



Partial Satisfaction Planning

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Yochan Research Group



Plan-Yochan

- **Automated Planning**

- Foundational work in classical planning
- Heuristics for scaling up a wide spectrum of plan synthesis problems
- Applications to manufacturing, biological pathway discovery, web services, autonomic computing

B. Srivastava; IBM IRL

M. Do; Xerox PARC

T. Zimmerman; CMU RI

R. Sanchez; USC/ISI

Recent
Alumni

Db-Yochan

- **Information Integration**

- Mediator frameworks that are adaptive to the sources and users.
- Applications to Bio-informatics, Archaeological informatics

Z. Nie; Microsoft Research

T. Hernandez; Amazon

U. Nambiar; SDSC/UC Davis

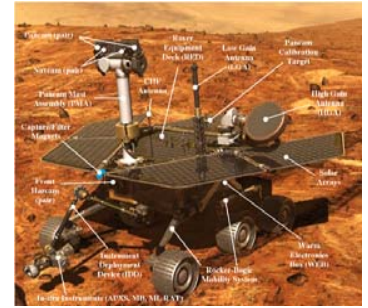
In many real world planning tasks, the agent often has more goals than it has resources to accomplish.

Currently *humans* are forced to pick goal subsets

Example: Rover Mission Planning (MER)

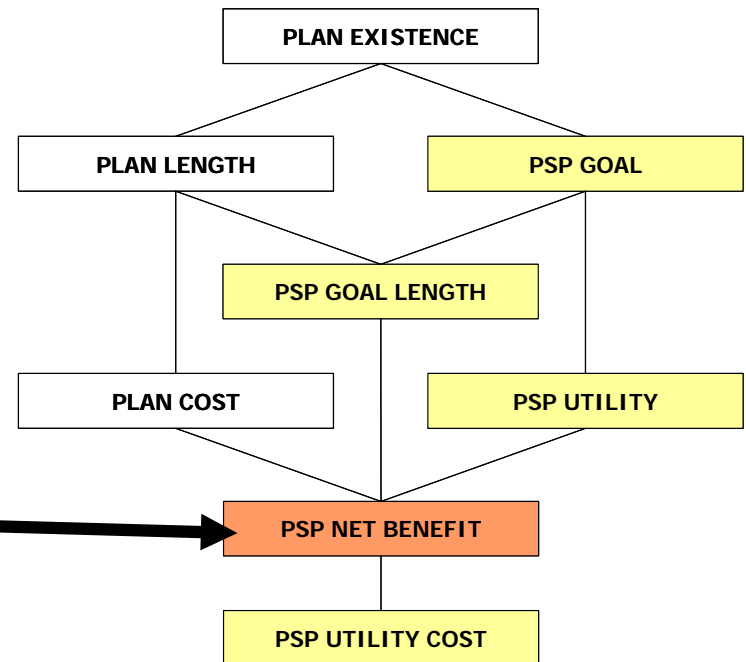
Military logistics

Most replanning problems (*)



Need automated support for
Over-subscription/Partial Satisfaction
Planning

Actions have execution costs, goals have utilities, and the objective is to find the plan that has the highest net benefit.



A spectrum of approaches for PSP-Net Benefit

Optimal Approaches

- **Deterministic MDPs**
 - Reward of a state is equal to the utility of the goals that hold in it.
 - Need to avoid collecting rewards for a goal more than once
 - Optimal, but *SLOW*
- **Optiplan**
 - Integer programming based STRIPS planner
 - Optimal for a given plan length

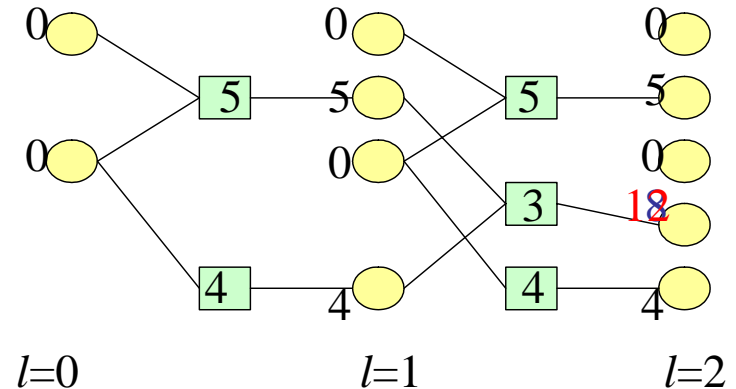
Heuristic Approaches

- **AltAlt^{ps}/AltAwlt^{ps}**
 - Selects the “objectives” up front heuristically
 - Uses a clever modification of relaxed plan heuristic
 - Not optimal, but fast
- **Sapa^{ps}/Sapa^{Mps}**
 - Models PSP as heuristic search. Can be optimal given admissible heuristics.
 - Sapa^{Mps} can handle numerical goals and degrees of satisfaction

