



# R语言机器学习 参考手册（影印版）

Machine Learning with R Cookbook

Yu-Wei Chiu (David Chiu) 著

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使用简单且易于使用的R代码，  
通过110多个参考方案分析数据并构建可预测模型

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*Yu - Wei Chiu (David Chiu)* 著

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In 2013, Yu-Wei reviewed *Bioinformatics with R Cookbook*, Packt Publishing. For more information, please visit his personal website at [www.ywchiu.com](http://www.ywchiu.com).

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I have immense gratitude for my family and friends for supporting and encouraging me to complete this book. I would like to sincerely thank my mother, Ming-Yang Huang (Miranda Huang); my mentor, Man-Kwan Shan; the proofreader of this book, Brendan Fisher; Taiwan R User Group; Data Science Program (DSP); and other friends who have offered their support.

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You can find out more about him at <http://tarekamr.appspot.com/>.

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Abir is also involved in risk modeling and has been a part of the team that developed a model risk governance platform for his current organization, which has been widely recognized across the banking and financial service industry.

**Saibal Dutta** is presently researching in the field of data mining and machine learning at the Indian Institute of Technology, Kharagpur, India. He also holds a master's degree in electronics and communication from the National Institute of Technology, Rourkela, India. He has also worked at HCL Technologies Limited, Noida, as a software consultant. In his 4 years of consulting experience, he has been associated with global players such as IKEA (in Sweden), Pearson (in the U.S.), and so on. His passion for entrepreneurship has led him to start his own start-up in the field of data analytics, which is in the bootstrapping stage. His areas of expertise include data mining, machine learning, image processing, and business consultation.

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He has expertise in the following areas:

- ▶ Quantitative trading: FX, equities, futures, options, and engineering on derivatives
- ▶ Algorithms: Partial differential equations, Stochastic Differential Equations, Finite Difference Method, Monte-Carlo, and Machine Learning
- ▶ Code: R Programming, C++, MATLAB, HPC, and Scientific Computing
- ▶ Data analysis: Big-Data-Analytic [EOD to TBT], Bloomberg, Quandl, and Quantopian
- ▶ Strategies: Vol-Arbitrage, Vanilla and Exotic Options Modeling, trend following, Mean reversion, Co-integration, Monte-Carlo Simulations, ValueatRisk, Stress Testing, Buy side trading strategies with high Sharpe ratio, Credit Risk Modeling, and Credit Rating

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His research interest covers the following topics:

- ▶ Correlation among heterogeneous data, such as social advertising from both the users' demographic features and users' social networks
- ▶ Correlation among evolving time series objects, such as finding dynamic correlations, finding the most influential financial products (shaker detection, cascading graph), and using the correlation in hedging and portfolio management
- ▶ Correlation among learning tasks, such as transfer learning

**Jithin S.L** completed his BTech in information technology from Loyola Institute of Technology and Science. He started his career in the field of analytics and then moved to various verticals of big data technology. He has worked with reputed organizations, such as Thomson Reuters, IBM, and Flytxt, under different roles. He has worked in the banking, energy, healthcare, and telecom domains and has handled global projects on big data technology.

He has submitted many research papers on technology and business at national and international conferences.

His motto in life is that learning is always a neverending process that helps in understanding, modeling, and presenting new concepts to the modern world.

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I surrender myself to God almighty who helped me to review this book in an effective way. I dedicate my work on this book to my dad, Mr. N. Subbian Asari, my lovable mom, Mrs. M. Lekshmi, and my sweet sister, Ms. S.L Jishma, for coordinating and encouraging me to write this book.

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