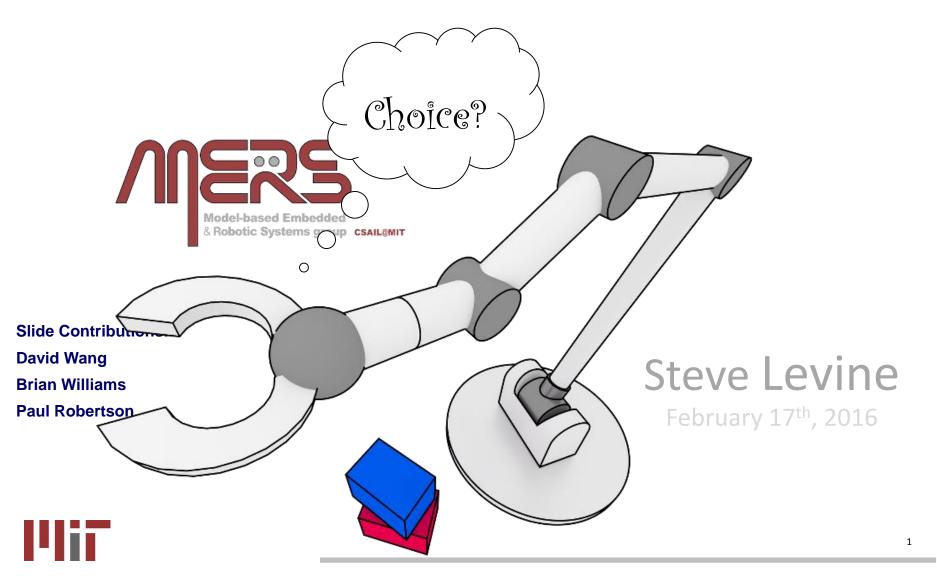
#### Programs with Flexible Time, Choice, and State



# Assignments

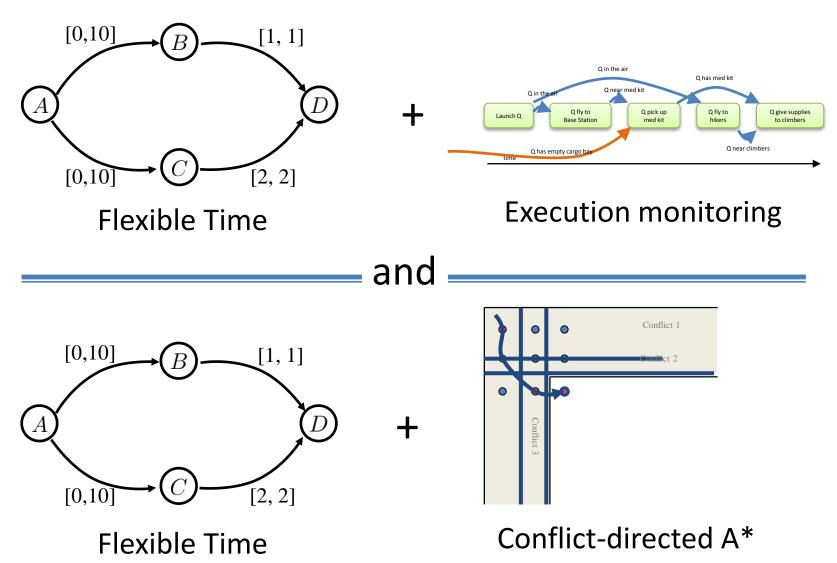
#### Problems Sets:

- Pset 1 due tonight at 11:59pm
- Pset 2 released tonight (Scheduling)
- Backup your work before updating!

#### Interesting references:

• ITC: I-hsiang Shu, Robert Effinger, Brian Williams, Enabling Fast <u>Flexible Planning</u> <u>through Incremental Temporal Reasoning with Conflict Extraction</u>.

### Today: Combining what we've learned



# Outline

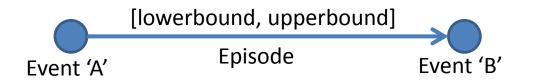
- Flexible time + execution monitoring
  - Extracting causal links
  - Dispatching & monitoring
- Flexible time + conflict-directed A\*
  - Plans with choice
  - Making optimal choices

Adding more flexibility

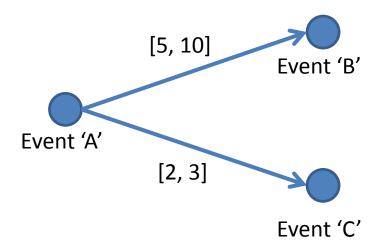
#### **PLANS WITH CHOICE & TIME**

# Simple Temporal Network (STN)

Simple Temporal Network (STN):



*Read: "Event B must occur between lowerbound and upperbound time after A"* 

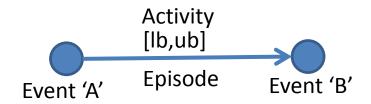


Read: "Event B must occur between 5 and 10 [seconds] after A. AND Event C must occur between 2 and 3 [seconds] after C."

# Temporal Plan Network (TPN)

Temporal Plan Network (TPN) :

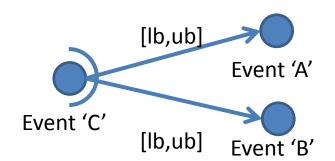
Idea 1: Durative Activities



Read: "Start Activity at Event A and end it at Event B."

Alt: "Activity will take between Ib and ub time to execute."

Idea 2: Decision Events: execute only one outgoing episode

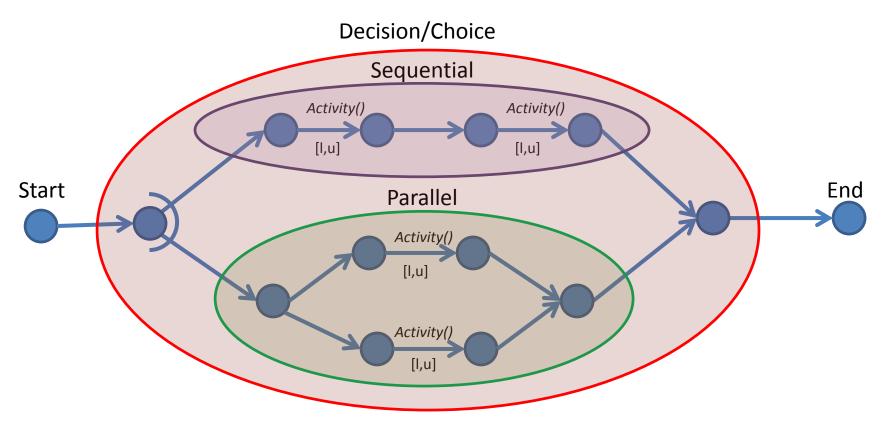


Read: "After Event C, execute either Event A or Event B, depending on which episode has the lowest cost."

