities10.owl#KitTrayInLargeBoxWithEmptyKitTrays">
```

```
  <rdf:type rdf:resource="&expr;SWRL-Condition"/>
```

```
  <rdfs:Label>hasSolidObject_PhysicalLocation(TakeKT_KitTray, ?rli) RelativeLocationIn(?rli) &amp; hasPhysicalLocation_RefObject(?rli,TakeKT_LargeBoxWithEmptyKitTrays) &amp; </rdfs:Label>
```

```
  <rdfs:comment>A KitTray must have a PhysicalLocation which is a RelativeLocationIn (?rli) that must point to a hasPhysicalLocation_RefObject which is a LargeBoxWithEmptyKitTrays.</rdfs:comment>
```

```
  <expr:expressionObject>
```

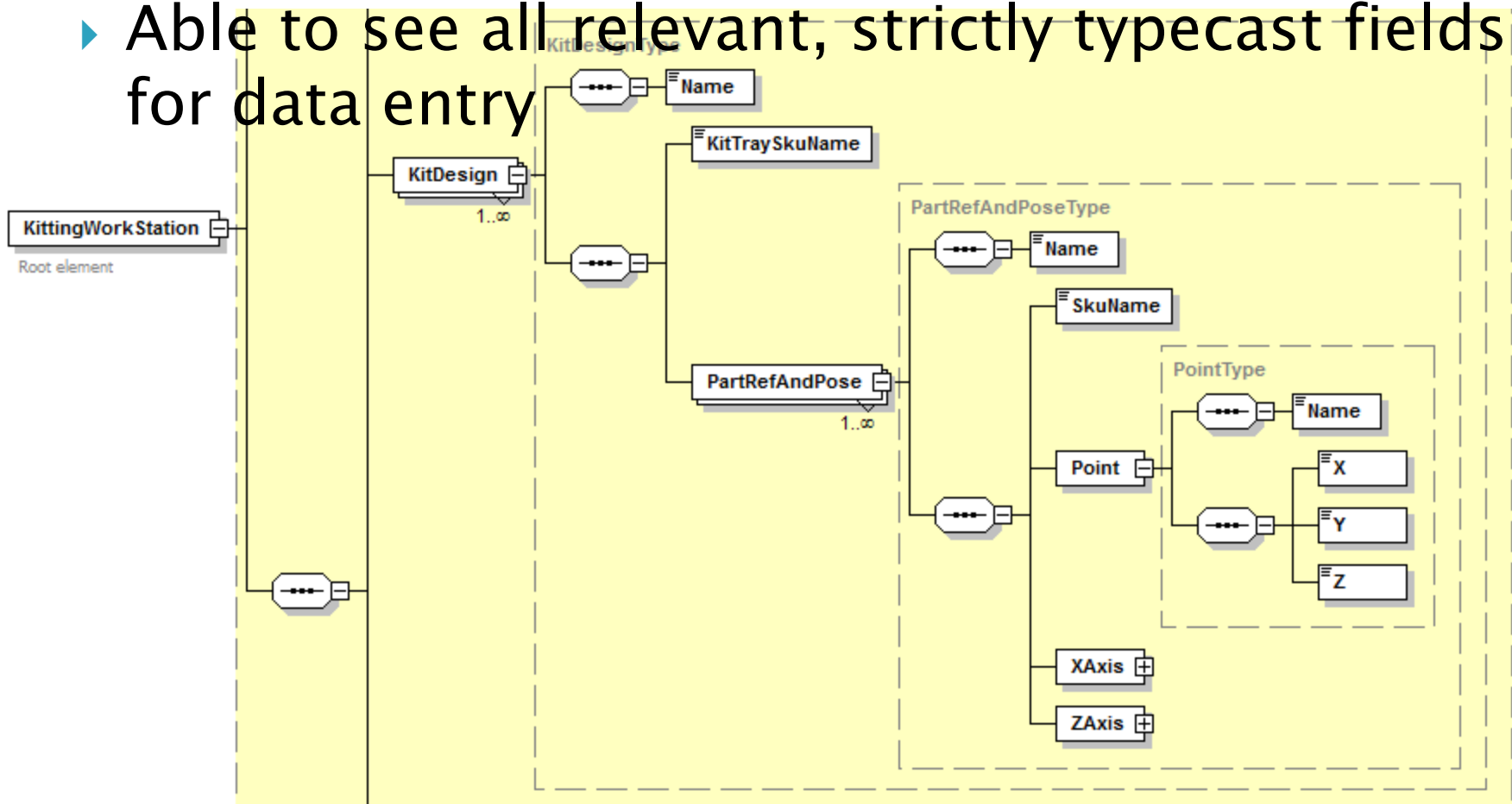
```
    <rdf:Description/>
```

