





DLI Accelerated Data Science Teaching Kit

# Lecture 1.1 - Teaching Kit Modules Overview



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#### **Teaching Kit Module Goals**

- Teach fundamental and advanced topics in data collection and preprocessing, accelerated data science with <u>RAPIDS</u>, scalable and distributed computing, GPU-accelerated machine learning, data visualization and graph analytics
- Content also covers culturally responsive topics such as fairness and data bias, as well as challenges and important individuals from underrepresented groups
- This 3<sup>rd</sup> release of the Accelerated Data Science Teaching Kit now includes focused modules covering:
  - Graph Analytics
  - Streaming Data
  - Genomics
  - Text Analytics
  - CPU vs. GPU-accelerated Data Science
  - Working in Data Science Teams
  - Code Backup and Version Control
  - Team Project (Fake News Detection)







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Module 1:
Introduction to
Data Science

- 1.1: Teaching Kit Modules Overview
- 1.2: What is Data Science?
- 1.3: Why is Data Science Important?
- 1.4: Learning Goals and Expectations
- 1.5: Analytics Building Blocks
- 1.6: Example Data Science Project 1: Apolo Graph Exploration
- 1.7: Example Data Science Project 2: NetProbe Auction Fraud Detection
- 1.8: Data Science Buzzwords, Hype Cycle, General vs Narrow Al
- 1.9: Career Paths and Challenges
- 1.10: Diversity Gaps in Science and Engineering
- 1.11: Hidden Figures in Data Science from Underrepresented Groups

Lab: Introduction to RAPIDS and cuDF







**Module 2:**Data Collection

2.1: Collecting Data

2.2: Scraping Data

2.3: Popular Scraping Libraries

2.4: Data Annotation and Data Quality

2.5: SQLite as Simple, Effective Storage

2.6: SQL Refresher

2.7: Beware of Missing Indexes

Lab: Data Collection via API

Lab: Data Annotation in Active Learning

Lab: GPU-accelerated SQL with BlazingSQL

DLI Online Course Section: Accelerating End-toEnd Data Science Workflows, Section 1:

**GPU-accelerated Data Manipulation** 







3.1: Introduction to Data Pre-processing 3.2: Data Cleaning and Statistical Preprocessing 3.3: Data Cleaners: OpenRefine and Wrangler Module 3: 3.4: Feature Selection: Introduction to Filter Methods 3.5: Feature Selection: Introduction to Model-based Methods Data Pre-3.6: Feature Reduction: PCA processing (ETL) Lab: Data Wrangling with OpenRefine Lab: Outlier Detection with IQR Lab: Feature Reduction with PCA Module 4: 4.1: Sources of Bias and Fairness Measures Data Ethics and 4.2: Tools for Discovering and Interpreting Bias in Models 4.3: Challenges Faced by Underrepresented Groups Relating to Data Ethics and Bias Reducing Bias in Lab: Classifier Audit with FairVis Data Sets 5.1: Knowledge Graph Module 5: 5.2: Data De-duplication Data Integration







Module 6: Data Analytics, Concepts and Tasks	6.1: Break Complex Problems into Simpler Ones: Part 1 6.2: Break Complex Problems into simpler Ones: Part 2
Module 7: Visualization 101	<ul> <li>7.1: What is Info Vis and Why it is Important</li> <li>7.2: Human Perception</li> <li>7.3: Gestalt Psychology</li> <li>7.4: Chart Basics</li> <li>7.5: Colors</li> <li>7.6: Visual Exploratory Data Analytics with cuXFilter</li> <li>Lab: Creating Visualizations</li> </ul>
Module 8: Fixing Common Visualization Issues	8.1: Fixing Bar Charts, Line Charts, Tables and More 8.2: Applying What You've Learned 8.3: Crown Jewel, Self-contained Figures and More Tips







11.4: RAPIDS and Spark

(Spark)

Lab: Accelerated Spark with RAPIDS on AWS

9.1: Why Learn D3? 9.2: Prerequisites: Javascript and SVG 9.3: D3 Overview Module 9: 9.4: Enter-Update-Exit Data 9.5: Attributes, Styles, Classes and Text Visualization for 9.6: Scales and Axes Web (D3) 9.7: Dynamic Data and Interaction Lab: Web-based Visualization (D3) Lab: Server and Client-side Visualizations (Datashader, Plotly, Plotly Dash) Module 10: 10.1: Big Data is Common. How to Store It? 10.2: Why Hadoop? Scalable 10.3: MapReduce Overview Computing 10.4: Example MapReduce Program (Hadoop, 10.5: How to Try Hadoop 10.6: Pig and Hive Hive) Lab: Hadoop Module 11: 11.1: Spark Overview 11.2: Example Spark Programs Scalable 11.3: Spark SQL and Other Spark Libraries Computing