## **Temporal Plan Network**

Temporal Plan Network (TPN) :

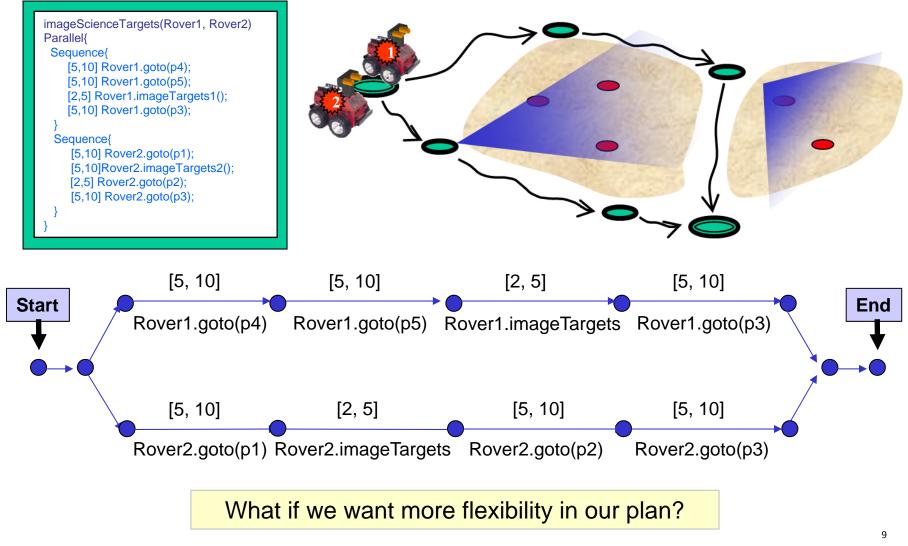
Idea 3: Hierarchical Composition





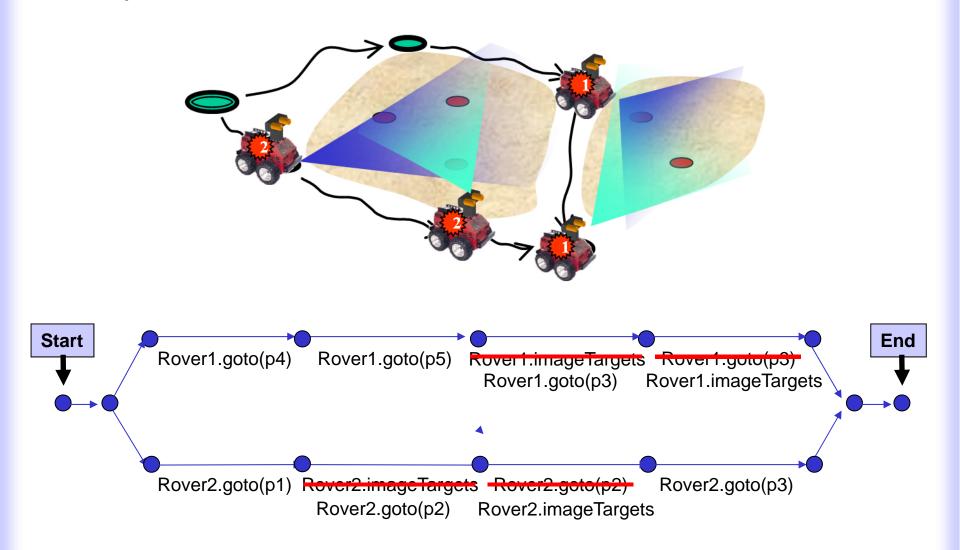
#### Robust Program and Plan Execution

#### **RMPL**

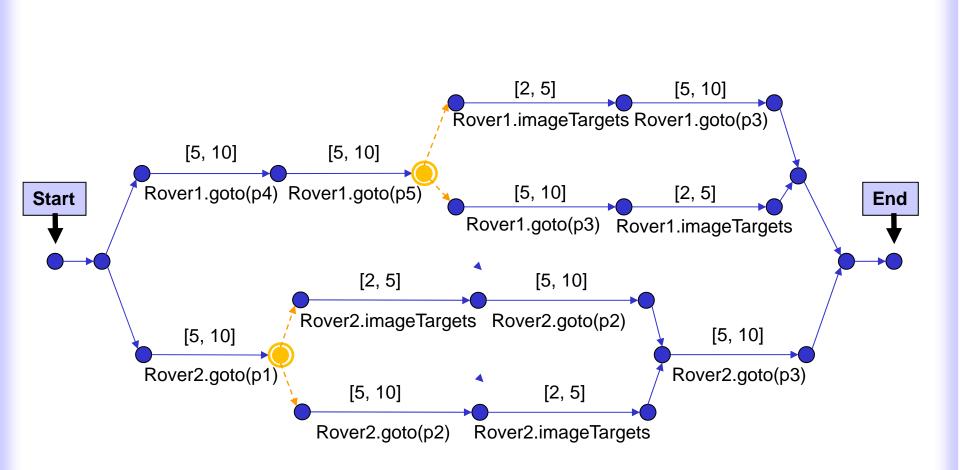




#### A Different Choice

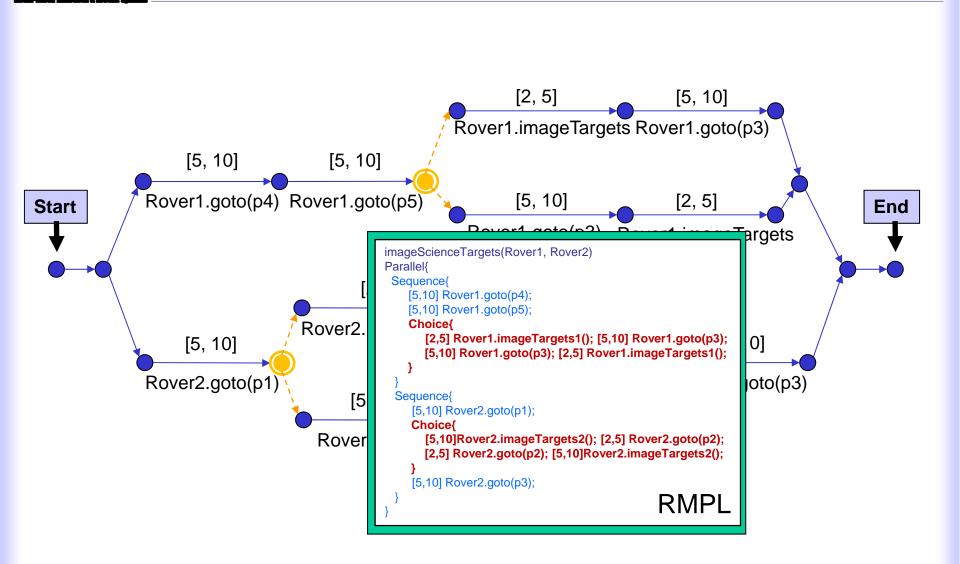


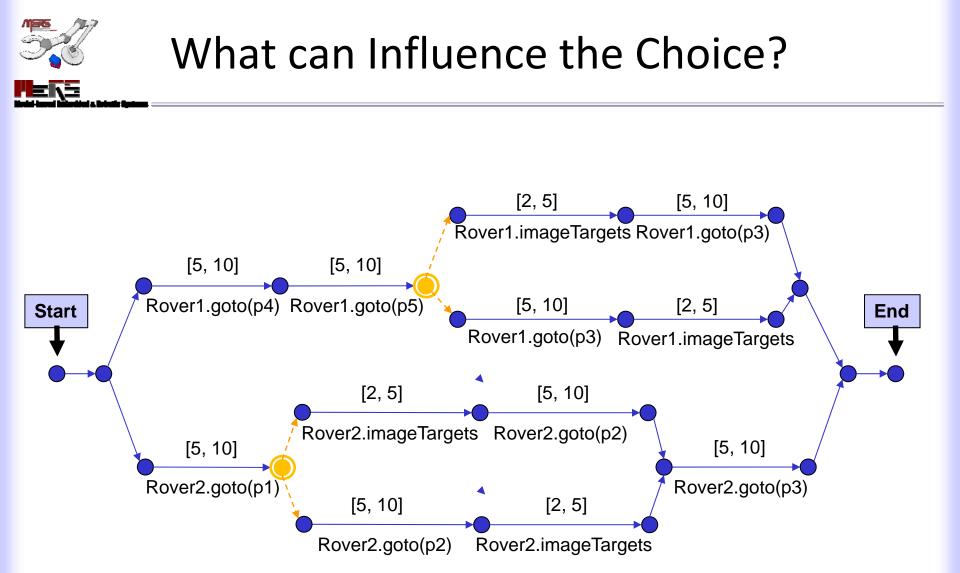
#### A Plan with Choice



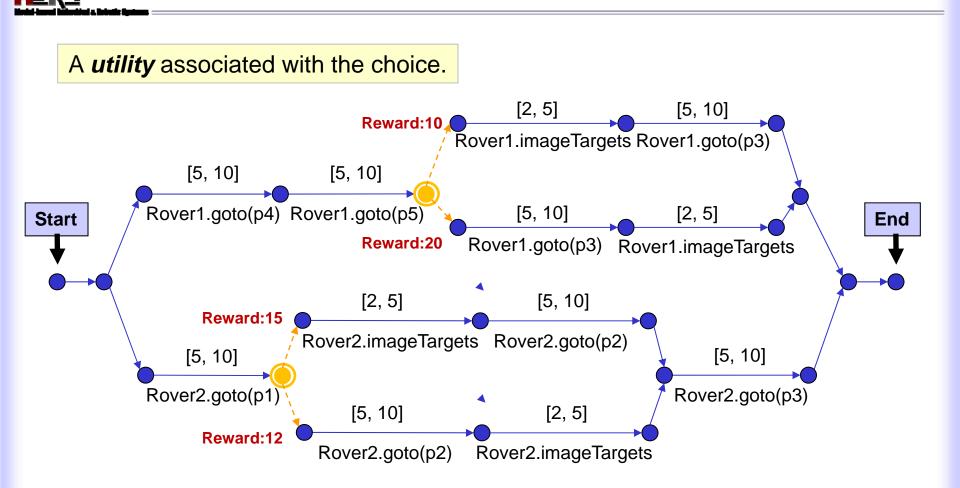
Assume for this plan, that edges without explicit temporal constrains are [0,0].

