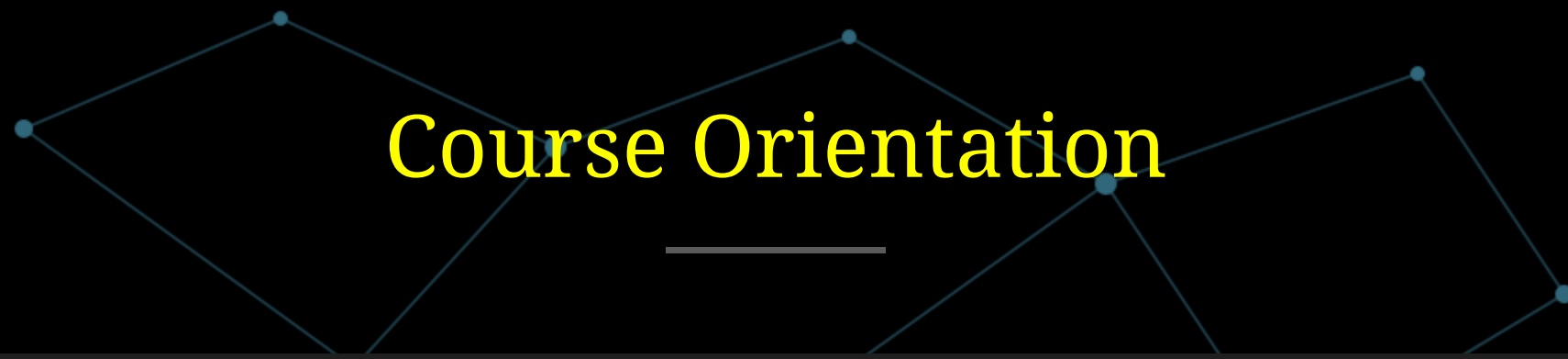




Course Orientation

Neural Network **Graph Machine Learning**



Hongik University

Giseop Noh

About the Instructor



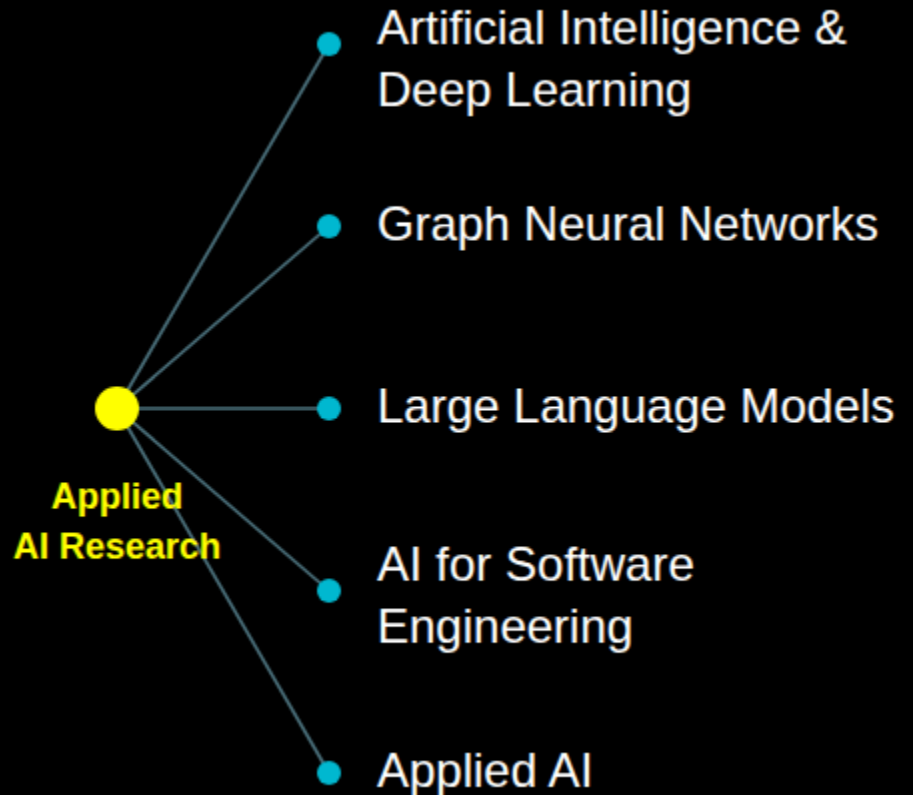
Giseop Noh, Ph.D.

