

Uncertainty in the World

- The goal of planning is *to execute* the plans generated!
- Planning models the world - actions, predicates, objects, choices for plan generation
- Sources of uncertainty
 - State may be unknown
 - Exact effects of actions may be unknown
 - External events may change the world

Replanning and Conditional Planning

Replanner: “*Why are you taking an umbrella? It’s not raining!*”

Replanners can’t find plans that require them to have steps *before* the contingency.

Conditional Planner: “*Why are you leaving the house? The class might be cancelled, there may be an earthquake, you may have won the pools....*”

Conditional Planners need to consider every contingency in a plan.

Conditional Planning

Manuela Veloso
CMU 15-381, Fall 2001

- Conditional actions
- Conditional planning algorithm
- Planning and execution

Handling Uncertainty

• Replanning:

1. Assume model is correct and plan
2. **Wait** for eventual execution failures
3. React to failures - Plan again

• Conditional planning:

1. Add/represent observable contingencies
2. Create a *branching plan* for contingencies
3. Observe and execute appropriate branch

- **Probabilistic planning:** Plan for the *most probable* contingencies.

The Flat Tire Operators

Operator REMOVE (x)
p: On (x)

a: Off (x) and
ClearHub (x)
d: On (x)

Operator PUT-ON (x)
p: Off (x) and
ClearHub (x)
a: On (x)

d: ClearHub (x) and
Off (x)

Operator INFLATE (x)
p: Intact (x) and
Flat (x)
a: Inflated (x)
d: Flat (x)

A Flat Tire Problem

- Initial state:
 - On (Tire1) Flat (Tire1),
 - Inflated (Spare), Intact (Spare), and Off (Spare)
- Goal:
 - On (x) and Inflated (x)
- Plan:
 - Remove(Tire1), Put-On (Spare)

Possible Contingencies

- The tire may just not be inflated.
- We would like a plan:
 - If Intact (Tire1) Then Inflate (Tire1)
 - Else Remove (Tire1) and Put-On (Spare)
- Mark precondition Intact as *unknown* and check.
- Three-valued logic: True, False, Unknown.

The Flat Tire Operators

Operator REMOVE (x)
p: On (x)

a: Off (x) and
ClearHub (x)
d: On (x)

Operator PUT-ON (x)
p: Off (x) and
ClearHub (x)
a: On (x)

d: ClearHub (x) and
Off (x)

Operator INFLATE (x)
p: UNK (Intact (x))
Flat (x)
a: Inflated (x)
d: Flat (x)

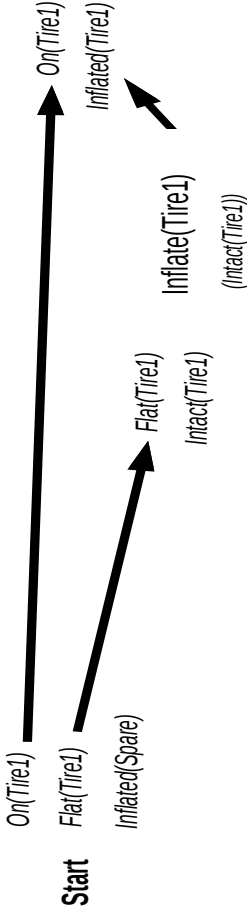
Operator CHECKTIRE (x)
p: Tire (x)

a: KnowsWhether
(Intact (x))

