# Research Review Sashank Santhanam

### An overview of recent algorithms for Al planning

Abstract - An overview of the techniques and recent developments in the field of planning systems.

#### <u>Introduction</u>

GRAPHPLAN algorithm changed the way planning in AI field was done [2] and before the introduction of this, planning focussed on non linear and partial order planning [1]. Once GRAPHPLAN algorithm was introduced, there was an influx of algorithms which improved the performance, specifically the algorithm designed by Kautz and Selman. In this report we show three of the advancements in the field of AI planning.

#### <u>Planning as a Constraint Satisfaction</u> Problem

In this section, we show different search techniques and how to constraint a problem.

- a. Search Techniques:
- 1. GRAPHPLAN algorithm uses backward chaining[2] and inorder to reduce the amount of search being done, the authors introduced memoization and information from failed subgoals are recorded so that isomorphic subtrees of the search tree will not be traversed several times. Other alternatives such as integer programming[4], mixed linear programming[5] have been established and these algorithms perform with the magnitude of satisfiability same problems.
- Direct solution was proposed by Rintan[6] using a constraint solver and he made of specific problem instance properties and can be taken advantage

of and having much smaller memory consumption.

#### **Declarative Control Information**

Most of the planning algorithms work by incremental approach and then backtrack when they cant find an optimal plan [7] and to avoid this, we can prune the search tree by reducing the number of back-tracking points. Declarative control information can be helpful in reducing the search space. Invariants is an important form of control information that can be derived from operations definitions. Invariants can be used to characterize the set of reachable states of the planning problem. Symmetry can also be as a part of the declarative control information. Many planning problems have high interchangeably states which are symmetric and this can be used to reduce the search space. Joslin and Roy [8] give an algorithm that detects symmetries in schematic representations of planning problems.

#### **Domain Independent distance heuristics**

Heuristic planner based on ignoring the negative effects have been able to achieve tremendous improvements in runtime behavior and are commonly used as benchmarks for planning domains. Automatic planners developed were all based on the approach developed by Bacchus and Nau[9] and these planners made use of the Naive search paradigm.

## <u>Planning</u> <u>with</u> <u>ordered</u> <u>Binary</u> <u>decision</u> diagrams(OBDD)

The usefulness of OBDD in transition systems was discovered by MacMillan et al[10]. An OBDD-planner can be constructed on the basis of preimage computation. The traversal of the state space uses the Breadth First Search and there is an choice between forward and backward traversal from the initial or goal respectively. OBDD are very helpful when there is uncertainty involved. Cimatti et al [11] generalized work to universal / reactive / conditional planning with several initial states, nondeterministic operators and environment. In this work proposed, full observability and none of the fluents states are observable.Plan construction is based on representing sets of sets of possible current states (sets of belief states) as OBDDs. Each operator maps belief states to belief states, and plans are found by backward chaining from the goal states.

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