THE COMPLETE DATA SCIENCE ROADMAP



Go From Zero to a Data Scientist in 12 Months

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Hi! I am Mosh Hamedani, a software engineer with over 20 years of experience.

Over the past 10 years, I've had the privilege of teaching millions of people how to code and become professional software engineers through my YouTube channel and online courses.

It's my mission to make software engineering accessible to everyone. Join me on this journey and unlock your potential in the world of coding!

https://codewithmosh.com

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Introduction

This guide is designed to help you navigate the essential skills needed to become a successful data scientist. Whether you're just starting out or looking to enhance your existing skills, this roadmap will provide a clear and structured path.

Target Audience

This guide is for:

- **Beginners** who want to know what they need to learn to land a data science job.
- Experienced individuals looking to level up their skills and fill in the gaps in their knowledge.

Resources

For detailed tutorials and full courses, check out the following resources:

- YouTube Channel: https://www.youtube.com/c/programmingwithmosh
- Full Courses: https://codewithmosh.com

Roadmap Overview

Below is a comprehensive table listing all the essential skills needed to become a proficient data scientist, along with the estimated time required to learn each skill.

Keep in mind that the time needed to learn each skill can vary for everyone. These estimates are based on dedicating 3 to 5 hours of study every day.

Use this roadmap to guide your learning journey and track your progress as you build a strong foundation in data science.

Skill	Est. Time	Learning Phase
Programming (Python)	1-2 months	Beginner
Version Control (Git)	1-2 weeks	Beginner
Data Structures & Algorithms	1-2 months	Beginner
SQL	1-2 months	Beginner
Mathematics and Statistics	2-3 months	Beginner
Data Collection and Visualization	1-2 months	Intermediate
Machine Learning Fundamentals	2-3 months	Intermediate
Deep Learning	2-3 months	Advanced
Specialization (NLP or Computer Vision)	2-3 months	Advanced
Big Data (Optional)	2-3 months	Advanced
Total	12-20 months	

Python

Python is a highly popular language for data science, known for its simplicity, readability, and extensive library support. It's widely used for data analysis, visualization, and building machine learning models.

Estimated time: 2 months

Learning resources: YouTube Tutorial | Full Course

Essential Concepts

- Python Fundamentals
 - Variables and data types
 - Loops (for, while) and conditional statements (if, elif, else)
 - Functions and scope

Data Structures

- Arrays, lists, tuples and sets
- Stacks and queues
- Dictionaries
- Comprehensions
- Generator expressions
- Exception Handling
 - Handling exceptions with try/except
 - Raising exceptions
- Functional Programming
 - Lambda functions

Data Science Roadmap

• Map, reduce, filter

Object-oriented Programming

- Classes and objects
- Inheritance and polymorphism

• Modules and packages

- Creating modules
- Managing packages with pip and pipenv
- Virtual environments

• Python Standard Library:

- Working with paths, files, and directories
- Working with CSV and JSON files
- Working with Date/time
- Generating random values

• Familiarity with data science libraries

- NumPy
- Pandas
- Matplotlib

Version Control (Git)

Git is a version control system that is crucial for managing code and collaboration in data science projects. It allows you to track changes, collaborate with others, and maintain the integrity of your codebase.

Estimated time: 1-2 weeks

Learning resources: YouTube Tutorial Full Course

- Setup and Configuration: init, clone, config
- Staging: status, add, rm, mv, commit, reset
- Inspect and Compare: log, diff, show
- Branching: branch, checkout, merge
- Remote Repositories: remote, fetch, pull, push
- Temporary Commits: stash
- GitHub: fork, pull request, code review

Data Structures & Algorithms

Understanding data structures and algorithms is crucial for optimizing code and solving complex problems efficiently. This knowledge is fundamental for technical interviews and real-world data science tasks.

Estimated Time: 1-2 months

Learning resources: YouTube Tutorial Full Course

- Big O Notation
- Arrays and Linked Lists
- Stacks and Queues
- Hash Tables
- Trees and Graphs
 - Binary trees
 - AVL trees
 - Heaps
 - Tries
 - Graphs
- Sorting Algorithms
 - Bubble sort
 - Selection sort
 - Insertion sort
 - Merge sort

Data Science Roadmap

- Quick sort
- Counting sort
- Bucket sort

• Searching algorithms

- Linear search
- Binary search
- Ternary search
- Jump search
- Exponential search

• String Manipulation Algorithms

- Reversing a string
- Reversing words
- Rotations
- Removing duplicates
- Most repeated character
- Anagrams
- Palindrome
- Recursion

SQL

SQL (Structured Query Language) is essential for querying and managing data in relational databases. It's a fundamental skill for any data scientist working with structured data.

