

Deliberative Planning and Acting

Tutorial based on new book

Introduction

*IJCAI Tutorial
NY, July 2016*

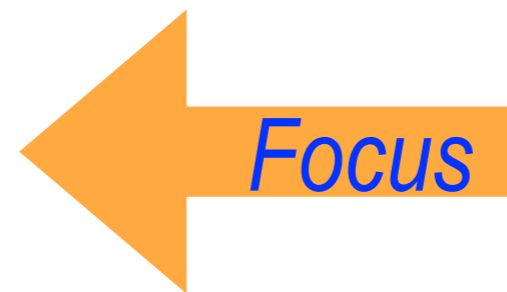


Automated Planning and Acting

Malik Ghallab, Dana Nau
and Paolo Traverso

Deliberative Planning and Acting

- ▶ Acting deliberately
 - Motivated by some intended objectives
 - Consists of choosing and performing actions justifiable by sound reasons with respect to intended objective
- ▶ Deliberation
 - *What* to do to achieve objectives
 - *How* to do it
- ▶ Relies on
 - *Innate behavior* preprogrammed or evolved
 - *Learned behavior*
 - *Model-based behavior*





[Greenpower Science]



[Weir 2002]



[Bird 2009]

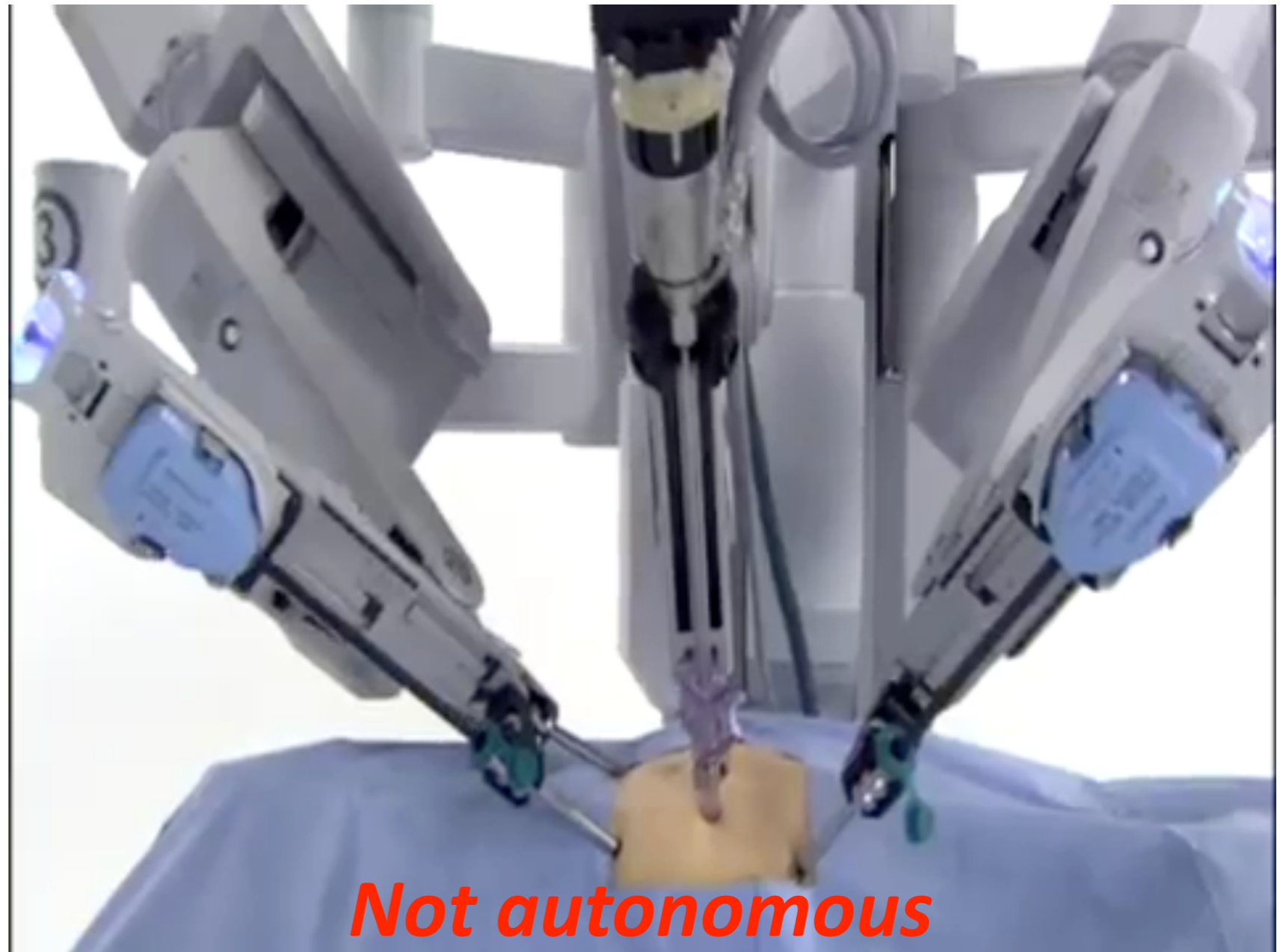


[Bosch, c.1502]

Study computational models and principles which permit an artificial *actor* to act deliberately

- ▶ *Understand* deliberative acting
- ▶ *Experiment* with deliberative actors
- ▶ *Develop* socially useful technologies

- ▶ Deliberation: required for an actor that is
 - *autonomous*



Not autonomous

[Intuitive Surgical]

Motivation

- ▶ Deliberation: required for an actor that is
 - *autonomous* and
 - *versatile*

