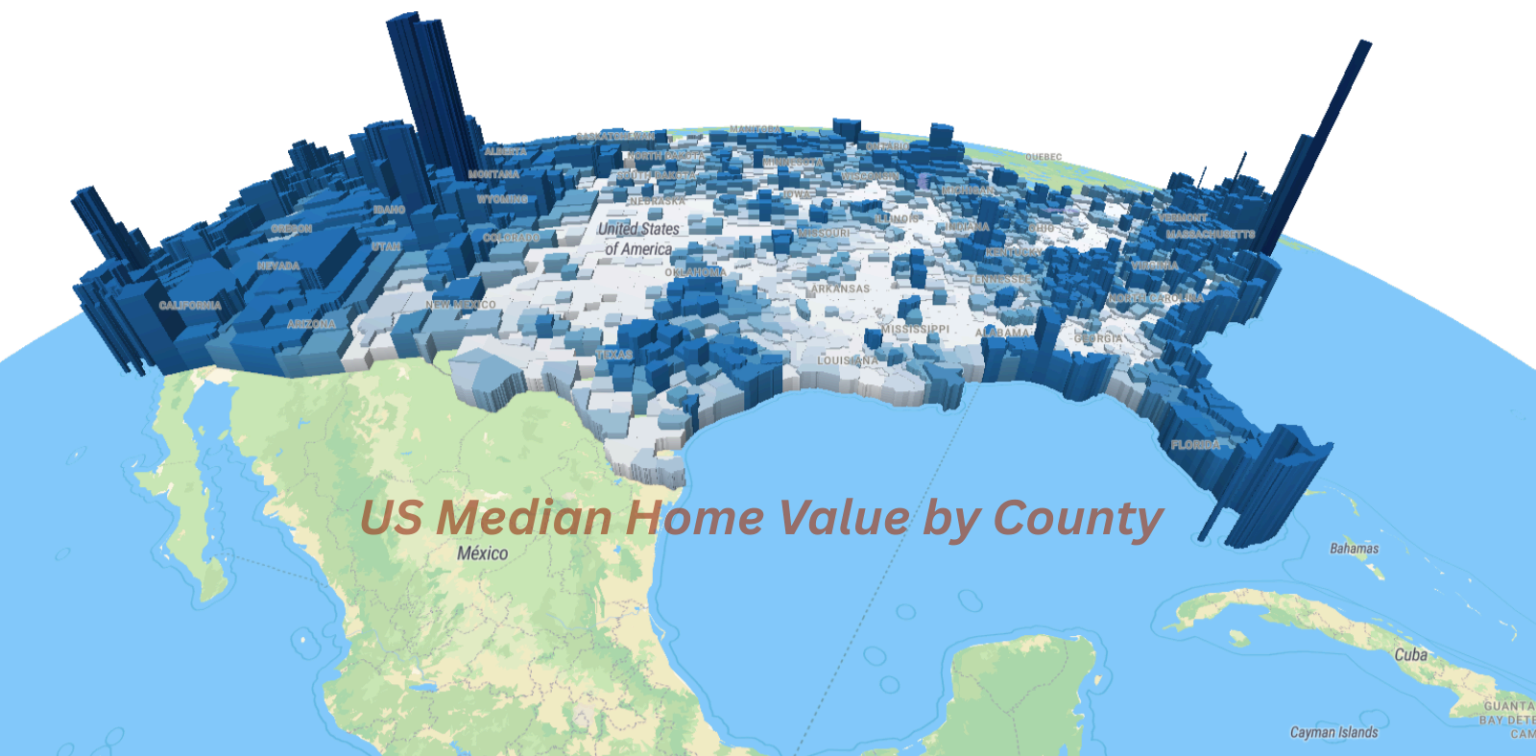


Introduction to GIS Programming

A Practical Python Guide to Open Source Geospatial Tools

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Contents

Preface	1
Introduction	3
Who This Book Is For	3
What This Book Covers	4
Getting the Most Out of This Book	5
Conventions Used in This Book	5
Downloading the Code Examples	6
Video Tutorials	6
Get in Touch	7
Acknowledgments	7
About the Author	8
I: Software Setup	9
1. Overview of Software Tools	11
1.1. Introduction	11
1.2. Learning Objectives	11
1.3. Essential Software Tools	11
1.4. Tool Integration and Workflow	13
1.5. Running Code Examples	14
1.6. Key Takeaways	14
2. Introduction to Python Package Management	15
2.1. Introduction	15
2.2. Learning Objectives	15
2.3. Installing Conda (Miniconda)	16
2.4. Understanding Conda Concepts	17
2.5. Creating Your First Geospatial Environment	18
2.6. Troubleshooting Conda	19
2.7. Essential Conda Commands	20
2.8. Introducing uv: The Fast Alternative	24
2.9. Best Practices for Package Management	25
2.10. Key Takeaways	26
2.11. Exercises	26
3. Setting Up Visual Studio Code	28
3.1. Introduction	28
3.2. Learning Objectives	28
3.3. Installing Visual Studio Code	29
3.4. Essential Extensions for Python Programming	29
3.5. Configure VS Code for Python Development	31
3.6. Essential Keyboard Shortcuts	32
3.7. References and Further Learning	34
3.8. Key Takeaways	34
3.9. Exercises	34
4. Version Control with Git	36
4.1. Introduction	36
4.2. Learning Objectives	37
4.3. Setting Up GitHub Account	37
4.4. Installing Git	37

4.5. Configuring Git	38
4.6. Understanding Git Concepts	38
4.7. Essential Git Commands	39
4.8. Using GitHub	42
4.9. Integration with VS Code	43
4.10. Best Practices for Geospatial Projects	43
4.11. Key Takeaways	44
4.12. Exercises	45
5. Using Google Colab	47
5.1. Introduction	47
5.2. Learning Objectives	47
5.3. Getting Started with Google Colab	47
5.4. Setting Up Your Geospatial Environment	48
5.5. Essential Colab Features	50
5.6. Run Code Examples in Colab	51
5.7. Key Takeaways	51
5.8. Exercises	52
6. Working with JupyterLab	53
6.1. Introduction	53
6.2. Learning Objectives	53
6.3. Installing and Setting Up JupyterLab	53
6.4. Getting Started with JupyterLab	54