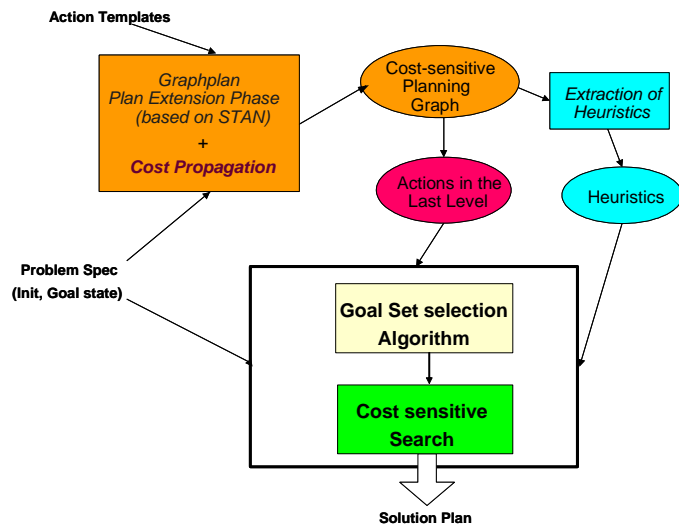
Adapting PG heuristics for PSP

Challenges:

- Need to propagate costs on the planning graph
- The exact set of goals are not clear
 - Interactions between goals
 - Obvious approach of considering all 2^n goal subsets is *infeasible*

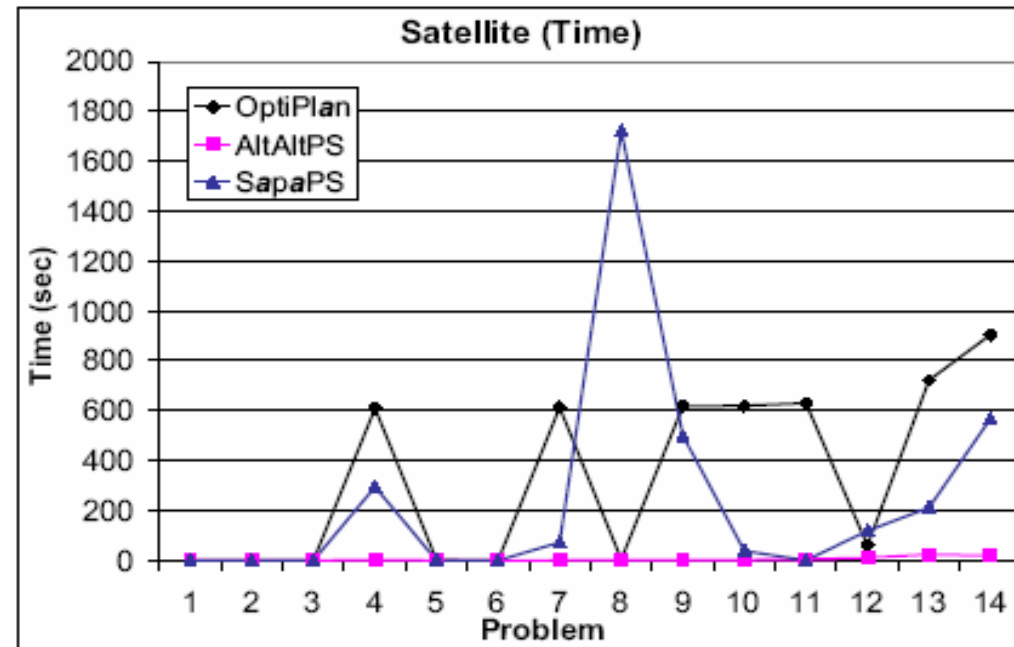
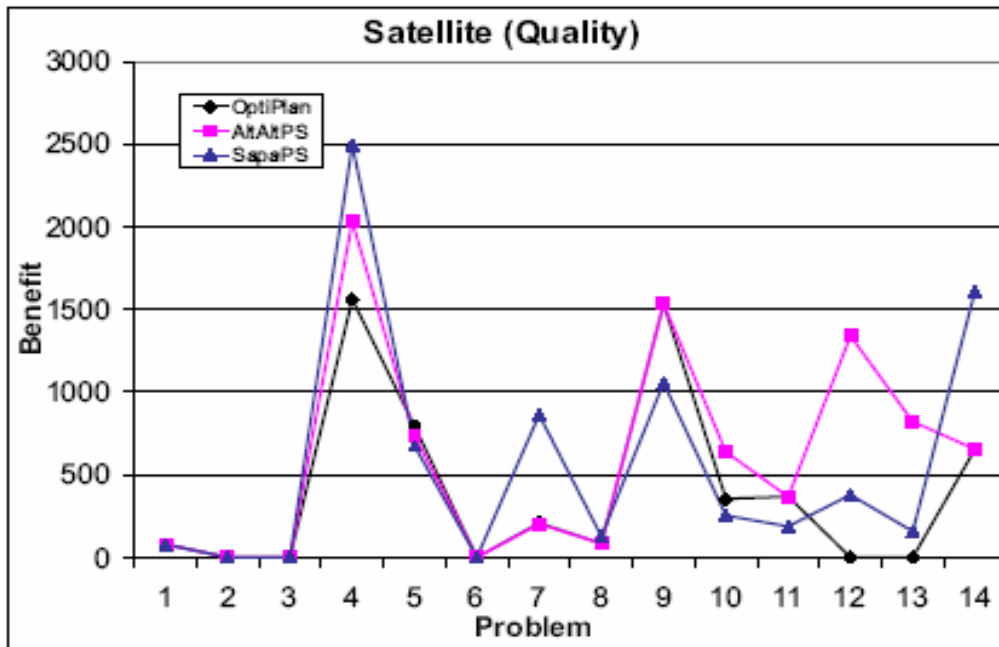