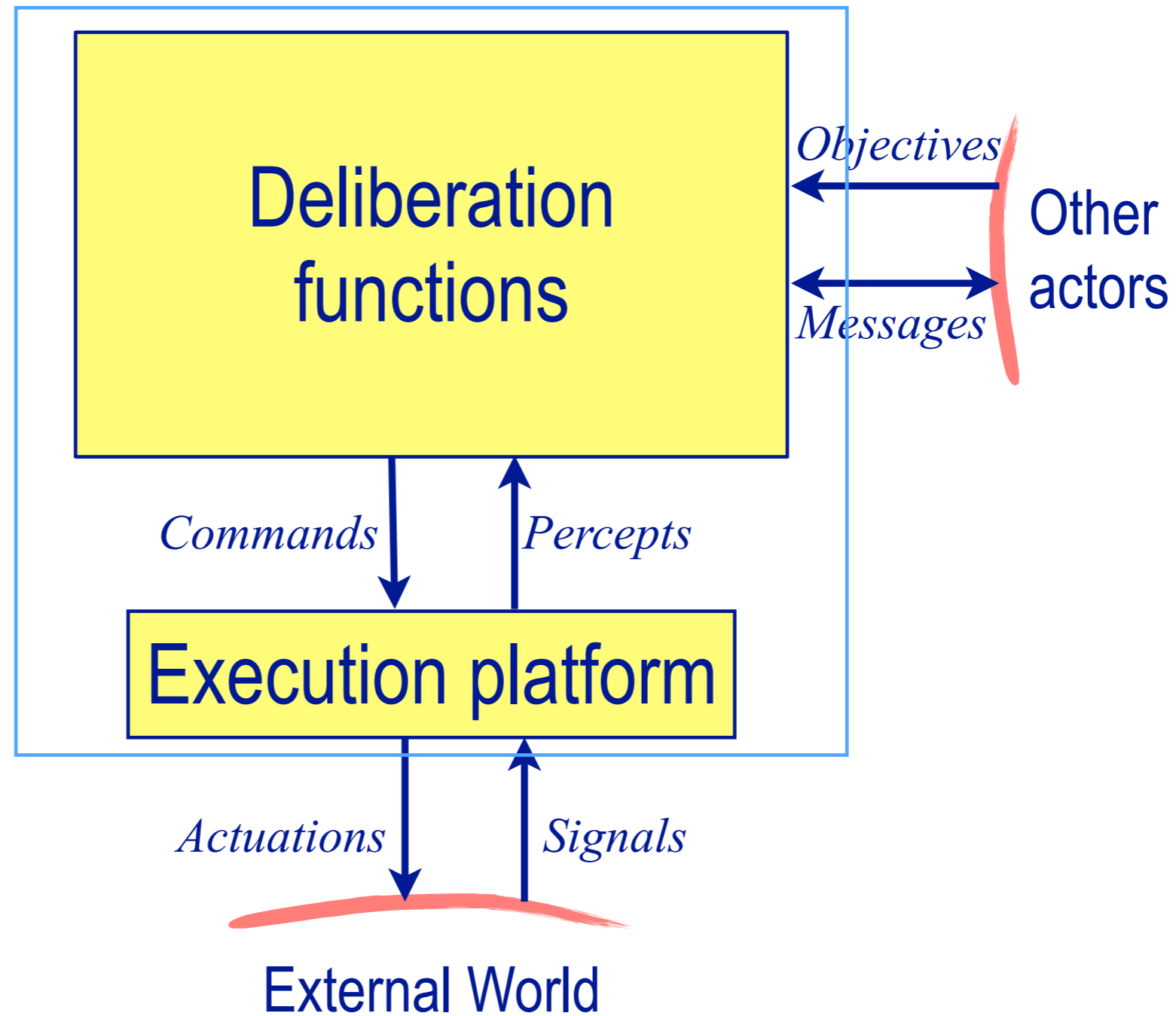


Not versatile