#### A Plan with Choice

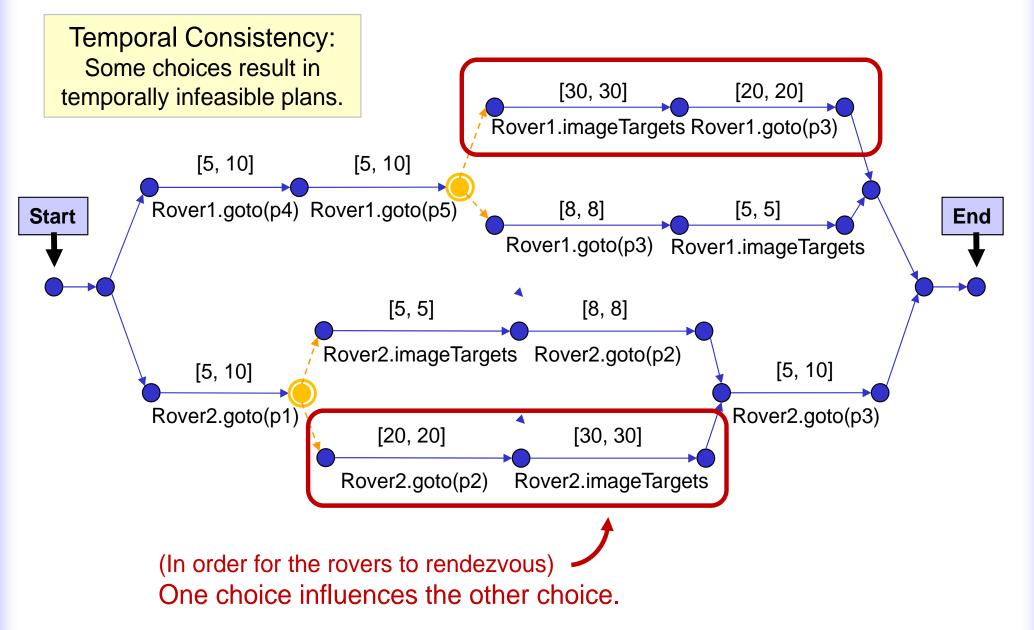




## What can Influence the Choice?





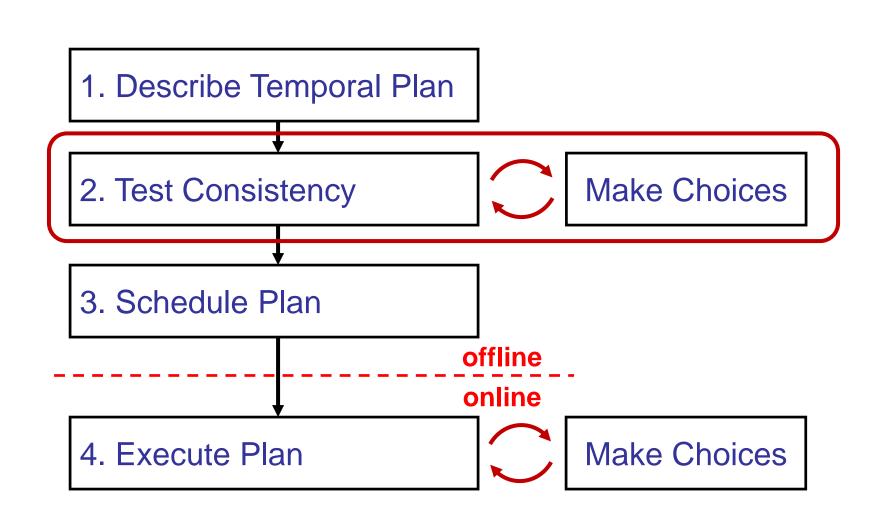


# With choices we can represent...

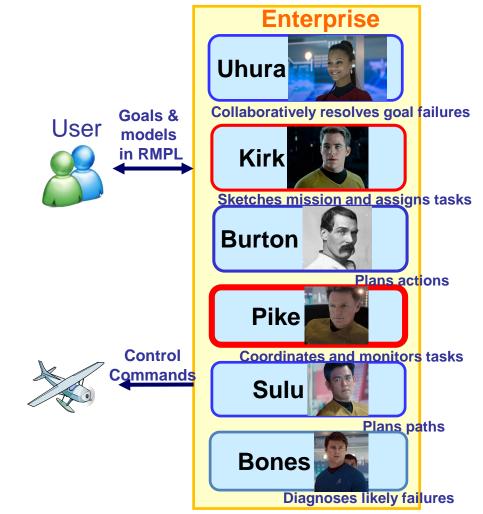
- Alternative ordering of actions
- Alternative methods for competing a task
- Alternative resource assignments
- Alternative task assignments (who does what)



#### When can the Choice be made?



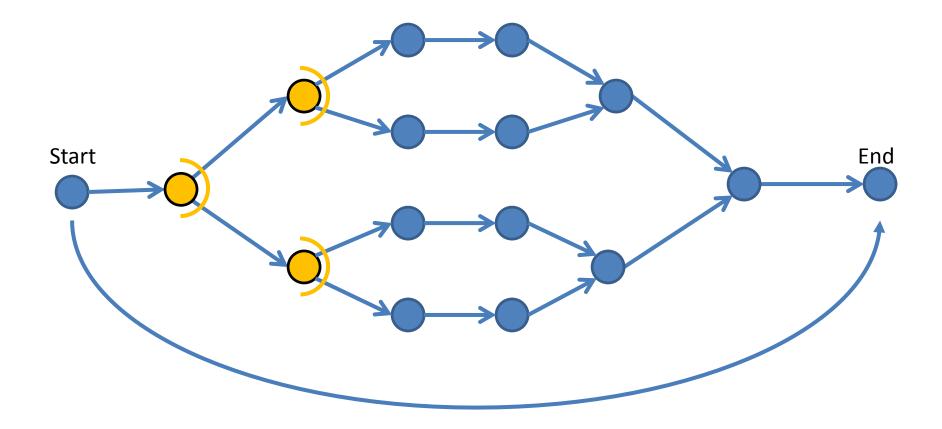
#### A single "cognitive system" language and executive.