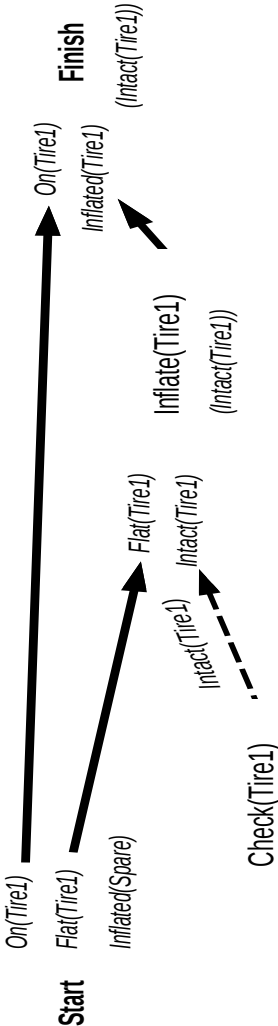
Initial Plan



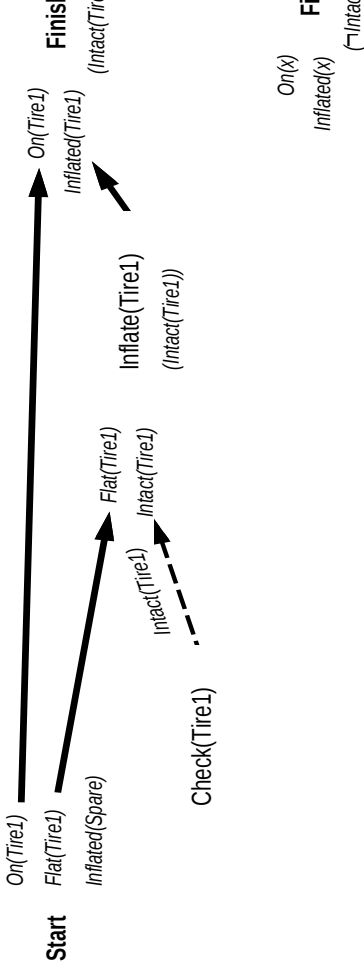
After adding the Inflate step



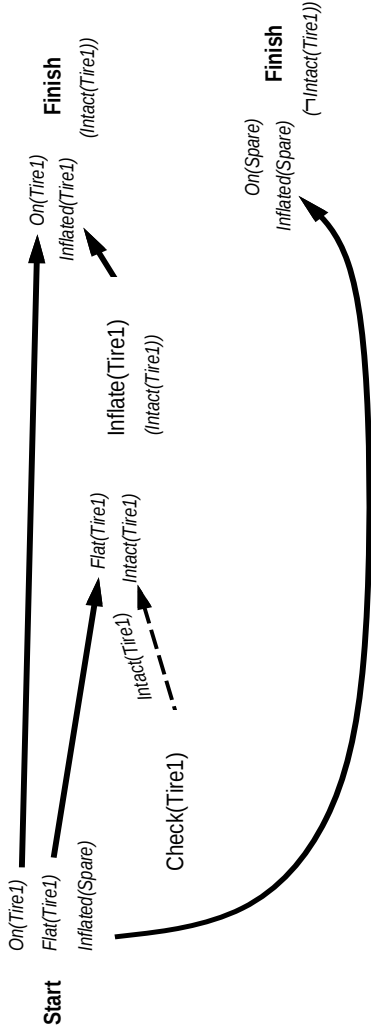
Adding Conditional Link



Set the New Branching Goal



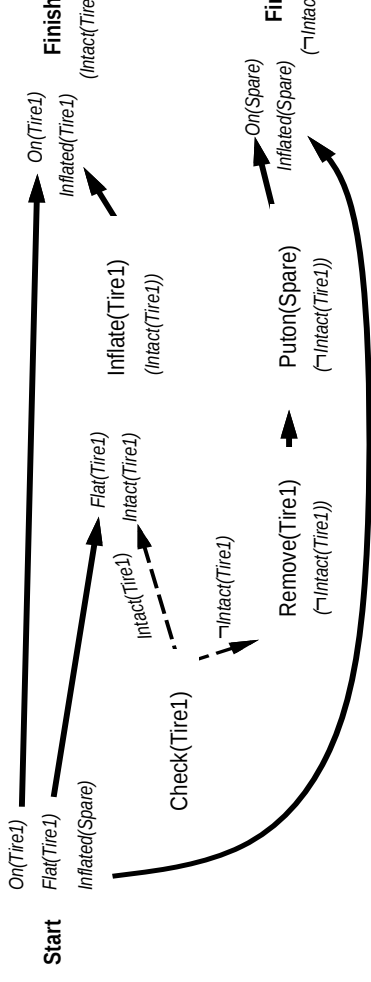
Plan for New Branch



Extensions to Partial-Order Planning

- Parameterized plans
- Threat resolution
 - Conditioning: can remove threat by separating contexts (branches)
- See CPOP - Conditional Partial-Order Planning
- Page 399 of textbook - Chapter 13

Complete Conditional Plan



Probabilistic Planning

Planning example: logistics domain

- Objects are *packages, trucks, places, lockers*.
- Operators are *drive, load, unload, store, unstore*.
- *load* has uncertain outcomes.
- One event: *lose-package-from-post-office*.

Probabilistic Uncertainty - State

Simple approach: just list possible initial states with their probabilities.

0.4 (at truck1 boston)
(at package pittsburgh)
(at airplane glasgow)

0.4 (at truck1 boston)
(at package pittsburgh)
(at airplane london)

0.2 (at truck1 boston)
(at package philadelphia)
(at airplane london)

Probabilistic Uncertainty - External Events

Jim Blythe, Weaver.

```
(Event
lose-package-from-post-office
(params <package> <post-office>)
(probability 0.05)
(preconds
((<package> Object)
(<post-office> Post-office))
(and (~ (protected <package>))
(at-obj <package> <post-office>)))
(effects
()
((del (at-obj <package> <post-office>))
(add (lost <package>)))))
```

Similar to operators, but not controlled by the planner.

Probabilistic Uncertainty - Actions

Just like the initial state: list possible sets of effects:

```
(OPERATOR LOAD-TRUCK
(preconds
((<obj> OBJECT)
(<truck> TRUCK)
(<loc> LOCATION))
(and (at-obj <obj> <loc>)
(at-truck <truck> <loc>)))
(p-effects
((0.7 ()
((add (inside-truck <obj> <truck> <truck>))
(del (at-obj <obj> <loc>))))
(0.25 ()
nil)
(0.05 ()
((add (lost <obj>))
(del (at-obj <obj> <loc>))))))
```

Example

Initial state:

```
(at-obj package1 pgh-po)
(at-taxi pgh-taxi pgh-airport)
(loc-at pgh-locker pgh-po)
(have-key pgh-locker)
```

Goal state: (at-obj package1 pgh-airport)

Simple plan: drive to post office, get the package, drive back to the airport, unload the package.

Weaver - Blythe 95; Probabilistic Planning

- Builds an initial plan *ignoring* uncertainty.
 - Uses a Bayesian network both:
 1. to evaluate the plan's probability of succeeding
 2. to find parts of the plan that need to be improved.
 - Two new plan refinements to improve the plan:
 1. conditional planning (but now uncertainty is not just from the initial state).
 2. “protection” of conditions to defeat bad events and steps.
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Summary

- Planning domains very often have uncertainty.
 - Re-planning and conditional planning are two extreme ways to cope with uncertainty.
 - Conditional planning creates a branching plan for contingencies. *You need to know the conditional planning procedure - chapter 13.*
 - Probabilistic planning is in the middle ground.
 - We will see probabilistic planning in more detail after we study probabilistic representations and Bayesian networks.
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