- Idea:** Select a subset of the top level goals upfront
- Challenge:** Goal interactions



- Approach: Estimate the net benefit of each goal in terms of its utility minus the cost of its relaxed plan
 - Bias the relaxed plan extraction to (re)use the actions already chosen for other goals

Some Empirical Results for AltAlt^{ps}



Exact algorithms based on MDPs don't scale at all

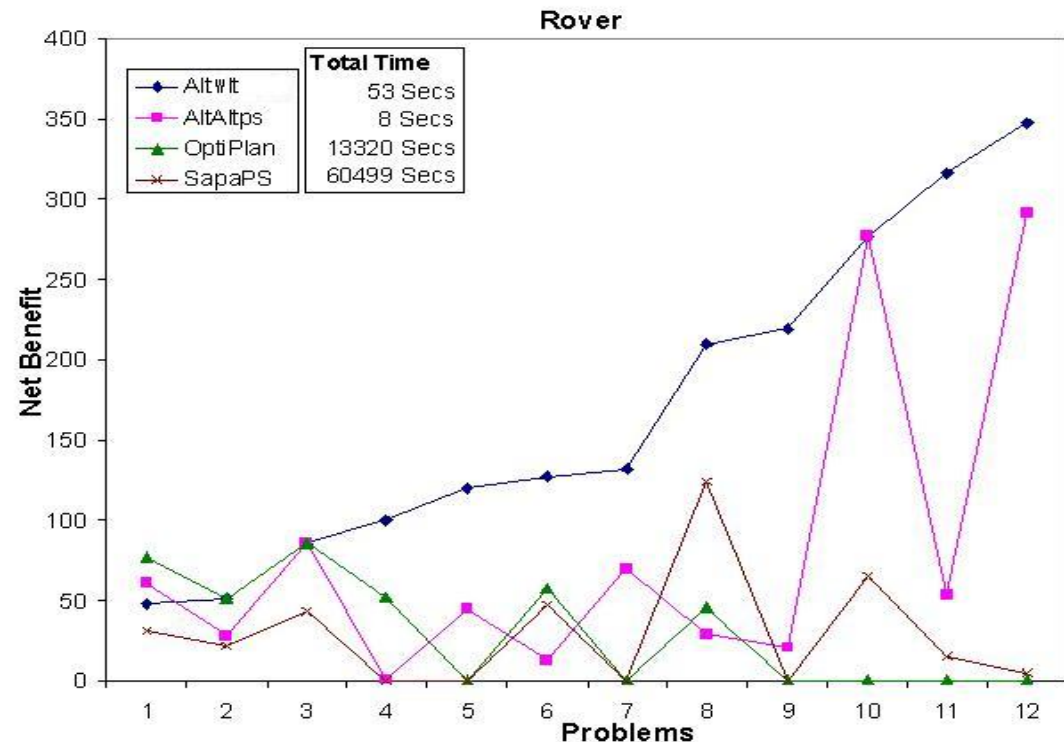
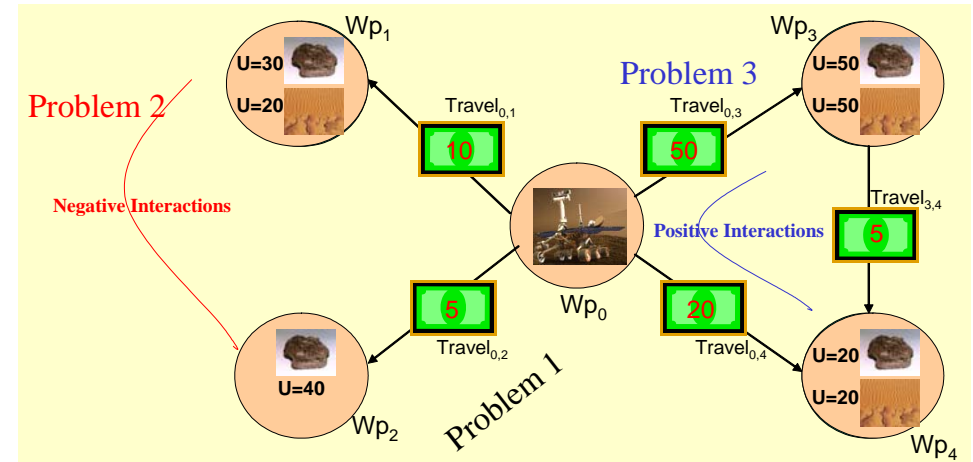
[AAAI 2004]