Estimated time: 1-2 months

Learning resources: <u>YouTube Tutorial</u> <u>Full Course</u>

Essential Concepts

- Basic Operations
 - Querying data (SELECT)
 - Modifying data (INSERT, UPDATE, DELETE)
 - Filtering data (WHERE, IN, BETWEEN, LIKE, IS NULL, REGEXP)
 - Logical operators (AND, OR, NOT)
 - Sorting and limiting data (ORDER BY, LIMIT)
- Complex Queries
 - Joins (INNER, OUTER, SELF, NATURAL, CROSS)
 - Aggregate functions (MAX, MIN, AVG, SUM, COUNT)
 - Grouping data (GROUP BY, HAVING, ROLLUP)
 - Subqueries
- Views
- Stored Procedures and Functions
- Triggers and Events
- Transactions

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- Transaction isolation levels
- BEGIN, COMMIT, ROLLBACK
- Database Design
 - Normalization
 - Database integrity with primary keys, foreign keys, and constraints
- Indexes
- Security and Permissions: Managing users and privileges

Mathematics and Statistics

Mathematics and statistics are fundamental for understanding data science concepts. They provide the theoretical foundation for data analysis and machine learning algorithms.

Estimated Time: 2-3 months

- Linear Algebra
 - Vectors and matrices
 - Matrix operations
 - Eigenvalues and eigenvectors
 - Singular Value Decomposition (SVD)
- Calculus
 - Derivatives and gradients
 - Partial derivatives
 - Chain rule
 - Integrals
- Probability
 - Probability distributions
 - Bayes' theorem
 - Random variables
 - Expectation and variance

• Statistics

- Descriptive statistics (mean, median, mode, standard deviation)
- Hypothesis testing
- Confidence intervals
- Regression analysis

Data Collection and Visualization

Effective data handling, processing, and visualization are critical for preparing data for analysis and communicating results. This involves cleaning, transforming, exploring, and visualizing data.

Estimated Time: 1-2 months

- Data Cleaning
 - Handling missing values
 - Removing duplicates
 - Outlier detection and treatment
- Data Transformation
 - Normalization and standardization
 - Encoding categorical variables
 - Feature scaling
- Exploratory Data Analysis (EDA)
 - Summary statistics
 - Data visualization (using libraries like Matplotlib, Seaborn)
 - Identifying patterns and correlations
- Data Integration
 - Merging and joining datasets
 - Data aggregation
 - Handling different data formats (CSV, JSON, SQL)

Machine Learning Fundamentals

Understanding machine learning fundamentals is crucial for building predictive models. This involves learning about different algorithms and how to train and evaluate models.

Estimated Time: 2-3 months

Essential Concepts

- Supervised Learning
 - Regression algorithms (e.g., linear regression, logistic regression)
 - Classification algorithms (e.g., decision trees, k-nearest neighbors, support vector machines)
- Unsupervised Learning
 - Clustering algorithms (e.g., K-means, hierarchical clustering)
 - Dimensionality reduction techniques (e.g., PCA, LDA)

Model Evaluation

- Accuracy
- Precision-Recall
- F1 score
- ROC-AUC
- Confusion matrix
- Model Training
 - Train-test split
 - Cross-validation
 - Hyperparameter tuning
- Overfitting and Underfitting

Data Science Roadmap

- Recognizing overfitting and underfitting
- Techniques to mitigate overfitting (e.g., regularization, dropout)
- Model complexity management

Deep Learning

Deep learning is a subset of machine learning that involves neural networks with many layers. These models are powerful for handling large-scale data and complex patterns.

Estimated Time: 2-3 months

- Neural Networks
 - Basics of neural networks
 - Activation functions
 - Forward and backward propagation
- Advanced Neural Networks
 - Convolutional Neural Networks (CNNs)
 - Recurrent Neural Networks (RNNs)
- Deep Learning Frameworks
 - Tools: TensorFlow, PyTorch, Keras

Specialization

Specializing in a specific area of data science allows you to develop expertise and stand out in the field. Two popular tracks are Natural Language Processing (NLP) and Computer Vision.

Estimated Time: 2-3 months

Essential Concepts

- Natural Language Processing (NLP)
 - Text preprocessing (tokenization, stemming, lemmatization)
 - Sentiment analysis
 - Named entity recognition (NER)
 - Language modeling (using libraries like NLTK, SpaCy, Hugging Face)

• Computer Vision

- Image Classification: Techniques and models
- Object Detection: Algorithms like YOLO, SSD
- Image Segmentation: Semantic and instance segmentation
- Generative Models: GANs in computer vision

Big Data (Optional)

Big data skills are valuable for processing and analyzing large datasets, which is essential for certain data science roles. Understanding big data technologies can enhance your capabilities and make you more competitive in the job market.

Estimated Time: 2-3 months

- Big Data Frameworks: Hadoop, Spark
- Data Processing: MapReduce, Spark SQL
- Data Storage: HDFS, NoSQL databases (Cassandra, MongoDB)
- Data Ingestion: Kafka, Flume

Learning to code is a journey. Be patient with yourself and stay persistent, even when things get tough.

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