

游戏开发中的人工智能(影印版)



AI for Game Developers

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David M. Bourg & Glenn Seemann 著

游戏开发中的人工智能(影印版)



你的游戏是否有角色不能任意走动？是否有角色走进障碍物？是否有非玩家角色不能按照团队运动？现在你就可以掌握高级人工智能（AI）技术以解决这些问题。不管你是编程新手或者是个仅仅想快速学习AI的熟练游戏编程人员，你都会发现《游戏开发中的人工智能》对于理解并应用AI到你的游戏中是非常合适的入门书籍。本书正是为你提供游戏开发方面高级、有用的AI技术的。如果你曾试图使用AI延长你的游戏的使用寿命，让你的游戏更加具有挑战性，更重要的是让它们更加有趣，这本书就是为你准备的。

David M. Bourg（畅销书《游戏开发中的物理学》的作者）和Glenn Seemann将用非常直观、易懂的语言给你介绍一些诸如有限状态机、模糊逻辑和神经网络之类的技术，全书使用源代码（用C和C++编写）说明这些技术。从基本的诸如追赶、躲避、基于模式的运动和聚集等游戏行为到玩家行为预测，这本书告诉你怎么应用AI给你的游戏角色提供可信的智能。这些技术包括了适合初级AI开发者的确定性（传统的）和非确定性（较新的）AI技术的混合。

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- 使用概率分析和诸如贝叶斯推理的高级技术处理不确定性问题。

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David M. Bourg & Glenn Seemann

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Preface

Recent advances in 3D visualization and physics-based simulation technology, at both the software and hardware levels, have enabled game developers to create compelling, visually immersive gaming environments. The next step in creating even more immersive games is improved artificial intelligence (AI). Advances in computing power, and in hardware-accelerated graphics in particular, are helping to free up more CPU cycles that can be devoted to more sophisticated AI engines for games. Further, the large number of resources—academic papers, books, game industry articles, and web sites—devoted to AI are helping to put advanced AI techniques within the grasp of every game developer, not just those professionals who devote their careers to AI.

With that said, wading through volumes of technical papers, text books, and web sites can be a daunting task for upcoming game AI developers. This book pulls together the information novices need so that they can get a jump-start in the field of game AI development. We present relevant theory on a wide range of topics, which we support with code samples throughout the book.

Many general game development books cover AI to some extent, however their treatment of the technology tends to be limited. This is probably because such books have to cover a lot of different topics and cannot go into great depth on any particular one. Although several very good books do focus on game AI (we list many of them in the “Additional Resources” section of this Preface), most of them are geared toward experienced AI developers and they focus on relatively specific and advanced topics. Therefore, novices likely would require companion resources that cover some of the more fundamental aspects of game AI in more detail. Still other books cover some specific game AI techniques in great detail, but are restricted to covering just those techniques.

Our book covers a wide range of game AI topics at a level appropriate for novice developers. So, if you are new to game programming or if you are an experienced

game programmer who needs to get up to speed quickly on AI techniques such as finite state machines, fuzzy logic, and neural networks, among others, this book is for you.

Assumptions This Book Makes

Because this book is targeted for beginner game AI developers, we don't assume you have any AI background. We do, however, assume you know how to program using C/C++. We also assume you have a working knowledge of the basic vector math used in games, but we have included a brief vector math refresher in the Appendix in case your skills are a little rusty.

About This Book

We didn't hope to (nor did we attempt to) cover every aspect of game AI in this book; far too many techniques and variations of techniques are used for an even larger variety of game types, specific game architectures, and in-game scenarios. Instead, we present a mix of both deterministic (traditional) and nondeterministic (newer) AI techniques aimed squarely at beginner AI developers. Here's a summary of what we cover:

Chapter 1, *Introduction to Game AI*

Here, we define game AI and discuss the current state of the art as well as the future of this technology.

Chapter 2, *Chasing and Evading*

We cover basic techniques for chasing and evading as well as more advanced techniques for intercepting. We also cover techniques applicable to both tile-based and continuous game environments.

Chapter 3, *Pattern Movement*

Pattern movement techniques are common to many video games and developers have been using them since the early days of gaming. You can use these techniques to preprogram certain behaviors such as the patrolling of a guard or the swooping in of a spacecraft.

Chapter 4, *Flocking*

The flocking method we examine in this chapter is an example of an A-life algorithm. In addition to creating cool-looking flocking behavior, A-life algorithms form the basis of more advanced group movement.

Chapter 5, *Potential Function Based Movement*

Potential-based movement is relatively new in game AI applications. The cool thing about this method is that it can handle chasing, evading, swarming, and collision avoidance simultaneously.

Chapter 6, *Basic Pathfinding and Waypoints*

Game developers use many techniques to find paths in and around game environments. In this chapter, we cover several of these methods, including waypoints.

Chapter 7, *A* Pathfinding*

No treatment of pathfinding is complete without addressing the workhorse algorithm of pathfinding; therefore, we devote this whole chapter to the A* algorithm.

Chapter 8, *Scripted AI and Scripting Engines*

Programmers today often write scripting engines and hand off the tools to level designers who are responsible for creating the content and defining the AI. In this chapter, we explore some of the techniques developers use to apply a scripting system in their games, and the benefits they receive.

Chapter 9, *Finite State Machines*

Finite state machines are the nuts and bolts of game AI. This chapter discusses the fundamentals of finite state machines and how to implement them.

Chapter 10, *Fuzzy Logic*

Developers use fuzzy logic in conjunction with or as a replacement for finite state machines. In this chapter, you'll learn the advantages fuzzy techniques offer over traditional logic techniques.

Chapter 11, *Rule-Based AI*

Technically, fuzzy logic and finite state machines fall under the general heading of rules-based methods. In this chapter, we cover these methods as well as other variants.

