

# **CS520: KNOWLEDGE GRAPHS**

**Data Models, Knowledge Acquisition, Inference, Applications**

**Lectures and Invited Guests**

**Spring 2021, Tu/Thu 4:30-5:50, [cs520.Stanford.edu](https://cs520.stanford.edu)**

**Learn about the basic concepts,  
latest research & applications**

# Knowledge Graphs Seminar

- What is a Knowledge Graph?
- How to Create a Knowledge Graph?
- How to Reason with and Access Knowledge Graphs?
- Applications
- Implementation Tools
- Future Research

# How do Knowledge Graphs Relate to AI?

# Outline

- Knowledge Graphs as a Test Bed for AI
- Graph Data Science
- Knowledge Graphs for the ultimate vision of AI

# Knowledge Graphs as a Testbed for AI

- Two-way symbiosis
  - Knowledge Graphs enable many AI applications
  - AI algorithms can be used to create Knowledge Graphs

# Knowledge Graphs as Enablers of AI

- Knowledge Graphs enable
  - A personal assistant to get more things done
  - A recommendation system to offer better recommendations
  - A search engine to answer questions

# AI as an Enabler for Knowledge Graphs

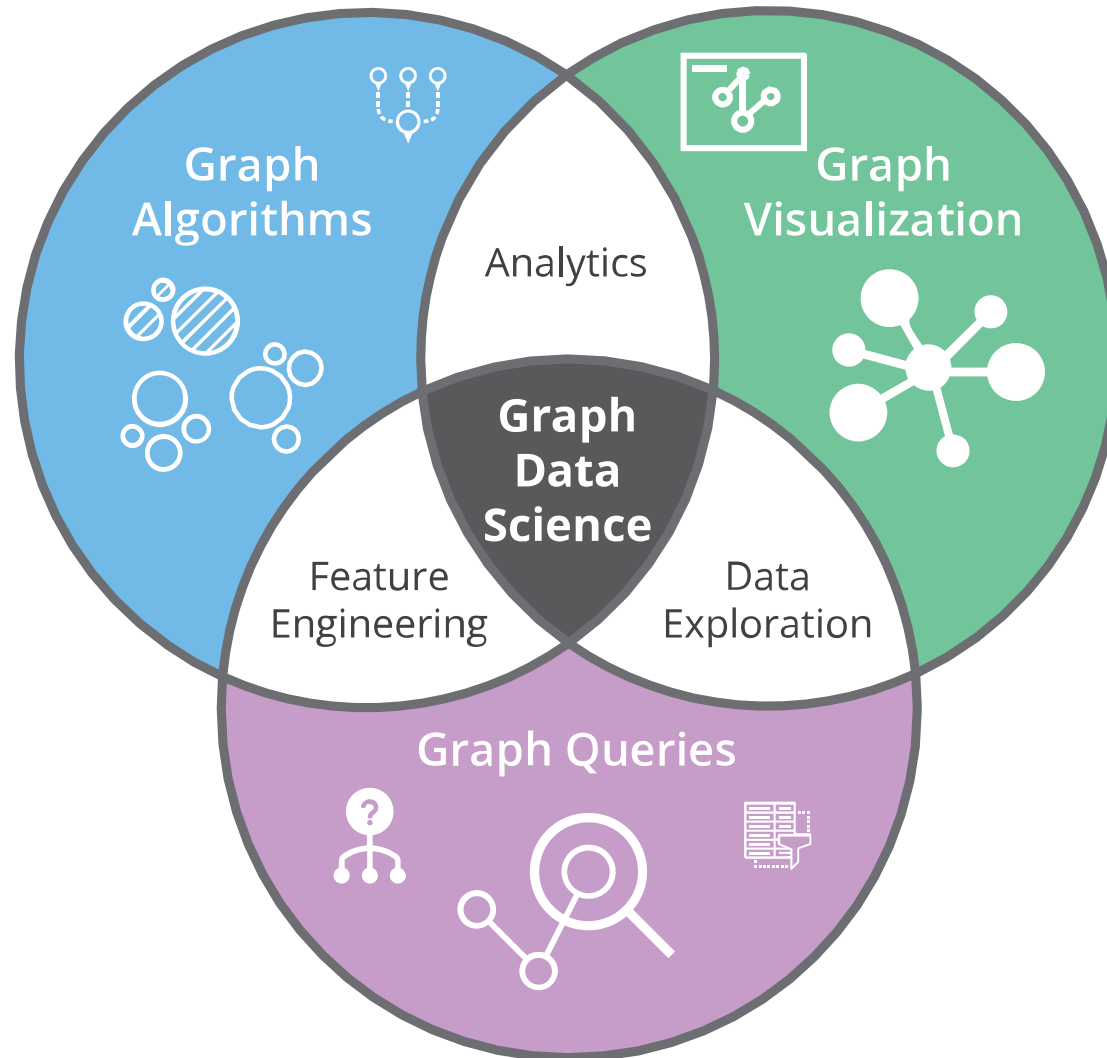
- Machine learning / NLP algorithms play a central role in
  - Schema mapping entity linking
  - Entity and relation extraction
  - Data cleaning and anomaly detection
  - Inference and question answering

