

# PLANNING



Edited by James Allen, James Hendler, and Austin Tate

## Readings in

## PLANNING

Edited by

James Allen University of Rochester

James Hendler University of Maryland

Austin Tate University of Edinburgh

Morgan Kaufmann Publishers, Inc. San Mateo, California

## CONTENTS

Preface v

Foreword by Nils J. Nilsson xi

Part I Introduction to Planning 1

Chapter 1 Introduction 3

Planning 5 Michael P. Georgeff

A Review of AI Planning Techniques 26 Austin Tate, James Hendler, Mark Drummond Formal Models of Planning 50

James Allen

Part II Planning Systems 55

Chapter 2 Beginnings 57 GPS, A Program that Simulates Human Thought 59 Allen Newell, H. A. Simon

> Application of Theorem Proving to Problem Solving 67 Cordell Green

> STRIPS: A New Approach to the Application of Theorem Proving to Problem Solving 88 Richard E. Fikes, Nils J. Nilsson

Planning in a Hierarchy of Abstraction Spaces 98 Earl D. Sacerdoti

#### Contents vi

Chapter 3 Interactions and Dependencies 109 The Virtuous Nature of Bugs 111 Gerald Jay Sussman Achieving Several Goals Simultaneously 118 **Richard Waldinger** Extract for APIC Studies in Data Processing 140 D. H. D. Warren A Representation for Robot Plans 154 Philip J. Hayes The Nonlinear Nature of Plans 162 Earl D. Sacerdoti Planning with Constraints (MOLGEN: Part I) 171 Mark Stefik Chapter 4 Planning and Acting 187 Learning and Executing Generalized Robot Plans 189 Richard E. Fikes, Peter E. Hart, Nils J. Nilsson Decision Theory and AI II: The Hungry Monkey 207 Jerome A. Feldman and Robert F. Sproull Planning and Acting 225 Drew McDermott A Cognitive Model of Planning 245 Barbara Hayes-Roth and Frederick Hayes-Roth A Model For Planning in Complex Situations 263 Robert Wilensky Integrating Marker-Passing and Problem Solving 275 James A. Hendler Chapter 5 Integrated Planning Systems 289 Generating Project Networks 291 Austin Tate Planning in Time: Windows and Durations for Activites and Goals 297 Steven A. Vere Domain-independent Planning: Representation and Plan Generation 319 David E. Wilkins

ISIS—A Knowledge-based System for Factory Scheduling 336 Mark S. Fox, Stephen F. Smith
O-Plan—Control in the Open Planning Architecture 361 Ken Currie and Austin Tate
Hierarchical Planning Involving Deadlines, Travel Time, and Resources 369 Thomas Dean, R. James Firby and David Miller
Part III Foundations of Planning 389
Chapter 6 Formal Models Of Action 391
Some Philosophical Problems from the Standpoint of Artificial Intelligence 393 John McCarthy and Patrick Hayes
A Temporal Logic For Reasoning About Processes and Plans 436 Drew McDermott
<b>Towards a General Theory of Action and Time</b> 464 James F. Allen
A Formal Theory of Knowledge and Action 480 Robert C. Moore
Chapter 7 Formal Models of Planning Systems 521
On the Semantics of STRIPS 523 Vladimir Lifschitz
Plan Synthesis: A Logical Perspective 532 Stanley J. Rosenchein
<b>Planning for Conjunctive Goals</b> 537 David Chapman
<b>Planning Using a Temporal World Model</b> 559 James F. Allen and Johannes A. Koomen

Planning as Search: A Quantitative Approach 566 Richard E. Korf

#### Contents viii

Chapter 8 Time and The Frame Problem 579 Problems in Formal Temporal Reasoning 581 Yoay Shoham and Drew McDermott The Frame Problem and Related Problems in Artificial Intelligence 588 Patrick J. Hayes Temporal Data Base Management 596 Thomas Dean and Drew McDermott Nonmonotonic Logic and Temporal Projection 624 Steve Hanks and Drew McDermott Why Things Go Wrong: A Formal Theory of Causal Reasoning 641 Leora Morgenstern and Lynn Andrea Stein Part IV New Directions in Planning Systems 647 Chapter 9 Learning and Reuse 649 Selectively Generalizing Plans for Problem-Solving 651 Steven Minton CHEF: A Model of Case-based Planning 655 Kristian J. Hammond An Adaptive Planner 660 **Richard Alterman** Chapter 10 Extending the Classical Framework 655 Refining and Extending the Procedural Net 667 Mark E. Drummond Localized Representation and Planning 670 Amy L. Lansky Formulating Multiagent, Dynamic-World Problems in the Classical Planning Framework 675 Edwin P. D. Pednault