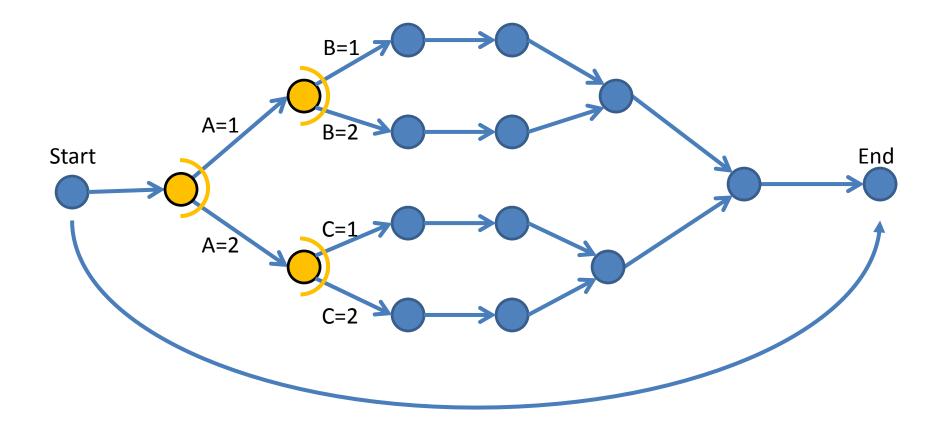
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### Example TPN

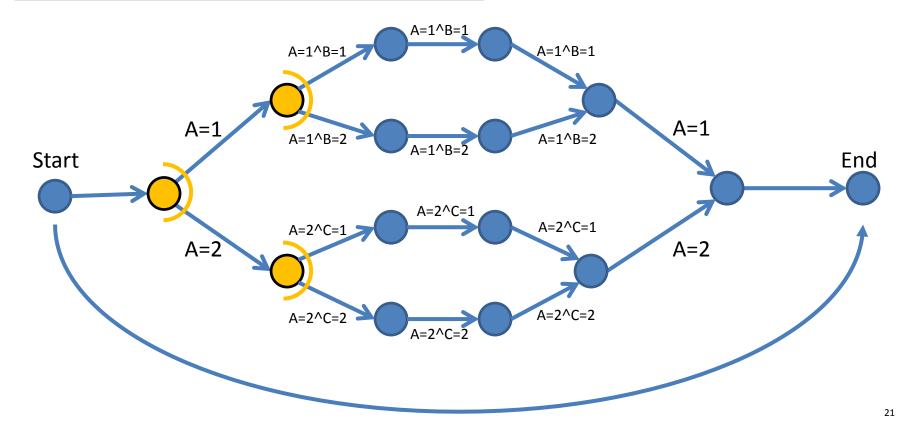


## Choosing as a Constraint Satisfaction Problem



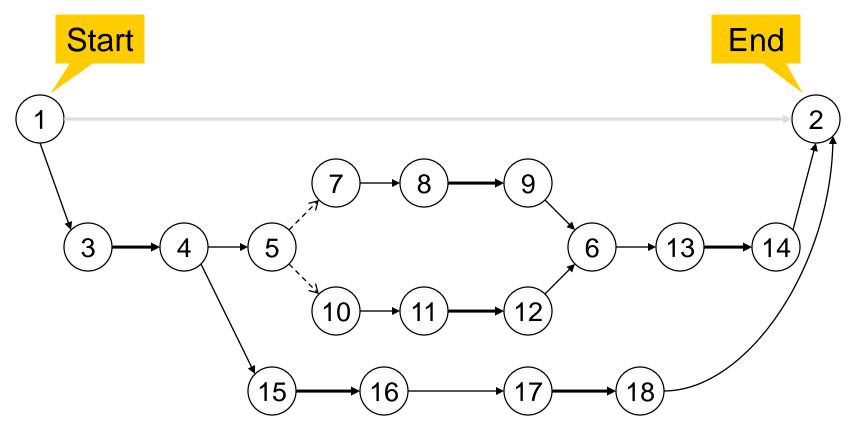
## Choosing as a Constraint Satisfaction Problem

Assign variables A, B, & C such that all of the temporal constraints with true **guards** are temporally consistent.

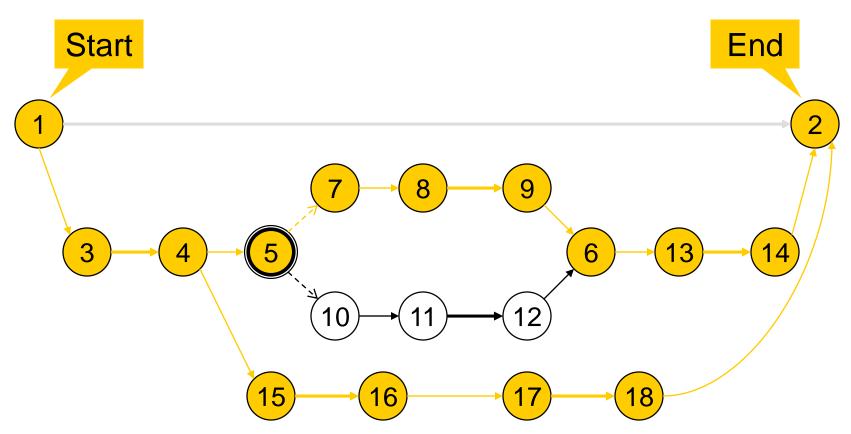


#### Different candidate subplans of TPN

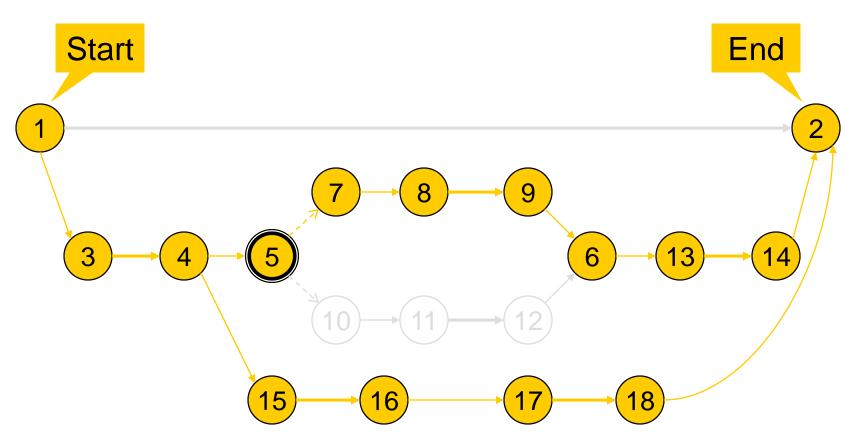
• Find which edges have activated guards