- **Problems with Goal Selection Procedure**

1. Ignores group interactions
2. Ignores negative interactions

- **Ideas:**

1. Consider multiple groups of sub-goals during the selection process
2. Add penalty costs for ignoring negative interactions based on mutex analysis



PSP+MTP=SAPA^{Mps}

- In MTP, PSP will involve
 - Partial Degree of satisfaction
 - If you can't give me 1000\$, give me half at least
 - Need to track costs for various intervals of a numeric quantity ☹
 - Delayed Satisfaction
 - If you submit the homework past the deadline, you will get penalty points

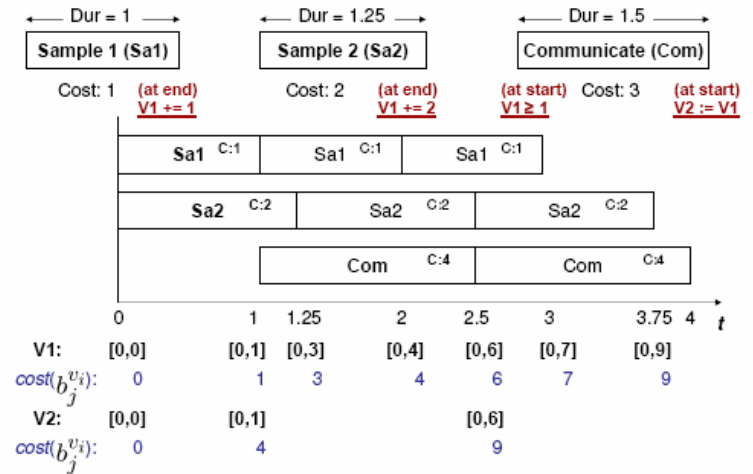


Figure 3: The RTPG for our example. Our actions are defined above it.

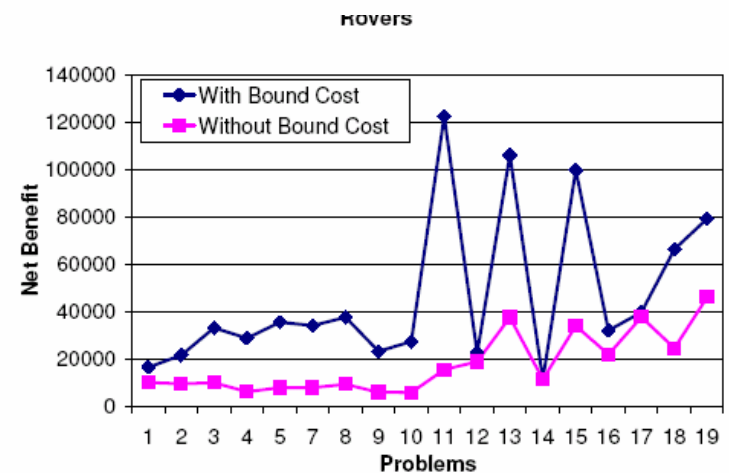


Figure 4: Comparison of utilities for our rovers domain