Chapter 11 Planning and Execution 711

An Architecture for Intelligent Reactive Systems 713 Leslie Pack Kaelbling

Reactive Reasoning and Planning 729 Michael P. Georgeff and Amy L. Lansky

**Integrating Planning, Execution, and Monitoring** 735 Jose A. Ambros-Ingerson and Sam Steel

### FOREWORD

In the early days of artificial intelligence, the word "planning" meant something different than what it means today. In their summary description of the problem-solving behavior of humans, Feigenbaum and Feldman<sup>1</sup> wrote: "A subject using a *planning* method abstracts or simplifies a complex problem. He then solves the simpler problem and uses the information obtained in the solution of the simpler problem in the solution of the original complex problem. This technique has also been included in GPS ..."

Around 1970, my colleagues and I at SRI began using the word "plan" in its more usual sense: *a detailed formulation of a program of action*.<sup>2</sup> This volume contains many of the important papers that propose and explore techniques for automatically formulating and using such programs of action. And, recalling the earlier definition, many of the papers are concerned with *hierarchical planning*, in which the high level actions that achieve a simpler, more abstract goal are used to guide the search for primitive actions to achieve a more detailed one.

Action. How closely associated it is with intelligence! Animals act; plants do not (except in a strained and limited sense). Animals are intelligent; plants are not. And the most intelligent animals (I suppose that's us) are able to think before acting and condition actions on thoughts. Thinking about the consequences of actions before being forced to experience them is the essential part of planning; the result of such thinking is a plan, and the most important part of a plan is the part that specifies what to do next. Since all animals act, *something* tells them what to do next, but we really don't know to what extent animals other than ourselves make and use plans.

We, the planning animals, know that planning is necessary for effective action, and therefore most artificial intelligence researchers want their computer systems to plan. The enterprise of attempting to build such systems has uncovered a multitude of questions about how to represent and reason about the effects of actions. We have the *frame problem*, the *qualification problem*, and the *ramification problem*—to name a few.

Because there are animals that seem too simple to be capable of planning but are nevertheless capable of quite complex behavior (consider the bee, for example), some artificial intelligence researchers<sup>3</sup> have decided to concentrate first on systems that act but that do not plan. It is as if those researchers believed that the ontogeny of artificial intelligence must recapitulate the phylogeny of natural intelligence.

The present volume contains most of the important work of researchers (myself included) who predict that we can bypass those eons of evolutionary history that produced only dull animals which made no plans. We want to build machines straightaway that would rank high

<sup>&</sup>lt;sup>1</sup>Feigenbaum, E. A., and Feldman, J., *Computers and Thought*, McGraw-Hill, New York, 1963, page 278.

<sup>&</sup>lt;sup>2</sup>Webster's Ninth New Collegiate Dictionary, First Digital Edition, NeXT Inc. and Merriam-Webster, Inc., Merriam-Webster, Springfield, MA, 1988.

<sup>&</sup>lt;sup>3</sup>See, for example, Brooks, Rodney A., "A Robust Layered Control System for a Mobile Robot," *IEEE Journal of Robotics and Automation*, March 1986.

on the evolutionary scale, perhaps machines as good as or better than humans are in terms of thinking about what we are going to do before doing it. It's worth a try! And judging from the results reported here, we are making good progress.

Can we combine our work on planning with the results of the "action-without-planning" school? In Chapter 11, we begin to see a synthesis emerging. Certainly, some systems (even those that ordinarily base their actions on plans) will sometimes have to act quickly when there is no time to make a plan. A frontier problem, only now beginning to receive much attention, is how to build autonomous agents that have the ability to base actions both on complex and deep reasoning, as well as on more "instinctive," built-in patterns—using each method appropriately depending on the situation.