#### Different candidate subplans of TPN

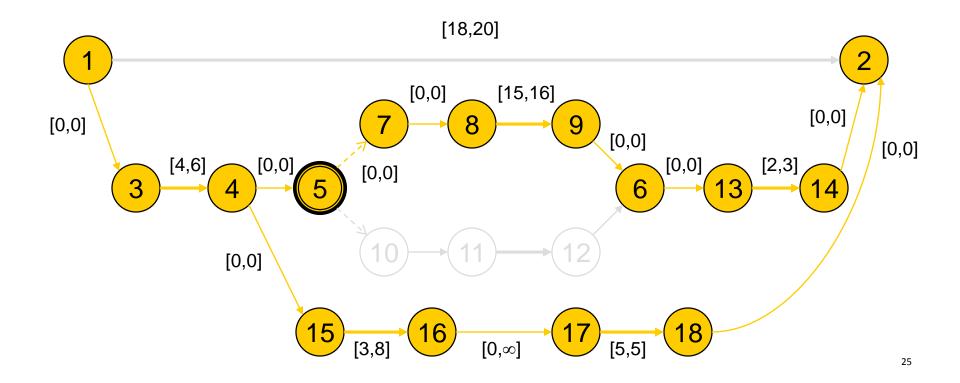


#### **Trace Trajectories**



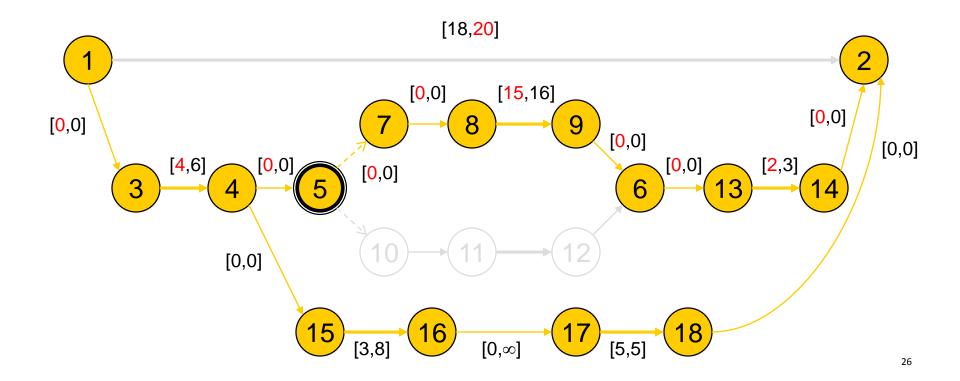
#### **Check Schedulability**

- Don't test consistency at each step.
- ⇒ Only when a path induces a cycle, check for negative cycle in the STN distance graph



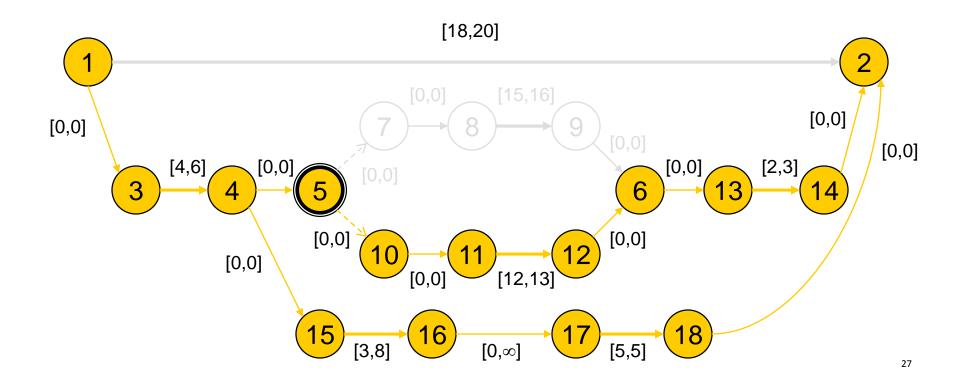
#### **Check Schedulability**

• Example: Inconsistent → Conflict!



#### **Trace Alternative Trajectories**

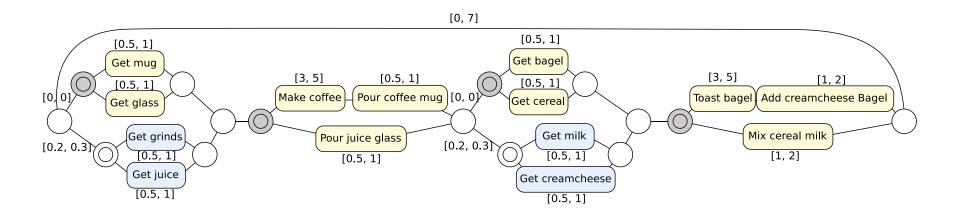
• Complete paths



## Are all choices consistent?

• (Board)

### Another example: Breakfast



# How to get conflicts

• In problem set / polycell:

Conflicts came from DPLL + unit propagation

• Here:

 Conflicts come from negative cycle detection (through ITC – Incremental Temporal Consistency)

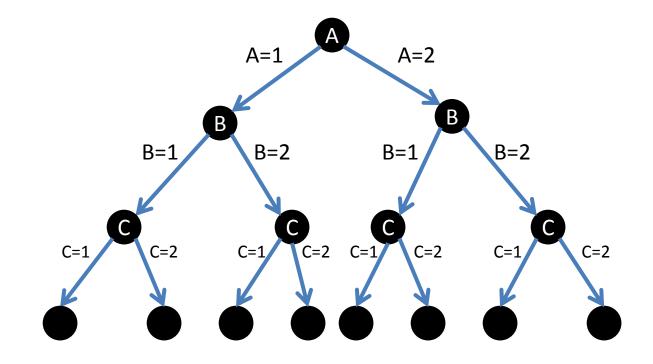
# **ITC** Problem

- Objective: Need to check the Simple Temporal Network (STN) for temporal consistency and return a conflict – under adding / removing / changing constraints
- Observation: The [partial] plan doesn't change that much between checks for temporal consistency.
- Approach: Incrementally check for temporal consistency by maintaining data between calls.

I-hsiang Shu, Robert Effinger, Brian Williams, Enabling Fast <u>Flexible Planning through Incremental</u> <u>Temporal Reasoning with Conflict Extraction</u>.

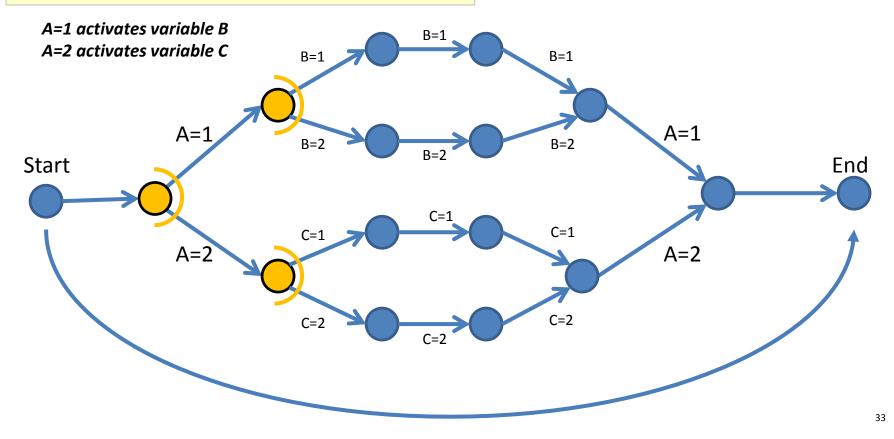
## Choosing as a Constraint Satisfaction Problem

The Corresponding Search Tree:



### Choosing as a Conditional Constraint Satisfaction Problem

Assign *active* variables A, B, & C such that all of the temporal constraints with true guards are temporally consistent.