6.5. Essential Keyboard Shortcuts	57
6.6. Running Code Examples on MyBinder	59
6.7. Key Takeaways	59
6.8. Exercises	59
7. Using Docker	62
7.1. Introduction	62
7.2. Learning Objectives	62
7.3. Installing Docker Desktop	62
7.4. Basic Concepts	64
7.5. Running Code Examples in Docker	64
7.6. Common Docker Commands	65
7.7. Key Takeaways	66
7.8. Exercises	67
II: Python Programming Fundamentals	69
8. Variables and Data Types	71
8.1. Introduction	71
8.2. Learning Objectives	71
8.3. Variables in Python	71
8.4. Naming Variables	72
8.5. Data Types	73
8.6. Escape Characters	74
8.7. Comments in Python	74
8.8. Working with Variables and Data Types	74
8.9. Basic String Operations	75
8.10. Key Takeaways	76
8.11. Exercises	76

9. Python Data Structures	78
9.1. Introduction	78
9.2. Learning Objectives	78
9.3. Tuples	78
9.4. Lists	79
9.5. Sets	81
9.6. Dictionaries	84
9.7. Data Structure Selection Guide	87
9.8. Key Takeaways	87
9.9. Exercises	88
10. String Operations	90
10.1. Introduction	90
10.2. Learning Objectives	90
10.3. Creating and Manipulating Strings	90
10.4. String Methods for Geospatial Data	92
10.5. String Formatting	95
10.6. String Operation Decision Guide	98
10.7. Key Takeaways	98
10.8. Exercises	99
11. Loops and Conditional Statements	101
11.1. Introduction	101
11.2. Learning Objectives	101
11.3. For Loops	101
11.4. While Loops	103
11.5. Control Statements: Making Decisions in Your Code	104
11.6. Combining Loops and Control Statements	105
11.7. Loop and Control Statement Decision Guide	107
11.8. Key Takeaways	108
11.9. Exercises	108
12. Functions and Classes	110
12.1. Introduction	110
12.2. Learning Objectives	110
12.3. Functions: Building Reusable Code Blocks	110
12.4. Classes: Organizing Data and Behavior Together	115
12.5. Combining Functions and Classes	117
12.6. Function and Class Design Guidelines	117
12.7. Key Takeaways	118
12.8. Exercises	118
13. Working with Files	120
13.1. Introduction	120
13.2. Learning Objectives	120
13.3. Creating a Sample File	120
13.4. Reading and Writing Files	121
13.5. Exception Handling	122
13.6. Combining File Handling and Exception Handling	124
13.7. Working with Different File Formats	125
13.8. Key Takeaways	127
13.9. Exercises	128