```
  </expr:expressionObject>
```

```
</owl:NamedIndividual>
```

# XML Representation

- ▶ Schema view clearly shows elements, element structure and properties, and classes
- ▶ Able to see all relevant, strictly typecast fields for data entry



# More Tools

- ▶ We have created XML→OWL conversion tools
  - Can automatically generate an OWL “instance” file from an XML file
  - Work currently underway to generate OWL “model” file from XML schema
- ▶ XML provides
  - Closed world assumption
  - Type checking
  - Consistency checking

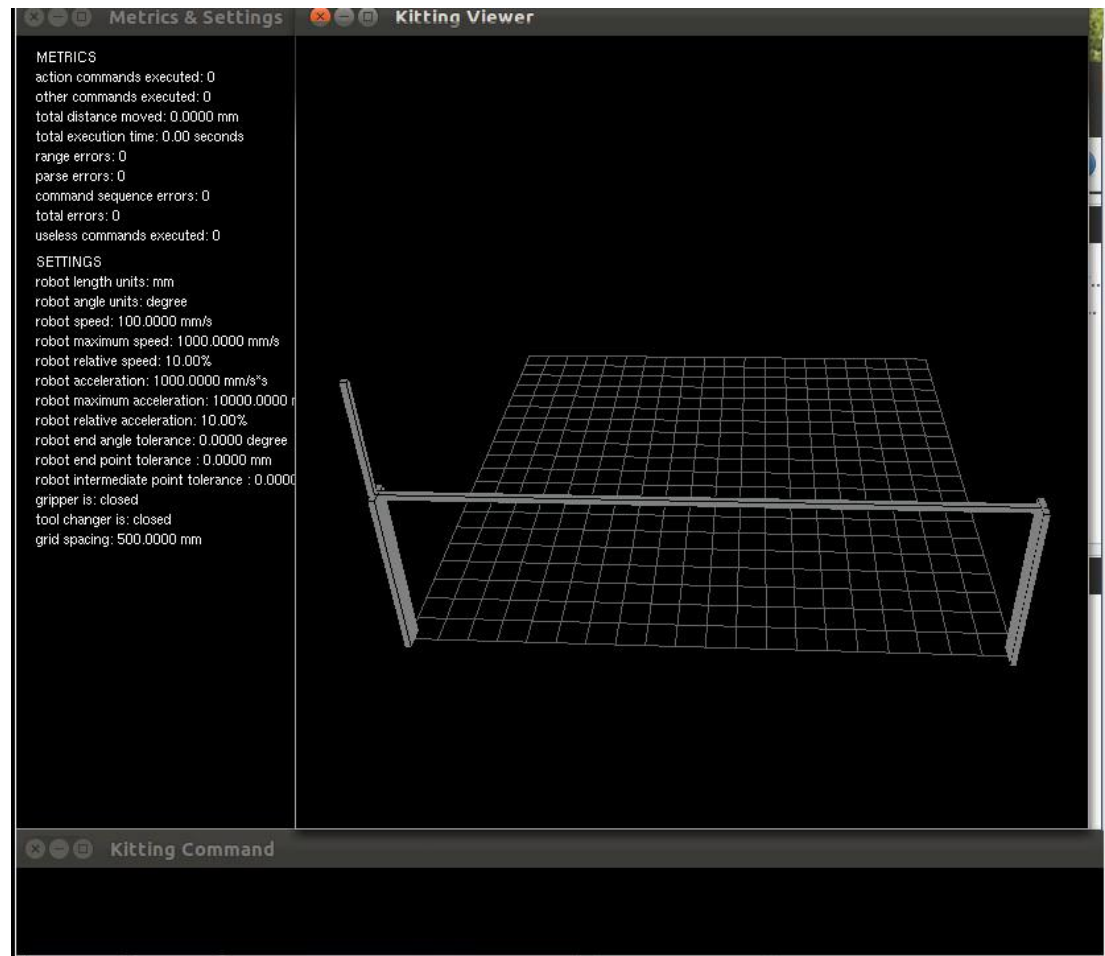
# System Alternatives?

	System Execution	System Execution
Auto-gen	MySQL database, PDDL plan file	MySQL database, PDDL plan file
Auto-gen	OWL Model, Initial-, Goal-Condition files, PDDL Problem file	PDDL Domain, Problem files
Hand created	PDDL Domain file, code for predicate generation	OWL-S, SWRL Rule files
Hand created	XML Schema, Initial Condition, Goal Condition files	OWL Model, Initial Condition, Goal Condition files



# Future Work, Metrics

- ▶ Time to build
- ▶ Distance robot traveled
- ▶ Number of actions
- ▶ Useless commands
- ▶ Errors
- ▶ ...



# 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
  - ▶ Develop metrics for kit building
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