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Communications Engineering
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RESEARCH LAB

DeepShark Lab

RESEARCH INTERESTS



What Is This Course About?

Learning from data is important.

Learning from relationships is equally important.

Traditional ML

Data



Model → Prediction

Each sample is treated independently

Graph ML

Data + Relationships

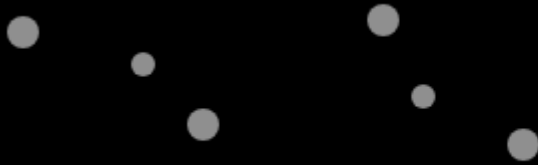


Model → Prediction

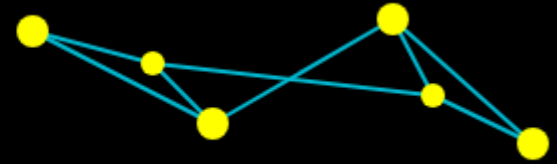
Samples inform each other via structure

This course studies machine learning where relationships and structure matter.

Why Learn Graph Machine Learning?



isolated objects



objects + relationships

01

Real-world entities are often **connected**

02

Relationships carry **critical information**

03

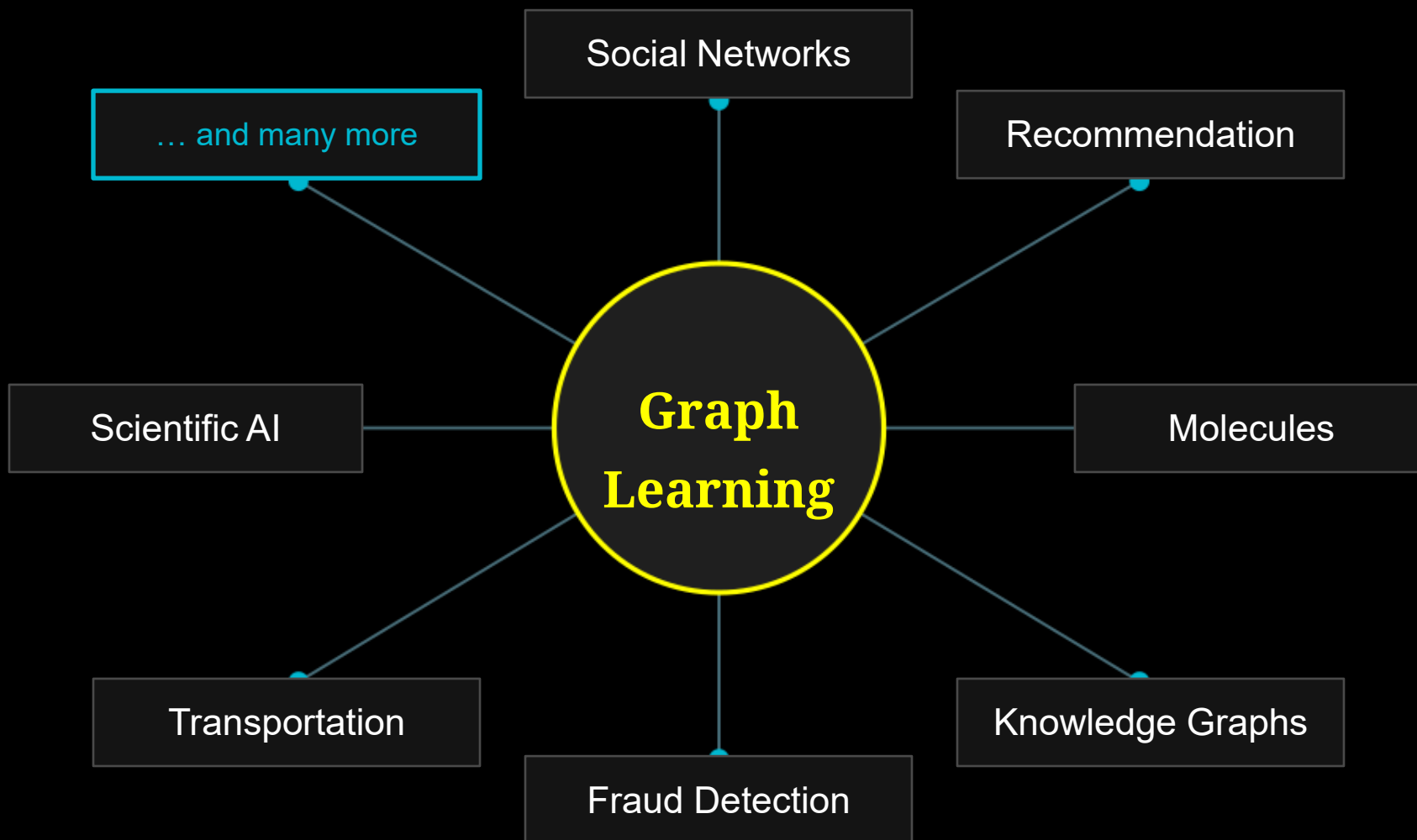
Many AI problems are naturally **relational**