Chapter 12, *Basic Probability*

Game developers commonly use basic probability to make their games less predictable. Such cheap unpredictability enables developers to maintain substantial control over their games. Here, we cover basic probability for this purpose as well as lay the groundwork for more advanced methods.

Chapter 13, *Decisions Under Uncertainty—Bayesian Techniques*

Bayesian techniques are probabilistic techniques, and in this chapter we show how you can use them for decision making and for adaptation in games.

Chapter 14, *Neural Networks*

Game developers use neural networks for learning and adaptation in games—in fact, for anything from making decisions to predicting the behavior of players. We cover the most widely used neural network architecture, in detail.

Chapter 15, *Genetic Algorithms*

Genetic algorithms offer opportunities for evolving game AI. Although developers don't often use genetic algorithms in games, their potential for specific applications is promising, particularly if they are combined with other methods.

Appendix, *Vector Operations*

This appendix shows you how to implement a C++ class that captures all of the vector operations that you'll need when writing 2D or 3D simulations.

All the chapters in this book are fairly independent of each other. Therefore, you generally can read the chapters in any order you want, without worrying about missing material in earlier chapters. The only exception to this rule is Chapter 12, on basic probability. If you don't have a background in probability, you should read this chapter before reading Chapter 13, on Bayesian methods.

Also, we encourage you to try these algorithms for yourself in your own programs. If you're just getting started in game AI, which we assume you are if you're reading this book, you might want to begin by applying some of the techniques we present in simple arcade-style or board games. You also might consider programming a *bot* using extensible AI tools that are increasingly becoming standard for first-person shooter games. This approach will give you the opportunity to try out your AI ideas without having to program all the other non-AI aspects of your game.

Conventions Used in This Book

The following typographical conventions are used in this book:

Plain text

Indicates menu titles, menu options, menu buttons, and keyboard accelerators (such as Alt and Ctrl).

Italic

Indicates new terms, URLs, email addresses, filenames, file extensions, pathnames, directories, and Unix utilities.

Constant width

Indicates commands, options, switches, variables, attributes, keys, functions, types, classes, namespaces, methods, modules, properties, parameters, values, objects, events, event handlers, XML tags, HTML tags, macros, the contents of files, or the output from commands.

Constant width bold

Shows commands or other text that should be typed literally by the user.

Constant width italic

Shows text that should be replaced with user-supplied values.

Bold

Variables shown in bold are vectors as opposed to scalar variables, which are shown in regular print.

Additional Resources

Although we attempt to cover a wide range of AI techniques in this book, we realize we can't compress within these pages everything there is to know about AI in game development. Therefore, we've compiled a short list of useful AI web and print resources for you to explore should you decide to pursue game AI further.

Here are some popular web sites related to game development and AI that we find helpful:

- The Game AI Page at <http://www.gameai.com>
- AI Guru at <http://www.aiguru.com>
- Gamasutra at <http://www.gamasutra.com>
- GameDev.net at <http://www.gamedev.net>
- AI Depot at <http://ai-depot.com>
- Generation5 at <http://www.generation5.org>
- The American Association for Artificial Intelligence at <http://www.aaai.org>

Each web site contains information relevant to game AI as well as additional links to other sources of information on AI.

Here are several print resources that we find helpful (note that these resources include both game and nongame AI books):

- *Probabilistic Reasoning in Intelligent Systems: Networks of Plausible Inference* by Judea Pearl (Morgan Kaufmann Publishers, Inc.)
- *Bayesian Artificial Intelligence* by Kevin Korb and Ann Nicholson (Chapman & Hall/CRC)
- *Bayesian Inference and Decision*, Second Edition by Robert Winkler (Probabilistic Publishing)
- *AI Game Programming Wisdom* by Steve Rabin, ed. (Charles River Media)
- *AI Techniques for Game Programming* by Mat Buckland (Premier Press)
- *Practical Neural Network Recipes in C++* by Timothy Masters (Academic Press)
- *Neural Networks for Pattern Recognition* by Christopher Bishop (Oxford University Press)
- *AI Application Programming* by M. Tim Jones (Charles River Media)

Using Code Examples

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Introduction to Game AI

In the broadest sense, most games incorporate some form of artificial intelligence (AI). For instance, developers have used AI for years to give seemingly intelligent life to countless game characters, from the ghosts in the classic arcade game *Pac Man* to the bots in the first-person shooter *Unreal*, and many others in between. The huge variety of game genres and game characters necessitates a rather broad interpretation as to what is considered game AI. Indeed, this is true of AI in more traditional scientific applications as well.

Some developers consider tasks such as pathfinding as part of game AI. Steven Woodcock reported in his “2003 Game Developer’s Conference AI Roundtable Moderator’s Report” that some developers even consider collision detection to be part of game AI.* Clearly, some wide-ranging interpretations of game AI exist.

We’re going to stick with a broad interpretation of game AI, which includes everything from simple chasing and evading, to pattern movement, to neural networks and genetic algorithms. Game AI probably best fits within the scope of *weak* AI (see the sidebar “Defining AI”). However, in a sense you can think of game AI in even broader terms.

In games, we aren’t always interested in giving nonplayer characters human-level intellect. Perhaps we are writing code to control nonhuman creatures such as dragons, robots, or even rodents. Further, who says we always have to make nonplayer characters smart? Making some nonplayer characters dumb adds to the variety and richness of game content. Although it is true that game AI is often called upon to solve fairly complex problems, we can employ AI in attempts to give nonplayer characters the appearance of having different personalities, or of portraying emotions or various dispositions—for example, scared, agitated, and so on.

*Steven Woodcock maintains an excellent Web site devoted to game AI at <http://www.gameai.com>.