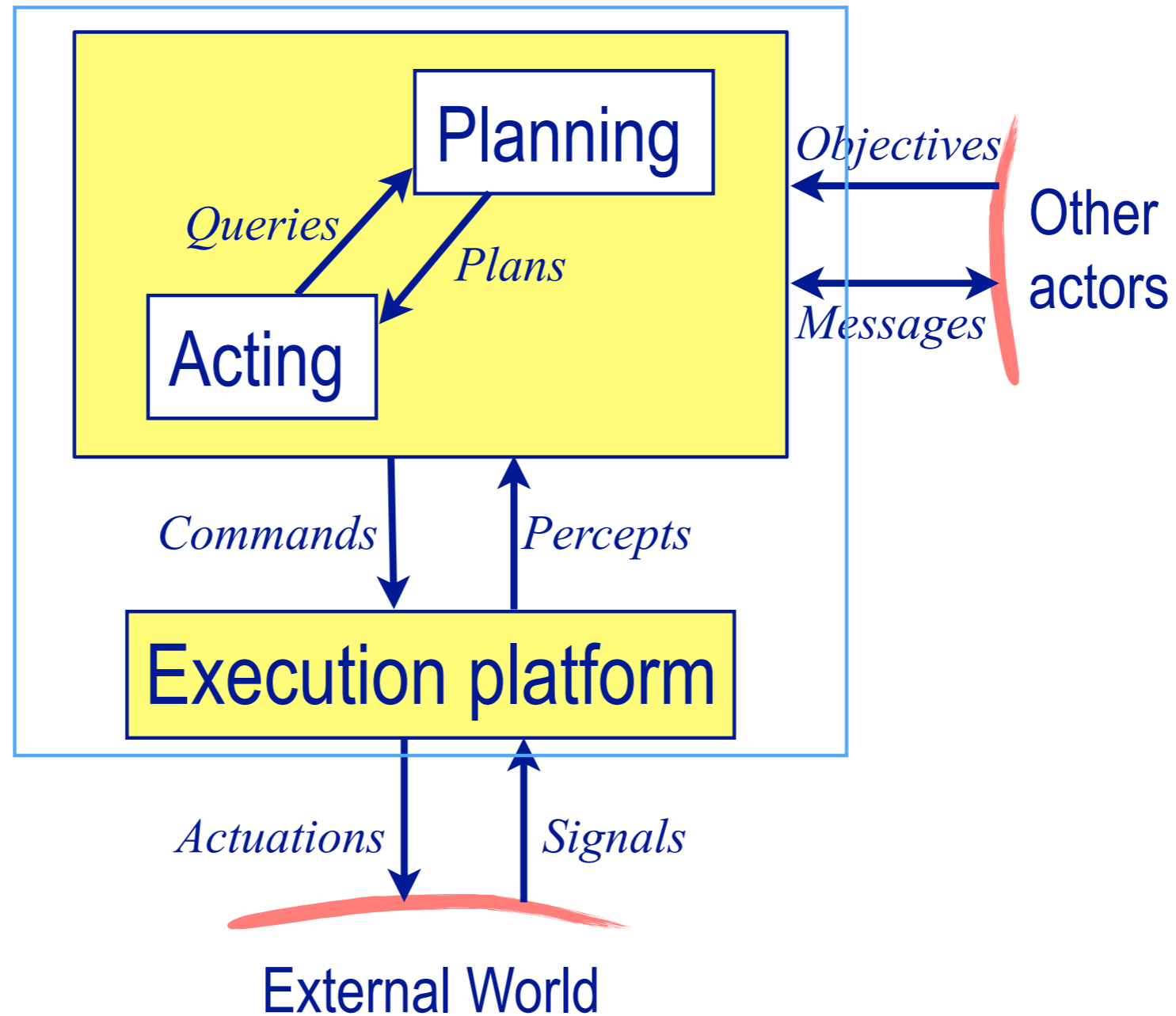
[Kiva Systems]