04

Graph learning combines **features + structure**

AI is not only about objects.
It is also about **relationships between objects.**

Graphs Are Everywhere



What Will We Learn?

1 FOUNDATION

Weeks 2 – 4

Graph Representation

Node Embedding



2 GRAPH NEURAL NETWORKS

Weeks 5 – 9

GCN

Message Passing

Graph-Level Learning



3 ADVANCED GRAPH LEARNING

Weeks 10 – 12

Scalable GNNs

Advanced GNNs

Self-Supervised Learning



4 FRONTIERS

Weeks 13 – 14

Graph Transformers · Foundation Models

Course Schedule

FIRST HALF

Weeks 1 – 7 · Foundations and core GNN models

Week 1 Course Orientation

Week 2 Introduction to Graphs

Week 3 Graph Representation

Week 4 Node Embedding

Week 5 Permutation Invariance & Equivariance

Week 6 Graph Convolutional Networks (GCN)

Week 7 Message Passing Neural Networks

Week 8 MID-TERM EXAM

Covers Weeks 1 – 7

Course Schedule

SECOND HALF

Weeks 9 – 14 · Scaling up, frontiers, and research

Week 9 Graph-Level Representation Learning

Week 10 Graph Sampling and Scalable GNNs

Week 11 Advanced Graph Neural Networks

Week 12 Self-Supervised Learning on Graphs

Week 13 Graph Transformers & Graph Foundation Models

Week 14 Applications and Recent Research Trends

Week 15 **FINAL EXAM**

Full-semester coverage

Learning Outcomes

By the End of This Course, You Will Be Able To:

UNDERSTAND

Fundamental concepts of **graph learning**

EXPLAIN

Major **GNN architectures**

DESIGN

Graph learning solutions for new problems

IMPLEMENT

Build and evaluate **modern GNNs**

ANALYZE

Critically analyze **research papers**

APPLY

Graph learning to **real-world problems**

COMPETENCY PROGRESSION

Understand → Design → **Implement** → **Analyze** → **Apply**

How We Will Learn

Every topic passes through the same four-stage pipeline.

01

Learn the Concept

Lecture

Why does this idea exist?



02

Understand the Model

Mathematics & Architecture

How exactly does it work?



03

Implement It

Programming Assignments

Can I build it myself?



