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DATA MINING FACEBOOK, TWITTER, LINKEDIN, GOOGLE+, GITHUB, AND MORE

Matthew A. Russell

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Mining the Social Web

How can you tap into the wealth of social web data to discover who's making connections with whom, what they're talking about, and where they're located? With this expanded and thoroughly revised edition, you'll learn how to acquire, analyze, and summarize data from all corners of the social web, including Facebook, Twitter, LinkedIn, Google+, GitHub, email, websites, and blogs.

- Employ IPython Notebook, the Natural Language Toolkit, NetworkX, and other scientific computing tools to mine popular social websites
- Apply advanced text-mining techniques, such as clustering and TF-IDF, to extract meaning from human language data
- Bootstrap interest graphs from GitHub by discovering affinities among people, programming languages, and coding projects
- Build interactive visualizations with D3.js, an extraordinarily flexible HTML5 and JavaScript toolkit
- Take advantage of more than two-dozen Twitter recipes, presented in O'Reilly's popular "problem/solution/discussion" cookbook format

The example code for this unique data science book is maintained in a public GitHub repository. It's designed to be easily accessible through a turnkey virtual machine that facilitates interactive learning with an easy-to-use collection of IPython Notebooks.

Matthew Russell, Chief Technology Officer at Digital Reasoning Systems, Principal at Zaffra, is a computer scientist who is passionate about data mining, open source, and creating technology to amplify human intelligence.

"Mining insights through an API is an essential skill to have, whether or not you consider yourself a programmer. This book exposes you to a breadth of key information sources while using tools that make the coding easily accessible."

-Kevin Makice

author of Twitter API: Up and Running

"This book offers all readers a fresh perspective of social web data through illustrative and concise code—all within in the comfort of a web browser! Readers get a fantastic tour of computer science concepts by example, including algorithmic complexity, natural language processing, and the future of the Internet of Things."

—Jason Yee

Data Scientist at Digital Reasoning

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Matthew A. Russell



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by Matthew A. Russell

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[LSI]

If the ax is dull and its edge unsharpened, more strength is needed, but skill will bring success.

—Ecclesiastes 10:10



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