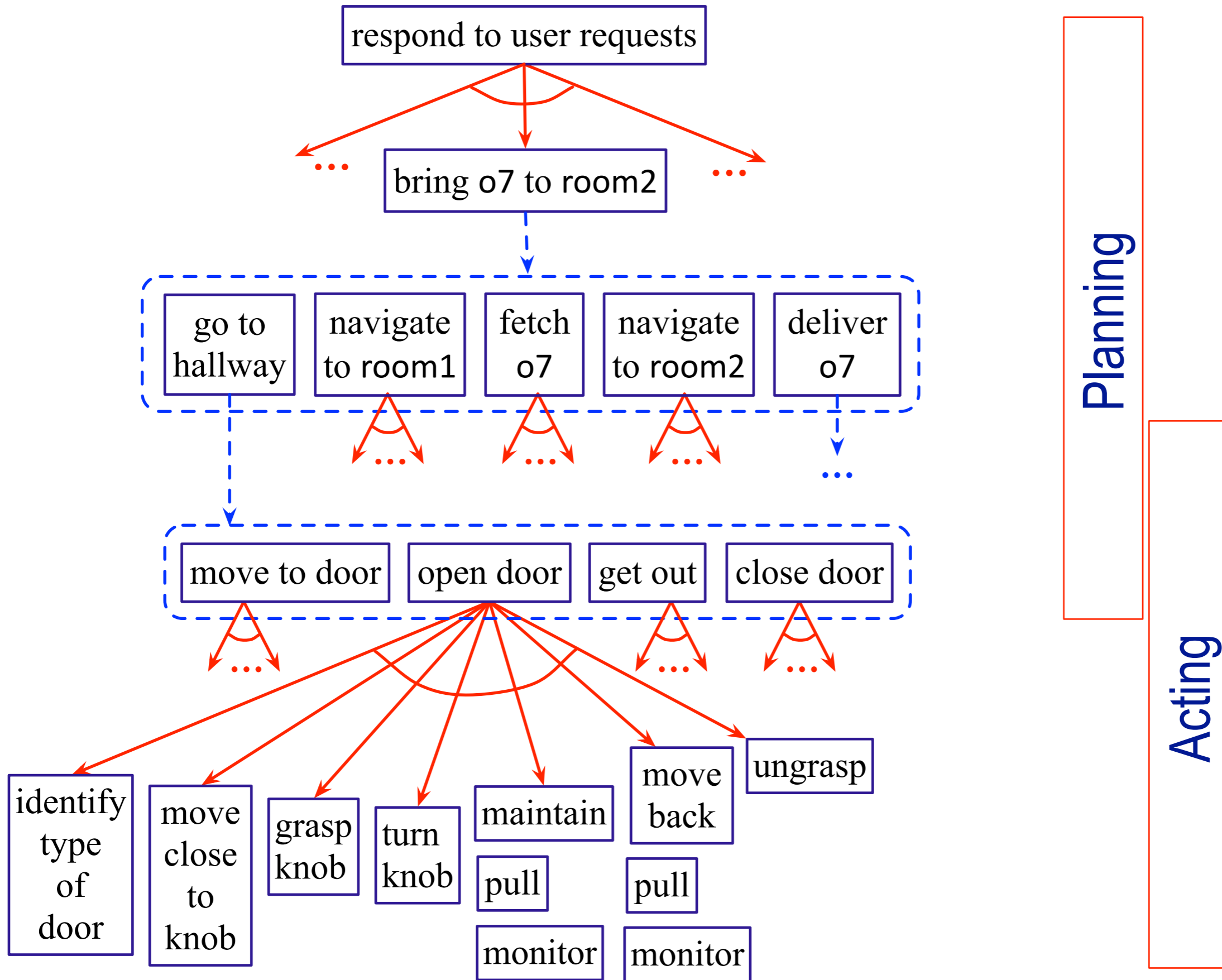
Conceptual View of an Actor



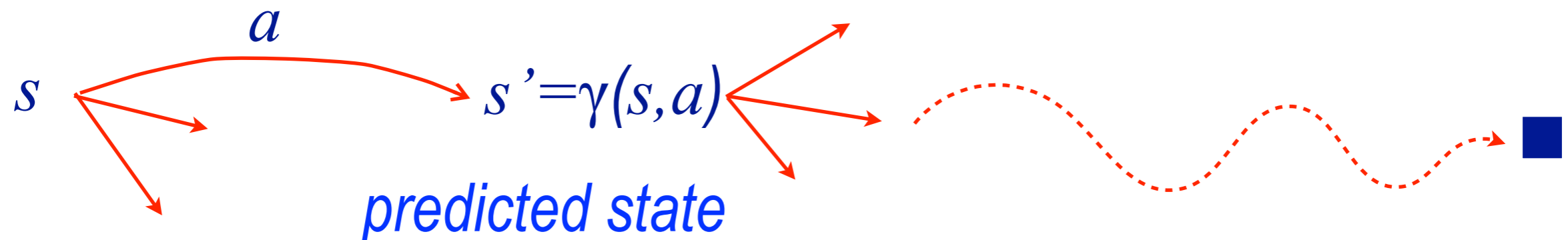
Conceptual View of an Actor



Conceptual View of an Actor



- ▶ *What* set of actions can achieve some purpose
 - Synthesis* of an organized set of actions
- ▶ Relies on *Simulation + Search*
 - *Simulation* of the effects of an action with a *descriptive model*
 - *Search* over *predicted states* and possible organizations of feasible actions to achieve intended purpose

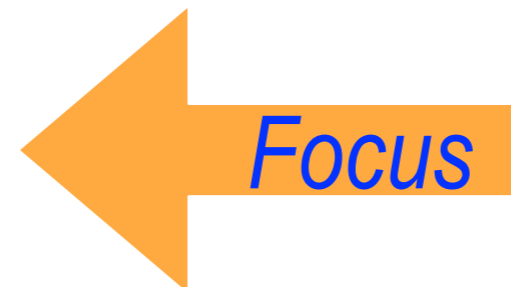


▶ *Different types of actions*

=> Different predictive models