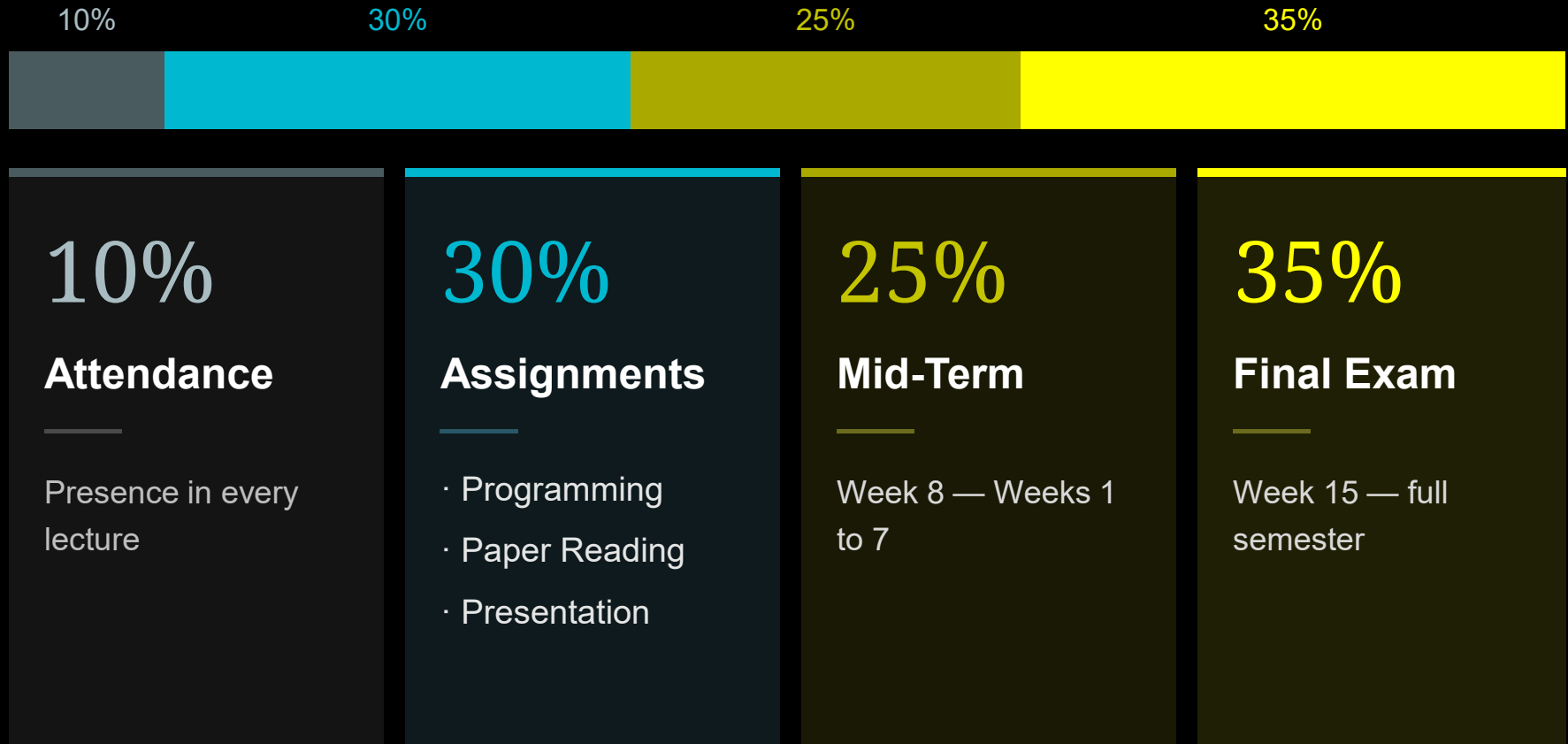
04

Think Like a Researcher

Paper Reading & Discussion

What is still unsolved?

Assessment & Grading



COURSE POLICY

- Active participation in class discussions is expected.
- Missing **five or more classes** without valid reasons results in an **F grade**.

What You Need Before Starting

Recommended background — not a barrier, just a head start.

