

# **Collective Learning:**

## **The growth, diffusion, and valuation of knowledge**

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### **Synopsis**

Why was Netflix able to outcompete Blockbuster? What role did migrants play in the early industrialization of the United States? How did Sony become a leader in audio equipment? This course will answer these and other questions by introducing students to the basic facts and theories explaining the growth, diffusion, and valuation of knowledge. By the end of this course, students will be equipped with a basic understanding of a century's worth of research on the temporal and spatial dynamics of knowledge and with a practical understanding of some of the tools used to study its growth, diffusion, and valuation.

This course will cover multiple aspects of collective learning, from the organizational learning literature focused on firms and teams, to recent work on economic complexity studying knowledge accumulation and diffusion in cities and nations.

This course is divided into five units. The first unit motivates the study of knowledge using practical policy examples and then moves to an introduction of the characteristics that make the study of knowledge both interesting and challenging (non-fungibility, non-rivalry, tacit and explicit knowledge, architectural knowledge, transactive memory, etc.). The second unit focuses on the temporal accumulation of knowledge (e.g. learning curves, progress curves, experience curves, forgetting curves), on the connection between different types of learning curves (e.g. disruptive innovation theory), and on the mechanisms that make transitions among learning curves difficult (e.g. architectural knowledge). The third unit focuses on the diffusion of knowledge across geographies, social networks, and activities, and will review classic and recent research on the role of migrants and social networks on the diffusion of knowledge together with the key concepts needed to understand knowledge diffusion, such as the idea of absorptive capacity. The fourth unit will explore methods to quantify the value of knowledge agglomerations that can help explain national and international variations in economic growth, inequality, and emissions. The fifth and final unit will focus on policy implications and broader lessons.

### **Requirements:**

This course is open to all senior undergraduate students, Master's students, and PhD students.

### **Starting Week**

September 9, 2024

**Syllabus:**

3 hours per week (2 x 90 minute sessions).

Week 1: Introduction & Learning Curves

Week 2: Experience Curves, Disruptive Innovation

Week 3: Architectural Knowledge & Forgetting Curves

Week 4: Geographical Knowledge Diffusion I and II

Week 5: Relatedness I and II

Week 6: Relatedness III and Economic Complexity I

Week 7: Economic Complexity II & III

Week 8: Lessons and Policy Implications

Week 9: Class project presentations I

Week 9: Class project presentations II (if needed).

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