=> Different planning problems and techniques

- Motion and manipulation planning
- Perception planning
- Navigation planning
- Communication planning
- Task planning



- ▶ *How* to perform chosen actions while reacting to the context in which the activity takes place
 - Refining actions into commands w.r.t. current context
 - Reacting to events
- ▶ Relies on *operational models* of actions
- ▶ Focuses on *current observed state*
- ▶ Acting ≠ Execution
 ≠ Planning

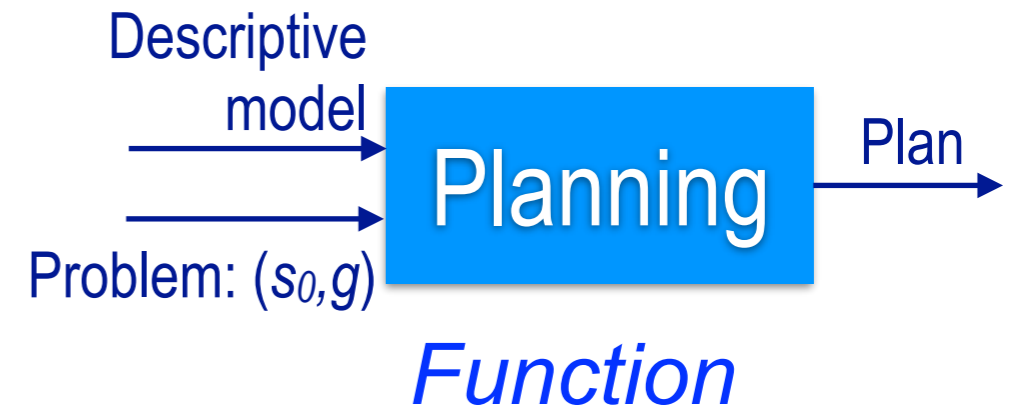
What are the specifics of acting as a deliberation function?

