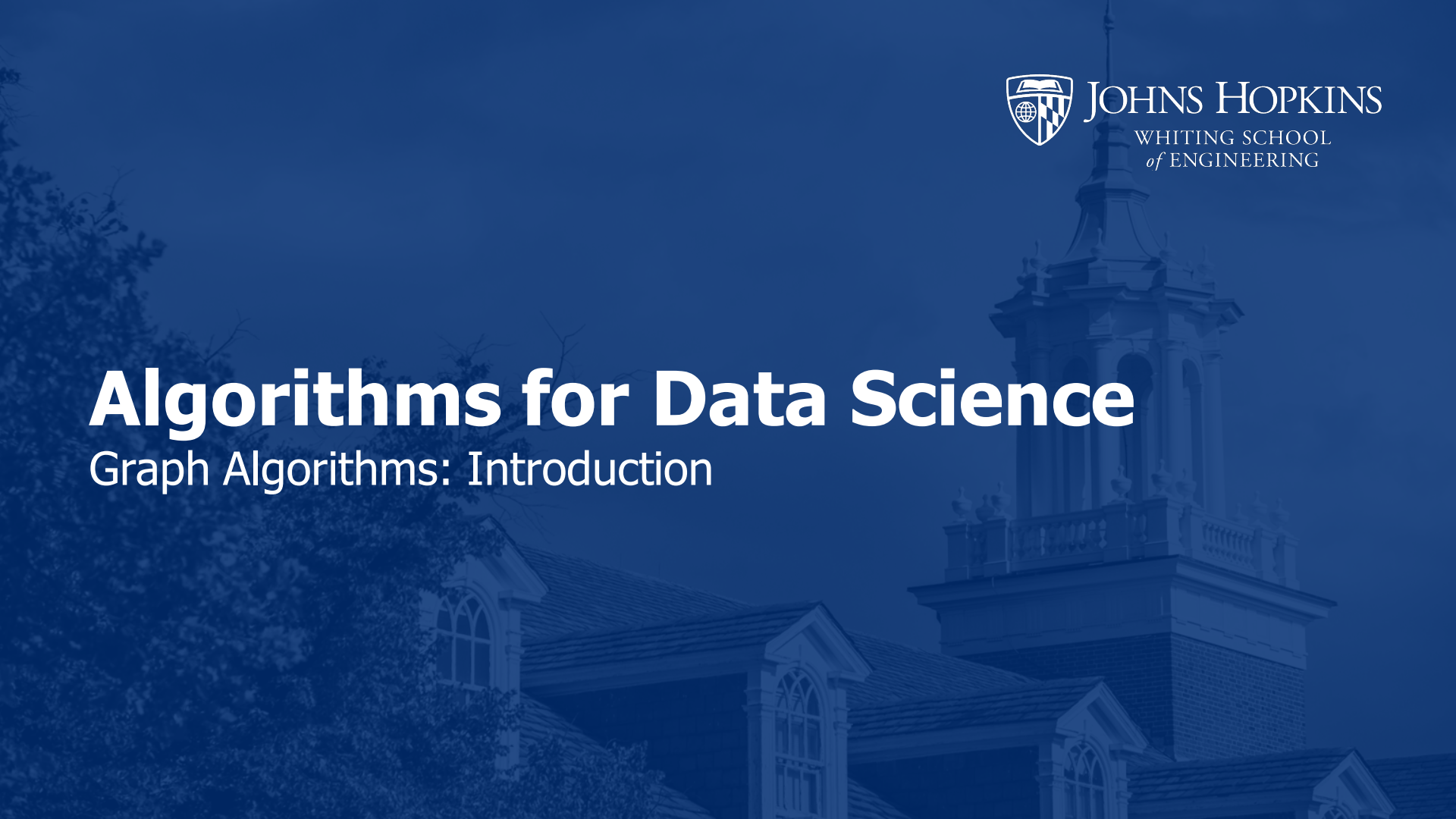


Algorithms for Data Science

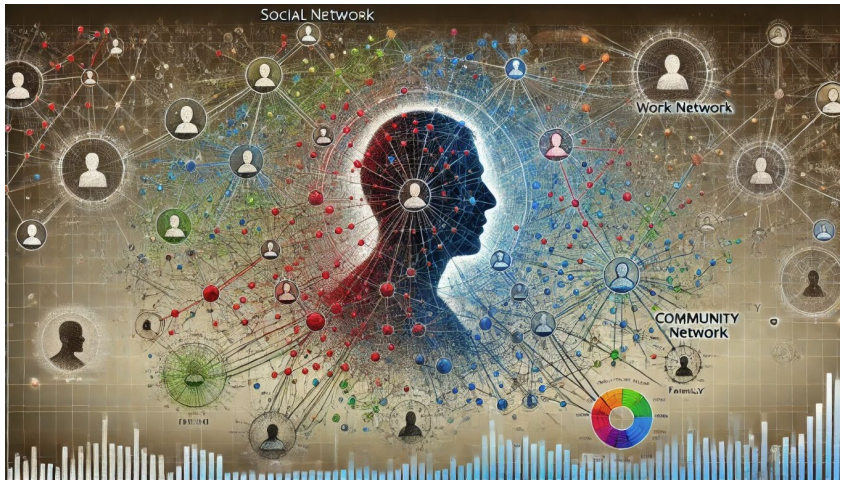
Graph Algorithms: Introduction

Module Learning Objectives

- 7.1 Describe the mathematical foundations of key graph algorithms, including Breadth-First Search (BFS), Depth-First Search (DFS), Minimum Spanning Trees (MST), and Bayesian Networks.
- 7.2 Analyze the computational complexity of graph algorithms and evaluate their efficiency in terms of time and space complexity.
- 7.3 Implement fundamental graph traversal algorithms such as BFS and DFS in Python and compare their practical applications.
- 7.4 Apply decision trees and Bayesian networks to model probabilistic dependencies and make informed inferences in data science problems.
- 7.5 Evaluate the effectiveness of graph-based clustering methods such as the Louvain Algorithm and Spectral Clustering in identifying network communities.
- 7.6 Construct and optimize graph-based feature engineering techniques for machine learning applications, leveraging graph embeddings and community detection.
- 7.7 Critique recent advances in graph algorithms, discussing their impact on scalability, deep learning, and real-world applications.

Why Graph Algorithms?

Their role in understanding connections, relationships, and structures in data is useful for a variety of Data Science and AI applications