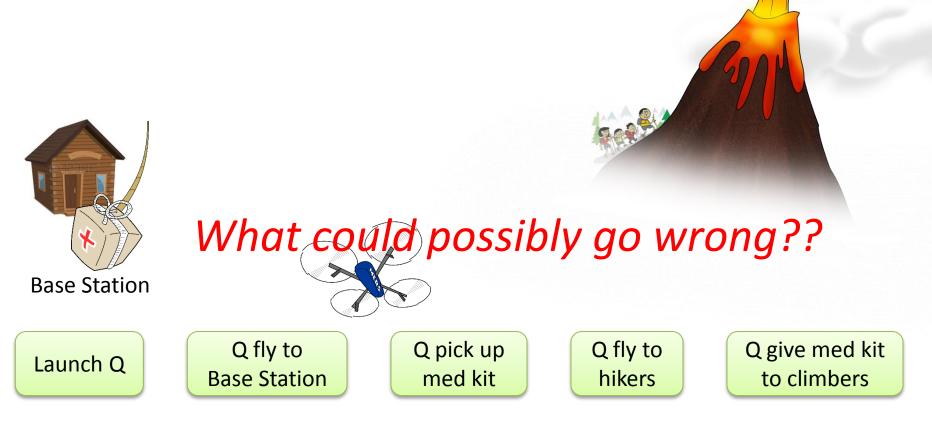
# TPN Planning as conflict-directed search

- Decision variables: choices in TPN
- Utility: choice reward (not probability here)
- Consistency check: temporal consistency

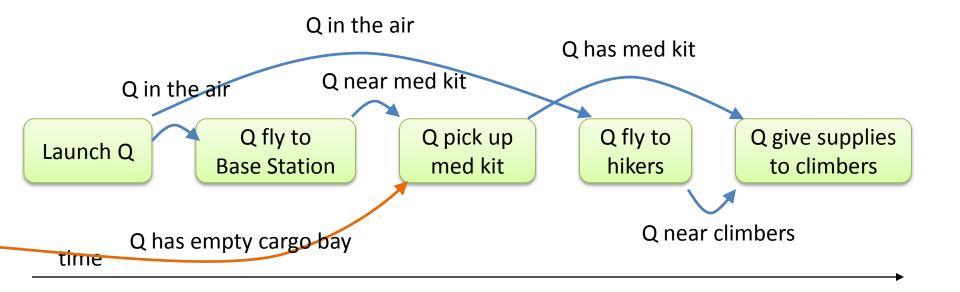
Monitoring plans with time

#### **MONITORING TEMPORAL PLANS**

## Volcano eruption!



### Where do preconditions come from?



## Suppose we have a block-stacking cognitive robot



What sorts of actions might it do?

- Conditions? Effects?

### **Example PDDL temporal action**

(:durative-action pick-up-block

```
:parameters (?r - robot ?t ?b - block)
```

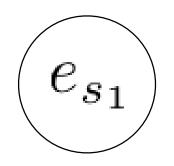
:duration (and (>= ?duration 10) (<= ?duration 30))

```
:condition (and (at start (clear-above ?t))
(at start (empty-gripper ?r))
(over all (can-reach ?r ?t))
(at start (on ?t ?b)))
```

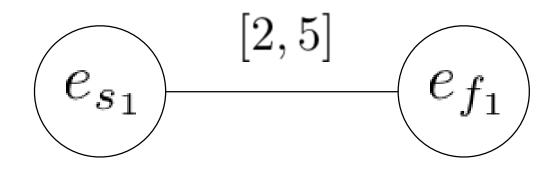
```
:effect (and (at end (not (empty-gripper ?r)))
(at end (not (on ?t ?b)))
(at end (holding ?r ?t))
(at end (clear-above ?b))
(at end (not (clear-above ?t))))
```

#### Temporal plan representation

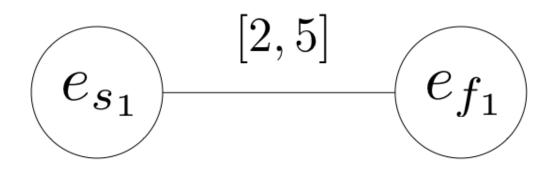
#### Events represent points in time



# Events may be constrained with simple temporal constraints

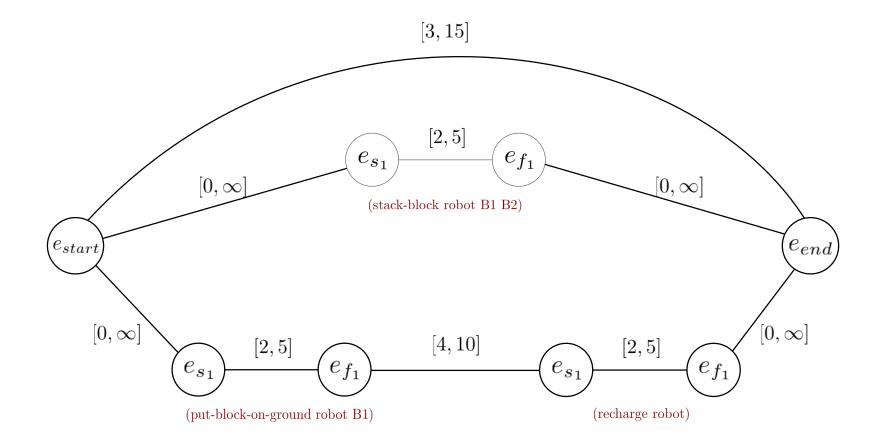


## Actions consist of a start event, end event, and PDDL action

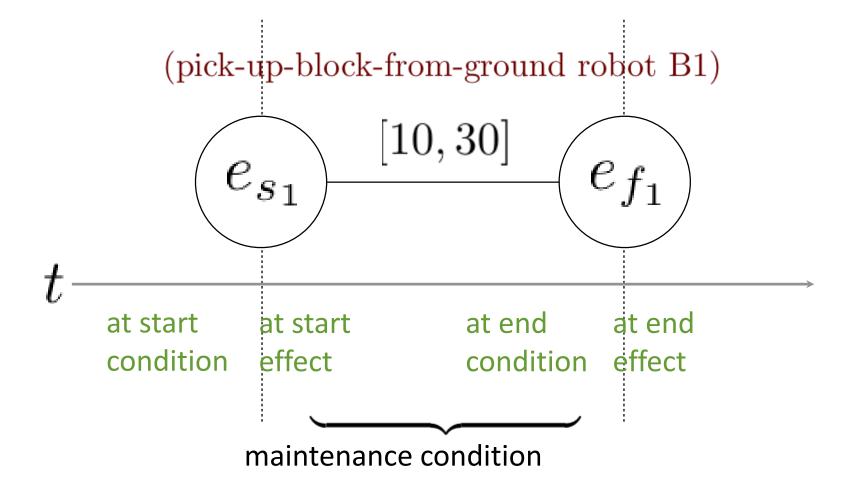


(stack-block robot B1 B2)

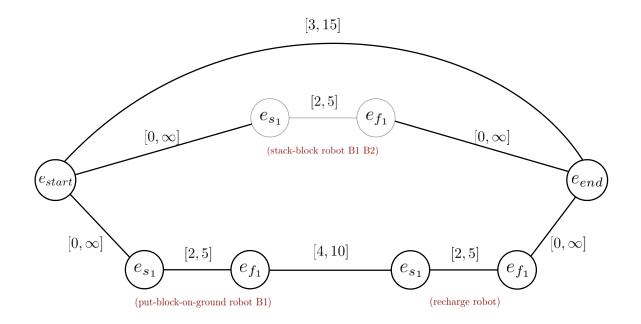
#### Temporal plans consist of actions



# PDDL temporal actions have conditions & effects, at start & end



# Conditions of actions: effects of prior actions, or come from initial conditions



# Pike is a *plan executive:* it executes and monitors temporal plans.

- Events must be scheduled + dispatched to robot hardware
- Temporal disturbances handled
- Conditions for success must be monitored
- Signals a problem immediately if detected