14. Data Analysis with NumPy and Pandas	130
14.1. Introduction	130
14.2. Learning Objectives	130
14.3. Introduction to NumPy	130
14.4. Introduction to Pandas	141
14.5. Combining NumPy and Pandas	148
14.6. Key Takeaways	149
14.7. Further Reading	149
14.8. Exercises	150
III: Geospatial Programming with Python	153
15. Introduction to Geospatial Python	155
15.1. Introduction	155
15.2. The Geospatial Python Ecosystem	155
15.3. Understanding Library Relationships	156
15.4. Setting Up Your Environment	156
15.5. Verification and First Steps	157
15.6. Learning Path and Chapter Overview	159
15.7. Key Concepts to Remember	159
15.8. Getting Help and Resources	160
15.9. Next Steps	160
15.10. Exercises	160
16. Vector Data Analysis with GeoPandas	161
16.1. Introduction	161
16.2. Learning Objectives	161
16.3. Core Concepts	161
16.4. Installing GeoPandas	162
16.5. Creating GeoDataFrames	162
16.6. Reading and Writing Geospatial Data	163
16.7. Projections and Coordinate Reference Systems (CRS)	164
16.8. Spatial Measurements and Analysis	166
16.9. Visualizing Geospatial Data	168
16.10. Advanced Geometric Operations	172
16.11. Spatial Relationships and Queries	176
16.12. Best Practices and Performance Considerations	176
16.13. Key Takeaways	177
16.14. Exercises	177
17. Working with Raster Data Using Rasterio	179
17.1. Introduction	179
17.2. Learning Objectives	179
17.3. Installing Rasterio	180
17.4. Reading Raster Data	180
17.5. Visualizing Raster Data	183
17.6. Accessing and Manipulating Raster Bands	190
17.7. Writing Raster Data	191
17.8. Clipping Raster Data	192
17.9. Key Takeaways	195
17.10. Exercises	195
18. Multi-dimensional Data Analysis with Xarray	198

18.1.	Introduction	198
18.2.	Learning Objectives	198
18.3.	Understanding Xarray's Data Model	199
18.4.	Setting Up Your Environment	199
18.5.	Loading and Exploring Real Climate Data	200
18.6.	Working with DataArrays	201
18.7.	Intuitive Data Selection and Indexing	203
18.8.	Performing Operations on Multi-Dimensional Data	204
18.9.	Data Visualization with Xarray	206
18.10.	Working with Datasets: Multiple Variables	208
18.11.	The Power of Label-Based Operations	209
18.12.	Advanced Indexing Techniques	211
18.13.	High-Level Computational Operations	212
18.14.	Data Input and Output	215
18.15.	Key Takeaways	216
18.16.	Further Reading	217
18.17.	Exercises	217
19.	<i>Raster Analysis with Rioxarray</i>	219
19.1.	Introduction	219
19.2.	Learning Objectives	219
19.3.	Setting Up Your Rioxarray Environment	219
19.4.	Loading and Exploring Georeferenced Raster Data	220
19.5.	Fundamental Geospatial Operations	223
19.6.	Working with Spatial Dimensions and Resolution	224
19.7.	Visualizing Geospatial Raster Data	226
19.8.	Data Storage and File Management	230
19.9.	Coordinate System Comparisons	232
19.10.	Introduction to Band Math	234
19.11.	Key Takeaways	237
19.12.	Exercises	238
20.	<i>Interactive Visualization with Leafmap</i>	240
20.1.	Introduction	240
20.2.	Learning Objectives	241
20.3.	Installing and Setting Up Leafmap	241
20.4.	Creating Interactive Maps	242
20.5.	Changing Basemaps	245
20.6.	Visualizing Vector Data	250
20.7.	Creating Choropleth Maps	255
20.8.	Visualizing GeoParquet Data	256
20.9.	Visualizing PMTiles	258
20.10.	Visualizing Raster Data	262
20.11.	Accessing and Visualizing Maxar Open Data	269
20.12.	Key Takeaways	276
20.13.	Exercises	276
21.	<i>Geoprocessing with WhiteboxTools</i>	287
21.1.	Introduction	287
21.2.	Learning Objectives	287
21.3.	Why Whitebox?	287