01

Programming

- Python
- PyTorch basics

02

Mathematics

- Linear Algebra
- Probability
- Basic Calculus

03

Machine Learning

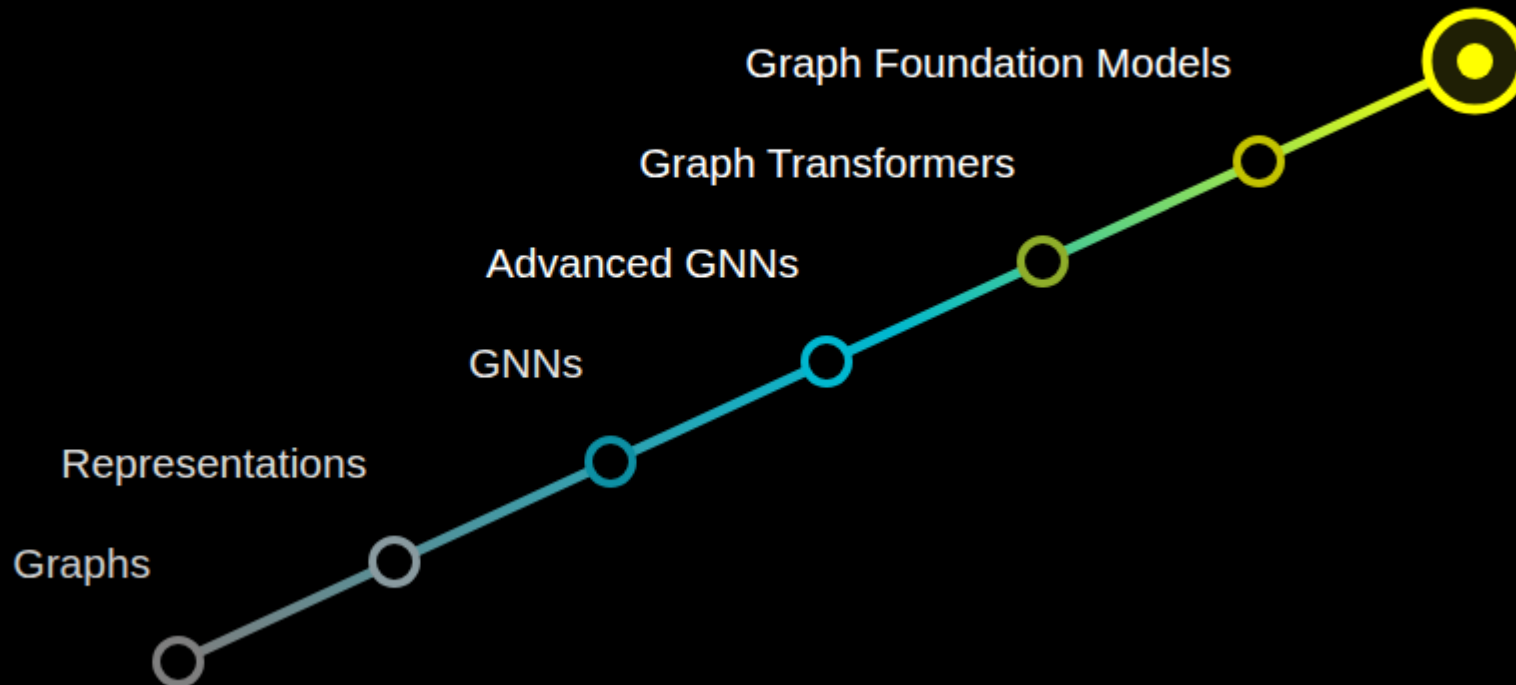
- Neural Networks
- Gradient Descent
- Representation Learning

Don't worry! No prior knowledge of GNNs is required.

We will build everything from the ground up, starting next week.

The Journey Ahead

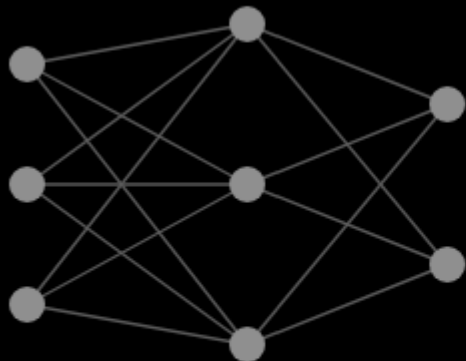
RESEARCH



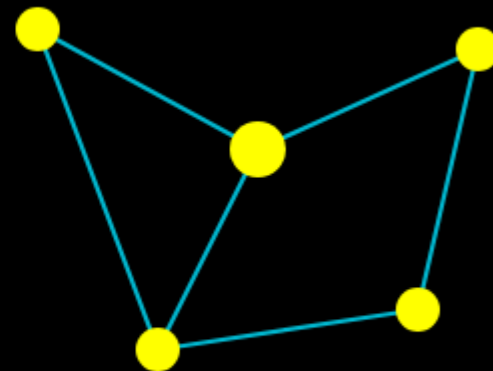
This course aims beyond learning existing models —
toward exploring graph-learning research.

Next: Introduction to Graphs

WEEK 02 · COMING UP



Neural Networks



Graph Structure

Before learning Graph Neural Networks,
we first need to understand graphs.

See you next week. — Questions are always welcome.