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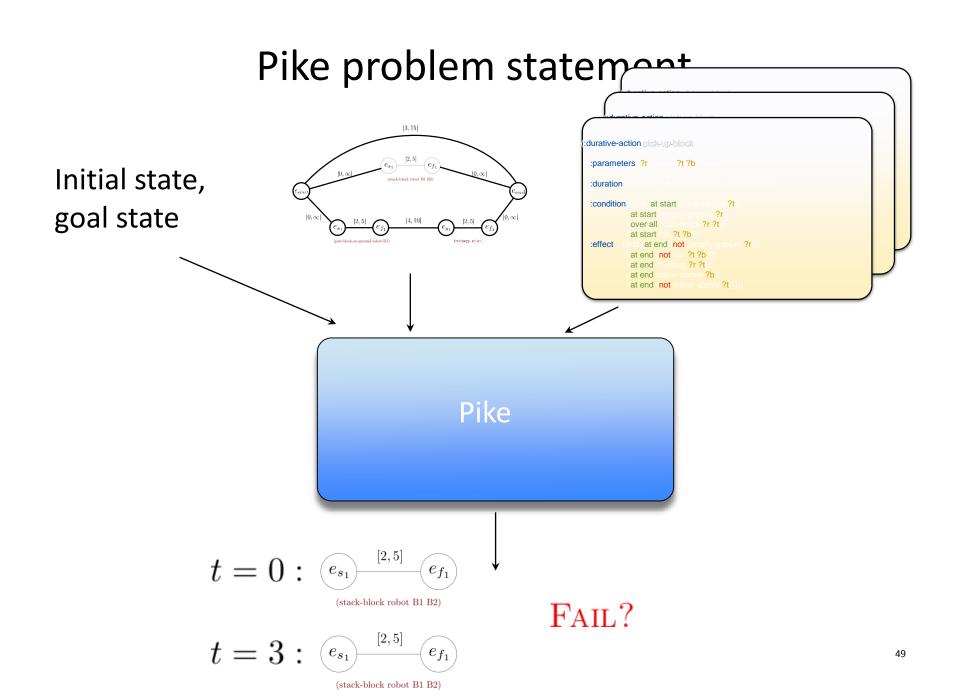
#### Pike problem statement

#### • Input:

- -Temporal plan
- -PDDL operators used in plan
- -Initial state, goal state
- -Stream of state estimates (observations)

#### Output

- -Dispatch of plan activities at appropriate times
- -Signal if a failure is detected



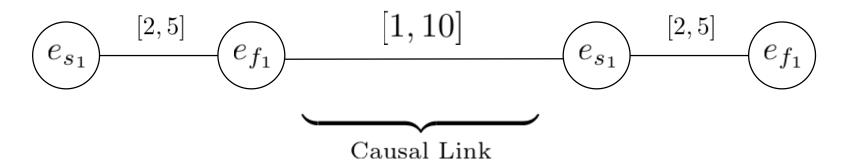
Planner-independence: infer relevant monitor conditions from the plan

- Don't assume monitor conditions are provided by planner
- Approach: infer relevant monitor conditions form plan
  - –Reason over temporal constraints + conditions
  - -Extract *candidate* sets of causal links offline
  - -At runtime, monitor relevant causal links during appropriate time interval.

#### Example of a causal link in temporal plan

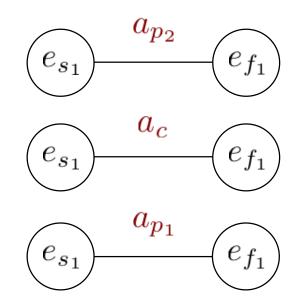
(pick-up-block-from-ground robot B1)

(stack-block robot B1 B2)



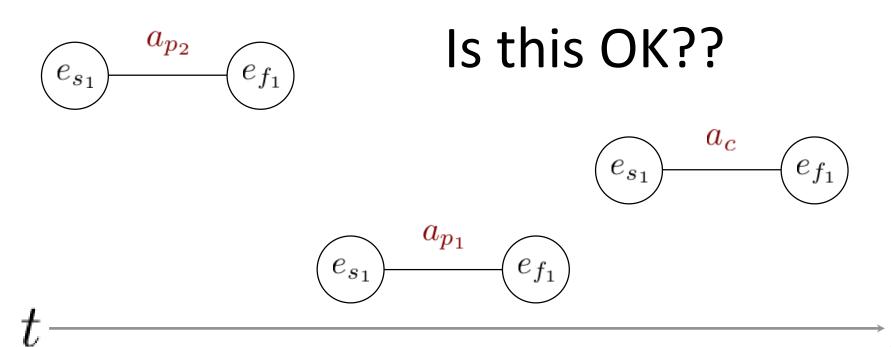
#### Causal links can be threatened.

 Suppose that a<sub>p1</sub>produces p, a<sub>p2</sub> produces ¬p, and a<sub>c</sub> requires p as a condition.



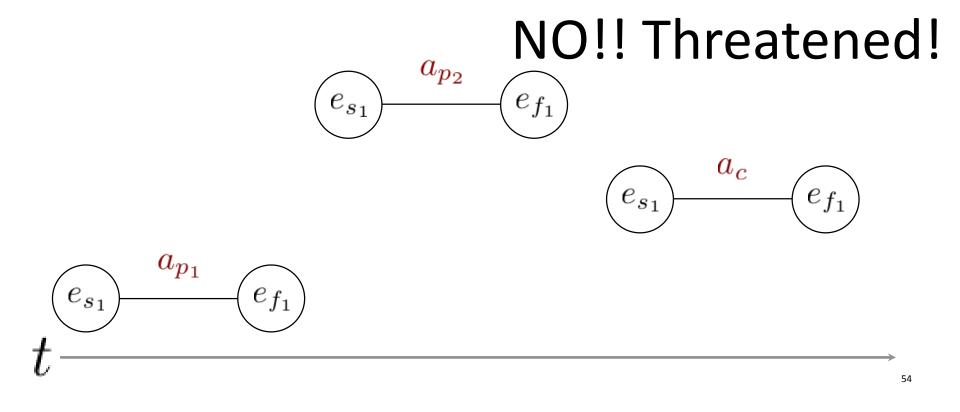
### Causal links can be threatened.

 Suppose that a<sub>p1</sub> produces p, a<sub>p2</sub> produces¬p, and a<sub>c</sub> requires p as a condition.



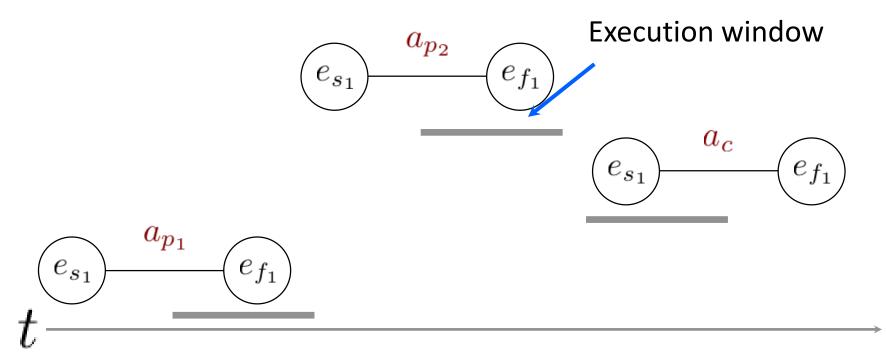
### What about this?

 Suppose that a<sub>p1</sub> produces p , a<sub>p2</sub> produces ¬p, and a<sub>c</sub> requires p as a condition.



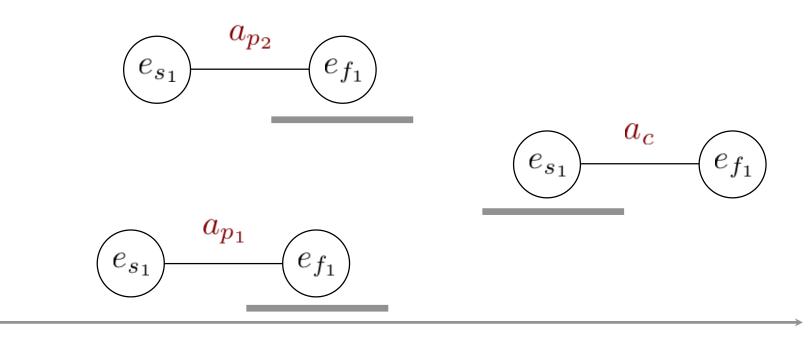
### Causal links can dominate each other.

• Now, suppose that  $a_{p_1}$  and  $a_{p_2}$  both produce p, and that  $a_c$  requires p as a condition.



