

Crew AI

in Action

Building
Production-Ready
AI Agents and
Multi-Agent Systems



Design and build
autonomous
AI agents



Enable agents to
collaborate on
complex tasks



Integrate tools,
APIs, and
data sources



Deploy and scale
reliable agent
systems



Practical
examples and
working code



Real-world
projects and
use cases



Production
patterns and
best practices



From prototype
to production

JESSE MILD

CrewAI in Action

Building Production-Ready AI Agents and Multi-Agent Systems

Steve T. Publications

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This version was published on 2026-07-10



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Building Production-Ready AI Agents and Multi-Agent Systems

This book teaches you how to design, build, and deploy production-ready multi-agent AI systems using the CrewAI framework. Starting from fundamental concepts and progressing through advanced patterns, you will learn to create autonomous agents that collaborate on complex tasks, integrate with external tools and data sources, and operate reliably at scale. Every concept is explained with clear prose, fully working code examples, and real-world project walkthroughs. Whether you are a beginner exploring AI agents for the first time or an experienced developer looking to master CrewAI's advanced capabilities, this book provides the practical knowledge and engineering discipline needed to ship robust agentic systems.

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