21.4.	Useful Resources for Whitebox	289
21.5.	Installing Whitebox	289
21.6.	Watershed Analysis	290
21.7.	LiDAR Data Analysis	303
21.8.	Key Takeaways	310
21.9.	Exercises	311
22.	<i>3D Mapping with MapLibre</i>	314
22.1.	Introduction	314
22.2.	Learning Objectives	314
22.3.	Useful Resources	314
22.4.	Installation and Setup	314
22.5.	Creating Interactive Maps	315
22.6.	Adding Map Controls	316
22.7.	Adding Layers	319
22.8.	Using MapTiler	321
22.9.	3D Mapping	322
22.10.	Visualizing Vector Data	329
22.11.	Visualizing Raster Data	339
22.12.	Adding Custom Components	341
22.13.	Visualizing PMTiles	348
22.14.	Adding DeckGL Layers	353
22.15.	Exporting to HTML	356
22.16.	Key Takeaways	356
22.17.	Exercises	356
23.	<i>Cloud Computing with Earth Engine and Geemap</i>	359
23.1.	Introduction	359
23.2.	Learning Objectives	359
23.3.	Introduction to Google Earth Engine	359
23.4.	Introduction to Interactive Maps and Tools	362
23.5.	The Earth Engine Data Catalog	367
23.6.	Earth Engine Data Types	369
23.7.	Earth Engine Raster Data	369
23.8.	Earth Engine Vector Data	371
23.9.	More Tools for Visualizing Earth Engine Data	374
23.10.	Vector Data Processing	382
23.11.	Raster Data Processing	385
23.12.	Exporting Earth Engine Data	391
23.13.	Creating Timelapse Animations	394
23.14.	Charting Earth Engine Data	399
23.15.	Key Takeaways	429
23.16.	Exercises	430
24.	<i>Hyperspectral Data Visualization with HyperCoast</i>	432
24.1.	Introduction	432
24.2.	Learning Objectives	432
24.3.	Environment Setup	433
24.4.	Finding Hyperspectral Data	433
24.5.	Downloading Hyperspectral Data	435
24.6.	Reading Hyperspectral Data	436

24.7. Visualizing Hyperspectral Data	436
24.8. Creating Image Cubes	438
24.9. Interactive Slicing	439
24.10. Interactive Thresholding	441
24.11. Key Takeaways	442
24.12. Exercises	442
25. High-Performance Geospatial Analytics with DuckDB	444
25.1. Introduction	444
25.2. Learning Objectives	444
25.3. Installation and Setup	445
25.4. SQL Basics for Spatial Analysis	447
25.5. Python API Integration	452
25.6. Data Import	454
25.7. Data Export	458
25.8. Working with Geometries	460
25.9. Spatial Relationships	463
25.10. Spatial Joins	465
25.11. Large-Scale Data Analysis	468
25.12. Key Takeaways	475
25.13. Exercises	476
26. Geospatial Data Processing with GDAL and OGR	480
26.1. Introduction	480
26.2. Learning Objectives	480
26.3. Installation and Setup	481
26.4. Sample Datasets	481
26.5. Understanding Your Data	481
26.6. Coordinate Transformation	482
26.7. Format Conversion	483
26.8. Clipping and Masking	484
26.9. Raster Analysis and Calculations	485
26.10. Converting Between Raster and Vector	486
26.11. Geometry Processing	487
26.12. Managing Fields and Layers	488
26.13. Tiling and Data Management	488
26.14. Advanced Raster Processing	490
26.15. Terrain Analysis	491
26.16. Key Takeaways	497
26.17. Exercises	498
27. Building Interactive Dashboards with Voilà and Solara	501
27.1. Introduction	501
27.2. Learning Objectives	502
27.3. Installing Voilà and Solara	502
27.4. Introduction to Hugging Face Spaces	502
27.5. Creating a Basic Voilà Application	503
27.6. Creating an Advanced Web Application with Solara	509
27.7. Key Takeaways	514
27.8. Exercises	515
28. Distributed Computing with Apache Sedona	516

28.1.	Introduction	516
28.2.	Learning Objectives	516
28.3.	Installing and Setting Up Apache Sedona	517
28.4.	Core Concepts and Data Structures	518
28.5.	Spatial Operations and Functions	519
28.6.	Spatial Joins and Indexing	521
28.7.	Advanced Spatial Analysis	522
28.8.	Working with Raster Data	523
28.9.	Performance Optimization	524
28.10.	Integration with Other Tools	525
28.11.	Real-World Use Cases	526
28.12.	Key Takeaways	527
28.13.	Exercises	527