They underpin models in Natural Language Processing, Computer Vision, and Bayesian inference.

Types of Graph Algorithm Problems

Traversal Algorithms

Minimums Spanning Trees

Decision Making

Community Detection

Semi-Supervised Learning

Clustering and Dimensionality Reduction

Graph Algorithm Problem Components

Graph Structures

- **Types of Graphs**: Directed vs Undirected Weighted vs Unweighted
- **Graph Representations**: Adjacency List, Adjacency Matrix
- Does the algorithm require a directed graph, or does it work with any type?

Graph Operations

- **Common Operations**: Traversing (BFS, DFS), Shortest Paths, Connectivity Checks.
- **Graph Modifications**: Edge Removal, Node Addition.
- Does the algorithm focus on finding paths, grouping nodes, or optimizing structures?

Constraints & Complexity

- **Time Complexity Considerations**: $O(V+E)$ for BFS/DFS vs. $O(V^2)$ for adjacency matrices.
- **Memory Usage**: Trade-off between speed and storage (Adjacency List vs. Adjacency Matrix).
- Is the graph too large for exact algorithms, requiring approximations instead?

Application of Graph Algorithms

Logistics

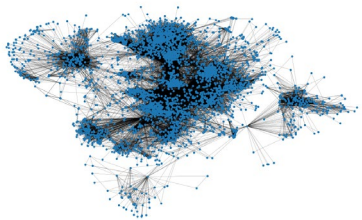
Planning the most efficient delivery routes

Cybersecurity

Security threats are best understood as anomalies in a network

Healthcare

Analyze molecular interactions in drug discovery



Social Networks

Analyze connections between users, behaviors, and preferences