Module 12:

Scalable Computing (Hbase) 12.1: HBase Overview

12.2: How HBase Scales Up Storage

12.3: How to Use HBase

12.4: Learn More About Hbase

Module 13:

Scalable
Computing (Dask and UCX)

13.1: Using Dask and UCX with RAPIDS and BlazingSQL







Module 14:
Machine
Learning
(Classification)

14.1: Overview

14.2: Introduction to Supervised Learning

14.3: Linear Regression

14.4: RAPIDS Acceleration: Linear Regression

14.5: Overfitting and Cross Validation

14.6: Decision Tree

14.7: Visualizing Classification: ROC, AUC, Confusion Matrix

14.8: Bagging

14.9: Random Forests

14.10: RAPIDS Acceleration: Random Forest

14.11: Boosting

14.12: XGBoost with RAPIDS

14.13: k-NN with RAPIDS

**Lab: Decision Tree Classification Clustering** 

Lab: Classification (Random Forest)

Lab: Image Classification with RAPIDS-based Random Forest

DLI Online Course Section: Accelerating End-to-End Data Science Workflows, Section 2:

**GPU-accelerated Machine Learning** 







Module 15:

Machine
Learning
(Clustering and
Dimensionality
Reduction)

15.1: Introduction to Unsupervised Learning

15.2: KMeans and Hierarchical Clustering

15.3: RAPIDS Acceleration: KMeans

15.4: **DBSCAN** 

15.5: t-SNE

15.6: UMAP

15.7: Visualizing Clusters

15.8: RAPIDS Acceleration: PCA, UMAP, DBSCAN

**Lab: KMeans Clustering** 

Lab: Dimensionality Reduction and Visualization







Module 16: Neural Networks 16.1: Introduction to Artificial Neural Networks

16.2: Activation Function and Perceptron

16.3: Multilayer Perceptron

16.4: Advanced Deep Neural Networks

**Lab: Binary Classification with Perceptron** 

DLI Online Course: Getting Started with Deep Learning
DLI Online Course: Deep Learning at Scale with Horovod
DLI Online Course: Getting Started with Image Segmentation

**DLI Online Course: Modeling Time-Series Data with Recurrent Neural Networks in Keras** 

DLI Online Course: Medical Image Classification Using the MedNIST Dataset
DLI Online Course: Image Classification with TensorFlow: Radiomics — 1p19q

**Chromosome Status Classification** 







Module 17: Graph Analytics	17.1: How to Represent and Store Graphs 17.2: Graph Power Laws 17.3: Centralities: Degree, Betweenness, Clustering Coefficient 17.4: PageRank and Personalized PageRank 17.5: Interactive Graph Exploration Lab: Graph Analytics with cuGraph
Module 18: Streaming Data	18.1: Machine Learning for Streaming Data Analysis 18.2: Data Preprocessing 18.3: Learning Process 18.4: Reasoning and Data Resource Lab: Sales Forecasting via RAPIDS Linear Regression
Module 19: Genomics	19.1: Introduction to Genomics 19.2: Data Preprocessing 19.3: Clustering and Validation 19.4: Statistical Analysis Lab: Cancer Recognition on Genomics Data via Decision Tree Algorithm







Module 20: Text Analytics 20.1: Basics: Preprocessing, Representation, Word Importance

20.2: Latent Semantic Indexing (Singular Value Decomposition)

20.3: SVD: Dimensionality Reduction, and Other Uses

20.4: Text Visualization

Lab: Latent Semantic Indexing for Text via Singular Value Decomposition (cuML)

Module 21: CPU vs. GPUaccelerated Data Science

21.1: RAPIDS Benefits

21.2: Refactoring Workloads

**Lab: Accelerating Workloads Using RAPIDS** 

DLI Online Course Section: Accelerating End-to-End Data Science Workflows, Section 3:

**Data Analysis to Save the UK** 







Module 22: Working in Data Science Teams	22.1: Forming Great Teams 22.2: Project Idea Checklist: Heilmeier Questions 22.3: Pay Attention to Software Licenses Early On
Module 23: Code Backup and Version Control	23.1: Git: Overview and Benefits 23.2: Warning! Keep Your Repository Private Initially 23.3: GitHub and Bitbucket
Module 24: Team Project (Fake News Detection)	24.1: Introduction to Project 24.2: Evaluation of Team Project Team Project: Fake News Detection (cuML)















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## Thank You