# Graph Data Science

- Availability of huge amount of data
- Derive knowledge from the structure in data

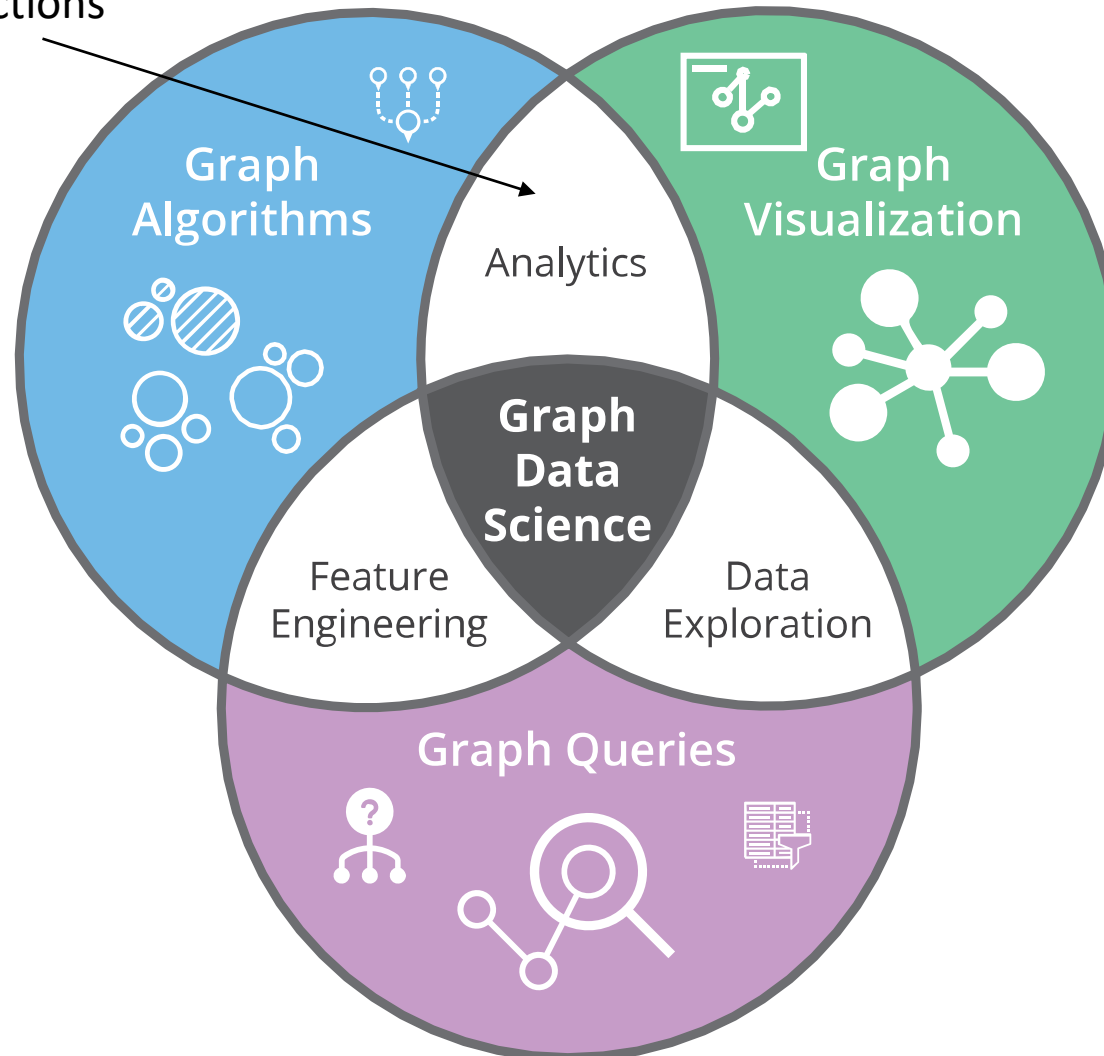


# Graph Data Science



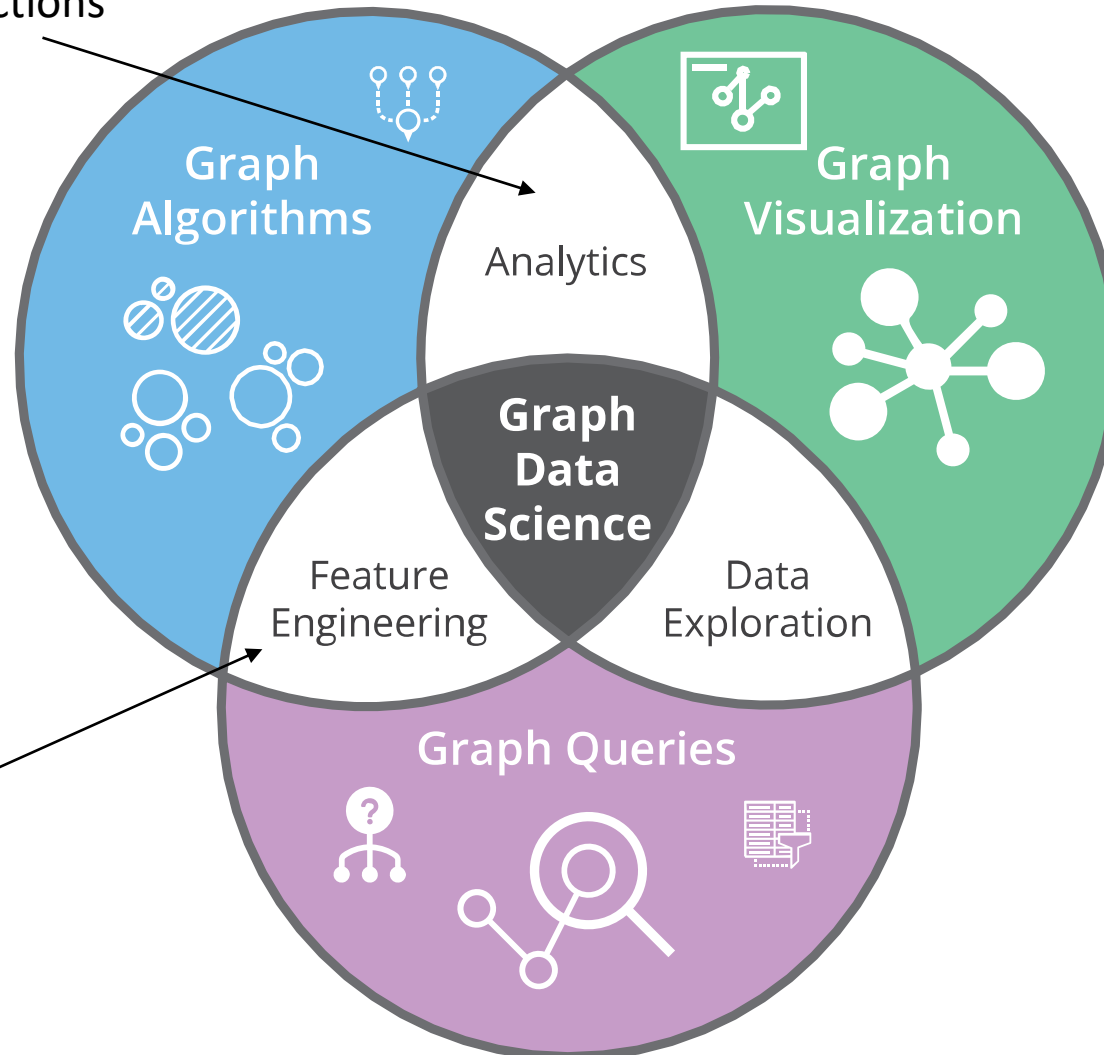
# Graph Data Science

Use Machine Learning for Predictions



# Graph Data Science

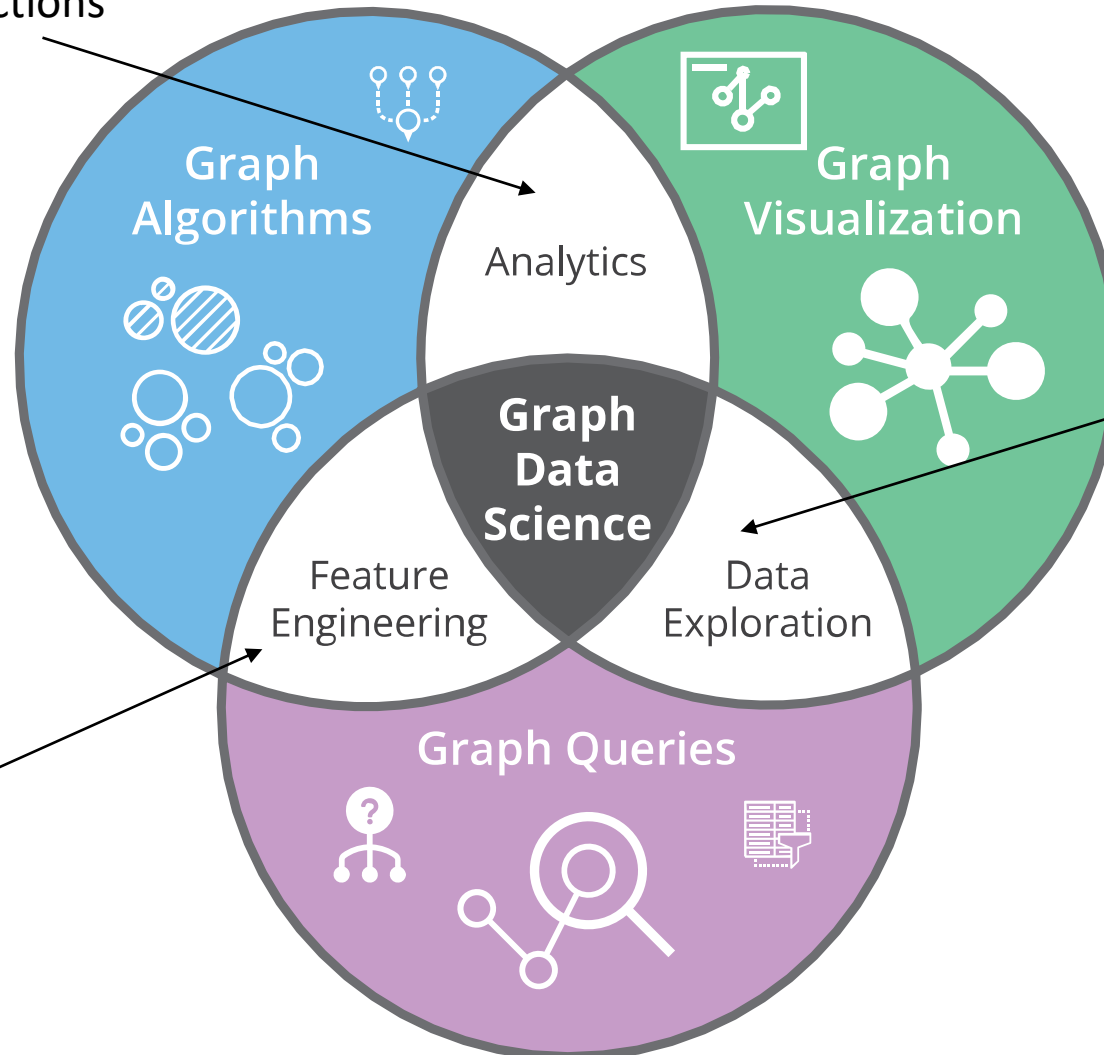
Use Machine Learning for Predictions



Requires Feature Engineering

# Graph Data Science

Use Machine Learning for Predictions