Other frontier problems are suggested by the analogy between planning and learning. Learning occurs when an agent modifies its behavior based on experiences in the world it inhabits. Planning occurs when an agent selects behavior based on "experiences" in an internal model of its world. Some initial attempts to link these two activities are reported in Chapter 9. It is also intriguing to speculate about whether or not recent work in "genetic algorithms" (which model evolutionary processes) might inform both learning and planning research. In a certain sense, learning is simulated evolution, and planning is simulated learning.

Pioneers who want to explore these and other frontiers of artificial intelligence research can do no better than to outfit themselves first with what is already known about planning, and the best of that knowledge is contained in this volume.

## Preface

Early in the growth of the field of artificial intelligence it was recognized that an important behavior for any intelligent agent was the ability to plan a set of actions to accomplish its goals. The attempt to realize programs with this ability has resulted in one of AI's main subdisciplines—the field of planning.

Since the first published papers on planning in the late 1950s, the field has grown and papers have appeared in virtually all of the major AI conferences and journals. Although numerous review articles on planning have appeared over the years, no systematic attempt to collect the major papers in this field into one volume has been made previously. Courses on planning have been difficult to teach due to the need to gather a large number of papers from disparate sources. In addition, although most AI texts have an introduction to planning, those wishing to begin applying the planning technology have not been able to find a volume pointing out the seminal papers in the field.

The goal of this book is to remedy this situation by bringing together in one place a set of readings that can be used to develop a familiarity with the planning literature, with the major AI theory underlying planning, and with recent papers in the field indicating several directions of current research.

This volume comprises four sections. The first section is a collection of papers introducing the field of planning. These papers are intended for those familiar with AI concepts, but lacking some familiarity with the research in planning. The second section presents work describing important advances in planning systems developed over the past 30 years. The third section concerns AI research in the areas underlying planning: representation of time and coping with the frame problem. This section also includes some papers that formalize planning systems described in the second section. A final section is included that presents some short papers discussing several directions in which current planning research is moving.

In putting together this volume several hard decisions needed to be made. The AI literature in planning is quite diverse and to include all the strands in a single volume would be impossible for the following reasons:

- 1. Planning systems have traditionally fallen into two major classes: domain-independent planners, which concentrate on the control mechanisms of planning, and domain-dependent planners which concentrate on using domain heuristics to encourage efficient search. The editors decided to concentrate on domain-independent planning in the current volume as it was felt that the more general design principles described herein would be applicable to a wider range of planning work.
- Planning is related to many other subareas of AI. The underlying theoretical material in this volume is restricted to papers that were deemed to have an explicit relation to an understanding of planning systems. This necessarily meant leaving out much important work in logic and knowledge representation (much of which is available in other issues of the Readings series).
- 3. Many realistic applications of AI planning methods require extensive reasoning about time, limited resources and other constraints. Although this is an exciting area of current research, space limitations constrain us to including only a few early papers addressing this theme. Pointers to further reading on this subject can be found in the introductory material and in the included papers.
- 4. The area of plan recognition is a rich literature that is clearly related to the planning area. Unfortunately, to include enough papers on recognition to provide a fair treatment would require significantly more space than was available.

Putting together this volume would have been a far greater undertaking without the efforts of the people who contributed articles, many of whom also provided early feedback on the purpose of the volume or reviewed the proposed set of papers prior to solicitation of the manuscripts. In addition, support from Mike Morgan and Sharon Montooth of Morgan-Kaufmann Publishers was invaluable in bringing this volume to fruition. Finally, on a more personal note, we thank our family and friends who supported us during this effort. MORGAN KAUFMANN SERIES IN REPRESENTATION AND REASONING Ronald J. Brachman, Series Editor

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Although numerous review articles on planning have appeared over the years, no systematic attempt has been made to collect the major papers in this field into one volume. The goal of this book is to remedy this situation by bringing together in one place a set of readings that can be used to develop a familiarity with the planning literature, with the major Artificial Intelligence (AI) theory underlying planning, and with the exciting directions of current research.

The first section of the book introduces the techniques and terminology of the AI planning community. The second section collects papers describing planning systems developed over the past 30 years. A third section presents research in the area of formal models of planning. Finally, a fourth section collects recent work representative of the field's current direction. The editors, three accomplished researchers, provide introductory material surveying the field of planning as well as introductions to groups of papers placing the work in perspective.

Useful as a text for a planning course, a supplement to a more general AI course, and as a reference for AI system developers and researchers, this book is certain to be among the most popular of the Morgan Kaufmann Readings.

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