How to address *jointly* planning and acting?

Acting vs Planning

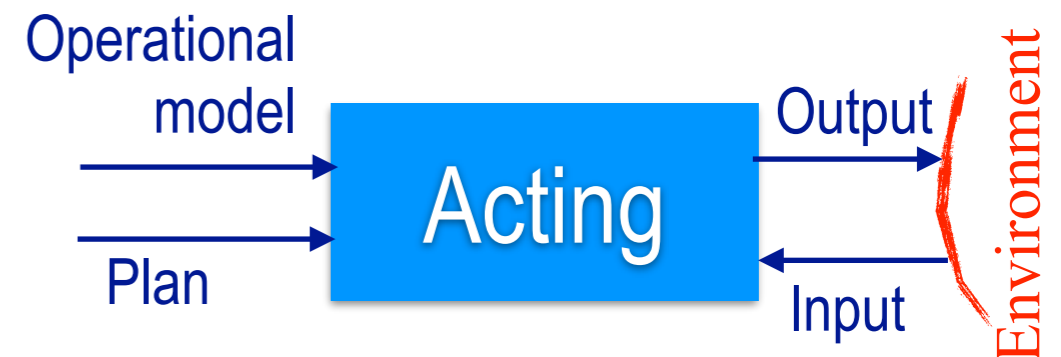
► Planning

- Models × Problems → Plans



► Acting

- *Situated interaction* with dynamic unpredictable environment
 - Adapt actions to context
 - React to context



Transduction
closed loop on streams I/O

Is Acting ≠ Planning?

▶ Planning

- Models × Problems → Plans



▶ Acting

- Situated interaction with dynamic unpredictable environment



Synthesize a plan that is a situated automata

Yes: MDP, Nondeterministic planning

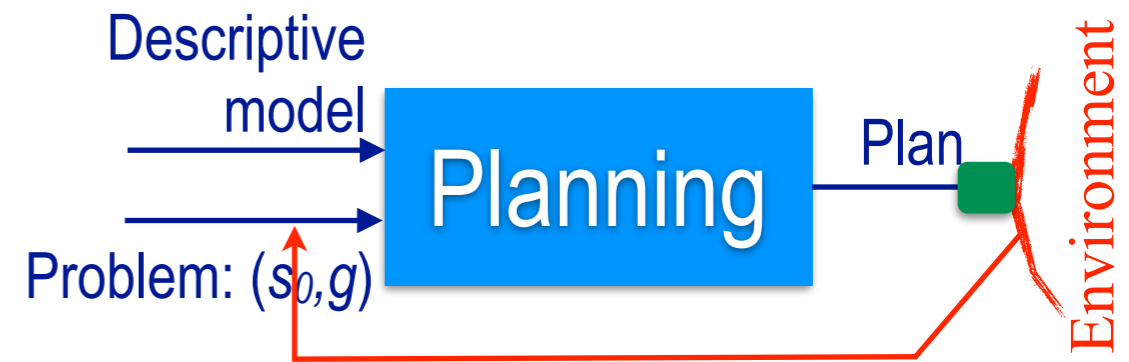
But: Modeling effort: exponential in $\#effects(a) \times \#events(s)$

Adaptation of automata execution to diversity

Is Acting ≠ Planning?

