

# Computing Opportunities to Augment Plans for Novel Replanning during Execution

## Daniel Borrajo<sup>1</sup> and Manuela Veloso<sup>2</sup>

J.P.Morgan AI Research
JPMORGAN CHASE & CO.

#### **Motivation**

#### Planning:

- takes domain and problem and generates plan ("executable" actions)
- does not consider static facts not present in initial state

## **Execution/monitoring:**

- checks if preconditions hold in state
- otherwise, replans if failure

## Contributions of this paper

- Introduction and computation of opportunities
- Execution monitoring including opportunities
- Replanning when opportunities are detected

## **Opportunities**

- Static facts
- Not true in initial state
- Preconditions of not-considered actions
- If they became true during execution, they could yield to a better plan

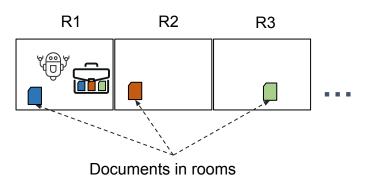
#### **Documents domain**

Goal: Collect a set of documents

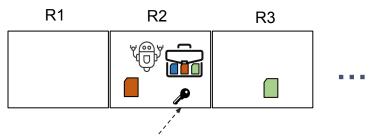
#### Initial state:

- . Documents are inside the briefcase
- . The briefcase is locked, and there is no key
- . Documents are also spread through multiple rooms

Plan: grab documents and move across rooms



## **Opportunity arises**



## Briefcase key found!

Replanning – resulting shorter plan: no need to visit all other rooms

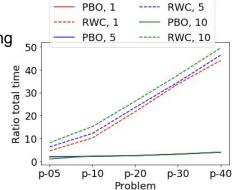
## Algorithm for computing opportunities

- Start from the end of plan
- Compute goal regression
- For each literal E that is in goal regression so far
  - For each static precondition P of an action not in plan that achieves E
    - If P not in I, define P as an opportunity
- Update goal regression
- · Repeat until start of plan

## **Experiments. Time fixed schedule**

(opportunity appears at times 1, 5, 10)

Ratio total planning time vs initial planning time



PBO: Plan Based Opportunities RWC: Replan When Change

#### Results

- Improved overall planning time with respect to replanning when any change perceived
- Improved cost of plans with respect to no replanning
- Focused perception

<sup>&</sup>lt;sup>1</sup> Consultant, On leave Professor, Universidad Carlos III de Madrid

<sup>&</sup>lt;sup>2</sup> Herbert A. Simon University Professor Emeritus, Carnegie Mellon University