However, this domination cannot always be determined before execution.

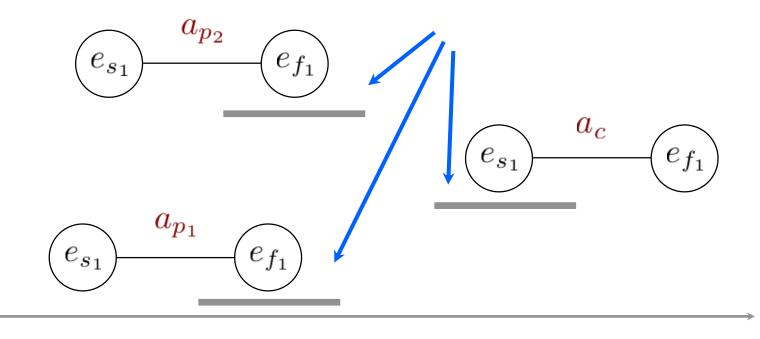
• Now, suppose that  $a_{p_1}$  and  $a_{p_2}$  both produce p and that  $a_c$  requires p as a condition.



# But how can we determine these possible execution windows?

• We use an APSP, and examine values with respect to

 $e_{start}$ 



# Algorithmic approach for execution monitoring of temporally-flexible plans

- (Offline) Extract *candidate* sets of causal links for each consumer, consisting of sets of all mutually nondominating possible causal links
- (Online) Monitor the order of event execution, and activate one causal link from each candidate set - the "latest" one
- (Online) Continuously check state estimates against all currently-activated causal links

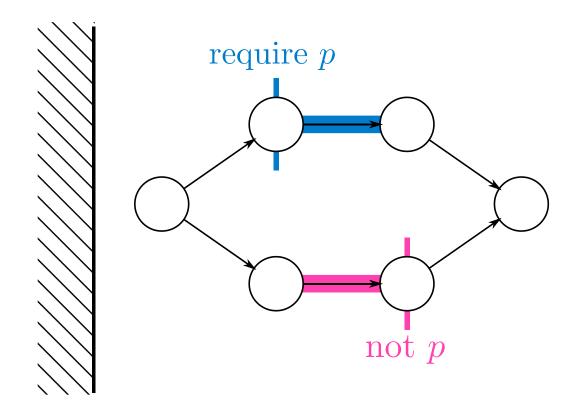
### Causal link extraction rough pseudo code (certain details omitted)

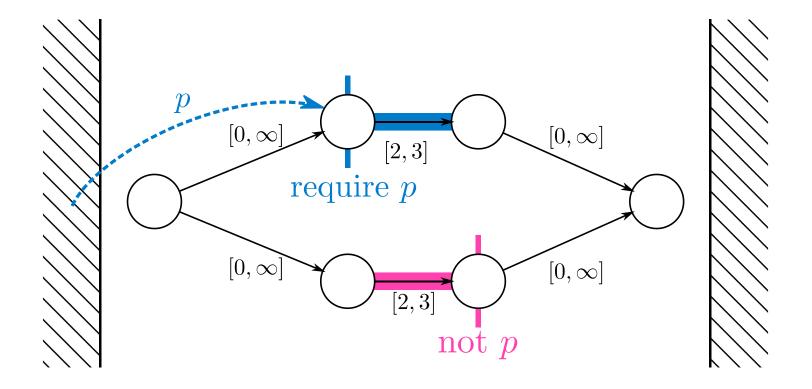
- For each consuming event and precondition *p*:
  - Loop over all events and generate set of all mutually incomparable events affecting *p* that precede consuming event
  - If any events in this set produce  $\neg p$  then FAIL
  - Create a new monitor condition for each event in the set

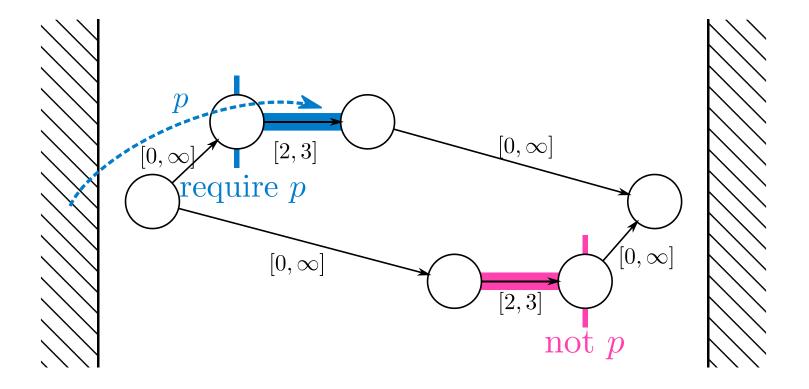
# Online causal link monitoring (rough pseudo code)

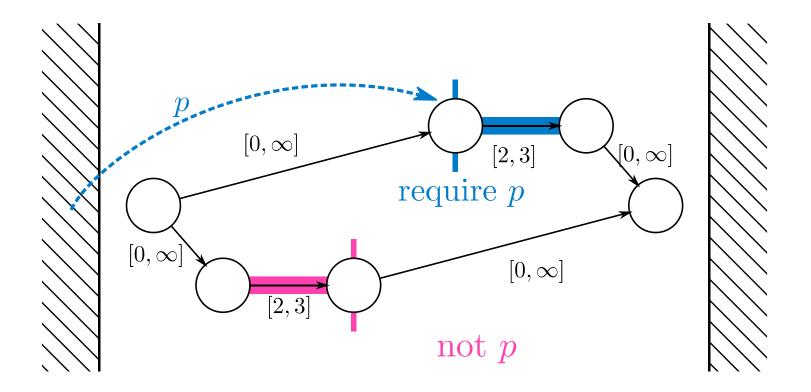
#### • While TRUE:

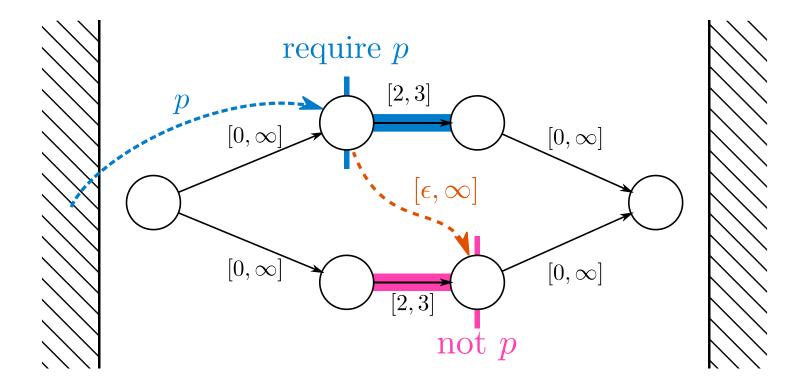
- Receive current state estimates (from sensors)
- Check if all activated monitor conditions contained current state, else SIGNAL FAIL
- Upon dispatching an event, deactivate monitor conditions with event as consuming event. Activate monitor conditions for which no more possible candidates in set remain.

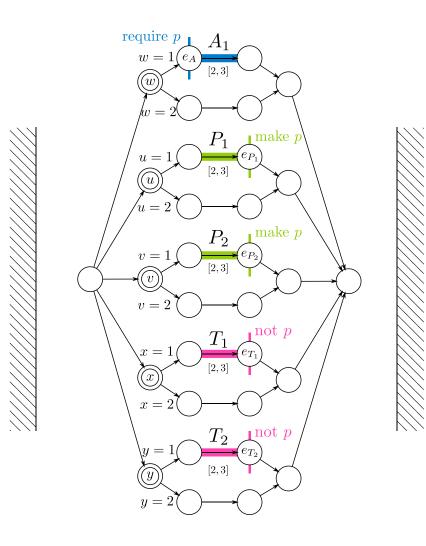












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