► Planning:

- Models × Problems → Plans



► Acting:

- Situated interaction with dynamic unpredictable environment



Close the loop on a planner

Yes: Receding horizon, interleaved planning and execution

But: Type of input: not always (s, g)

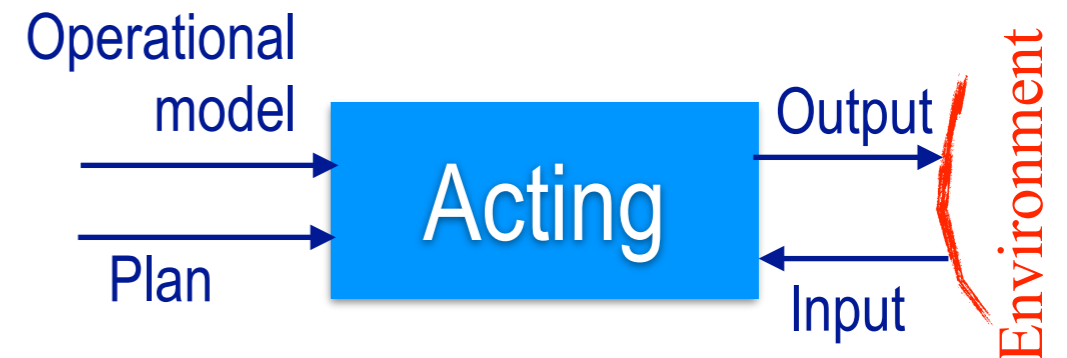
Type of models needed

Is Acting ≠ Planning?

- ▶ Planning:
 - Models × Problems → Plans



- ▶ Acting:
 - Situated interaction with a dynamic unpredictable environment



Design Acting as a flexible embedded system

Yes: Control theory, Automata theory, state charts

Real-time reactive systems, synchronous languages

But: Seldom adequate for diversity of tasks and environments

Planning & Acting

▶ *Hierarchically organized deliberation*

- Combine tasks with/without planning actions with/without online refinement
- Heterogeneous representations and models
- ➔ Hierarchy of representations, tools, and techniques

▶ *Continual online deliberation*

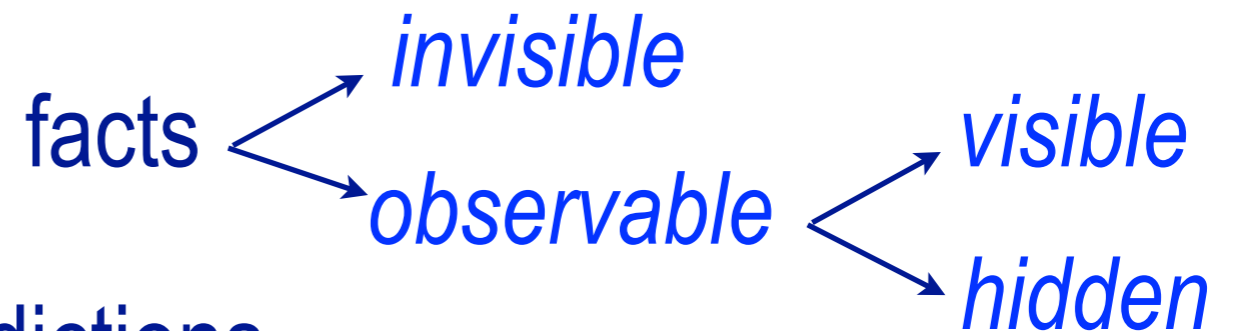
- Limited predictive models and knowledge of the environment
- Cost of minor mistakes and retrials < cost of modeling, information gathering, and deliberation
- ➔ Deliberation remains partial until objectives achieved, including through flexible modification of its plans and retrials
- ➔ While acting: focused perception to refine and monitor actions, react to events, update and repair plans

Simplifying assumptions

▶ *Dynamics of the environment*

- Exogenous events, changes that are expected and/or observed
- Dynamics described with discrete, continuous or hybrid models

▶ *Observability* of the environment



▶ *Uncertainty* in knowledge and predictions

- Abstracting away uncertainty at high level deliberation
- Reasoning with explicit models of uncertainty

▶ *Time* and concurrency

- Discrete transitions
- Handling durations, deadlines, concurrent activity synchronization

▶ *Deterministic models*

- Refinement methods for acting
- Refinement methods for planning

▶ *Temporal models*

- Timelines and temporal refinement methods
- Chronicles for planning and acting

▶ *Nondeterministic models*

- Offline and online nondeterministic planning
- I/O automata and refinement methods for planning and acting