User Experience for Large Datasets

Requires Feature Engineering

# Knowledge Graphs for AI

- Knowledge Graphs have been used in AI since the beginnings
  - Semantic networks
  - Description Logics
  - Rule Languages
  - Graphical Models

# Knowledge Graphs for AI

- But Knowledge Acquisition has been an equally central concern
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  - Description Logics
  - Rule Languages
  - Graphical Models

Knowledge Engineering  
Inductive Learning  
Machine Learning

# Knowledge Graphs for AI

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Knowledge Engineering

Inductive Learning

Machine Learning

Scale

Bottom-up construction

Mixed modes of construction

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Knowledge Engineering

Inductive Learning

Machine Learning

Scale

Bottom-up construction

Mixed modes of construction

Small scale intelligence

Top-down design

Ability to write what you know

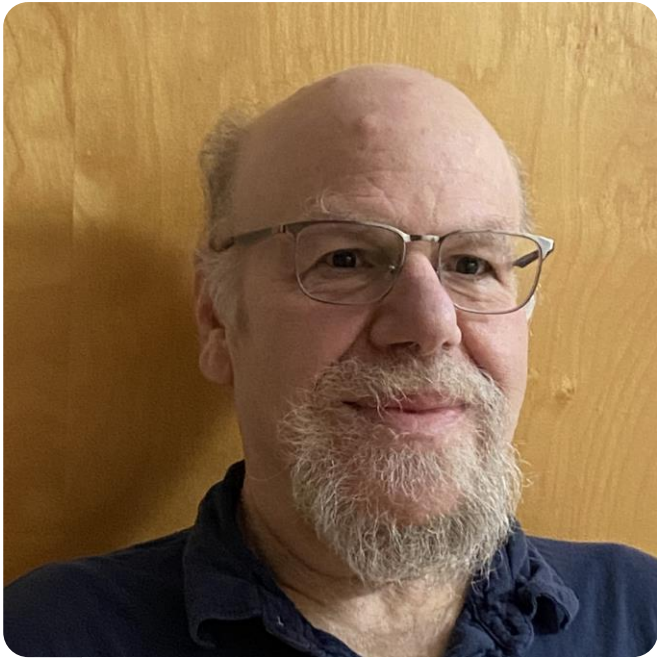


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Knowledge Engineering  
Inductive Learning  
Machine Learning

Programs that have a model of the domain, formulate a hypothesis, design an experiment, provide explanations, remain an open challenge for AI



**Prof. James A. Hendler**  
**Semantics for scaling the Knowledge Graphs**



**Dr. Douglas Lenat**  
**Knowledge Graphs++**