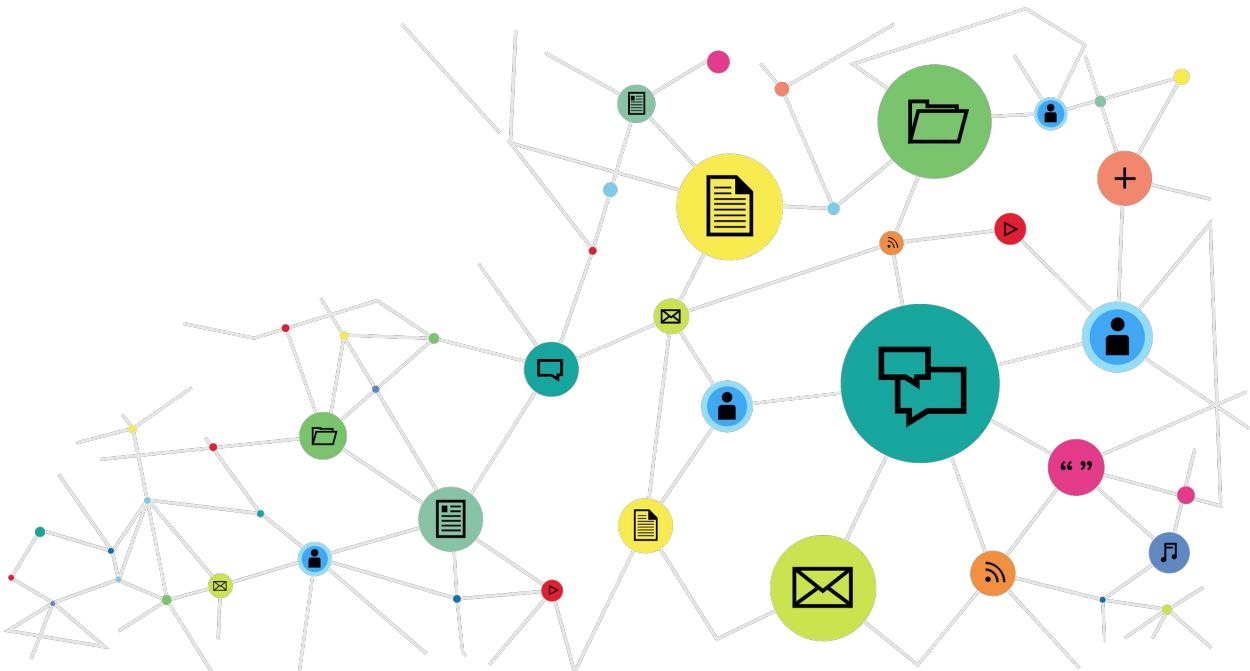
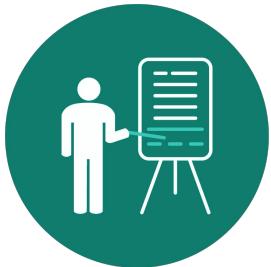


# (Social) Network Analysis



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# Teachers



## Course Schedule

Monday, h 11:00 - 13:00, room C1

Thursday, h 11:00 - 13:00, room A1



Prof. Dino Pedreschi

[dino.pedreschi@unipi.it](mailto:dino.pedreschi@unipi.it)

**When:** upon appointment

**Where:** @UniPi room 318



Prof. Giulio Rossetti

[giulio.rossetti@isti.cnr.it](mailto:giulio.rossetti@isti.cnr.it)

**When:** upon appointment

**Where:** @CNR (office C37)



Dr. Ioanna Miliou

*(teaching assistant)*

[ioanna.miliou@for.unipi.it](mailto:ioanna.miliou@for.unipi.it)

**When:** upon appointment

**Where:** @UniPi room 332

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# Course Materials

## E-learning:

- Lessons schedule
- Slides
- Announcements
- <https://elearning.di.unipi.it/>



## GitHub Repositories:

- Past Exams
- Final Project (at the end of the course!)
- Tutorials
- <https://github.com/sna-unipi>



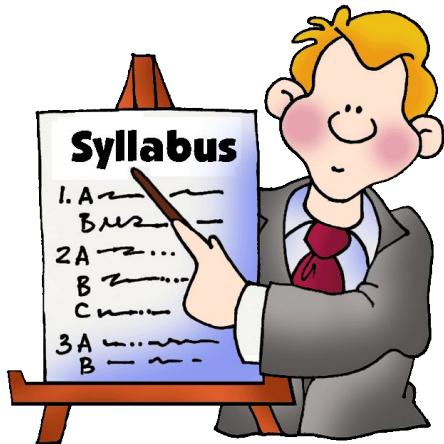
## Books:

- D. Easley, J. Kleinberg:  
Networks, Crowds, and Markets.
- A. L. Barabasi:  
Network Science
- D. Zinoviev:  
Complex Network Analysis in Python



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# General Outline



## 1st part: Network Characterization

- Networks and Graphs
- Random graphs
- It's a Small world
- Scale Free Networks
- Centrality & Assortative Mixing
- Tie Strength & Resilience

## 2st part: Applications

- Community Discovery
- Dynamic of networks
- Link Prediction
- Dynamic Community Discovery
- Diffusion: Decision based models
- Diffusion: Epidemics
- Diffusion: Opinion Dynamics

---

# Exams



## Standard Exam:

1. Written Test
2. Group Project + Oral discussion
  - o Network construction & analysis
  - o Python code + Report

## Mid Term Exams:

- Exercises on the two part of the course
- Substitute the full written test
- Examples from past years (exercises may vary):  
<https://github.com/sna-unipi/Exams>

## Chapter 1

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# Why should we care about Complex Networks?

### Summary

- Complexity
- Real world networks
- Emergence of Network Science

### Reading

- Chapter 1 & 2 of Kleinberg's book
- Chapter 1 of Barabasi's book.
- Complexity Explained



# Complex

---

[adj., v. kuh m-pleks, kom-pleks; n. kom-pleks]  
*adjective*

1. Composed of many **interconnected parts**; compound; composite: a complex highway system.
2. Characterized by a very complicated or involved arrangement of parts, units, etc.: complex machinery.
3. So complicated or intricate as to be hard to understand or deal with: a complex problem.

*Source: Dictionary.com*

Complexity, a **scientific theory** which asserts that some systems display behavioral phenomena that are completely inexplicable by any conventional analysis of the systems' constituent parts. These phenomena, commonly referred to as emergent behaviour, seem to occur in many complex systems involving living organisms, such as a stock market or the human brain.

*Source: John L. Casti, Encyclopædia Britannica*

## Complexity

Behind each **complex system**  
there is a **network**,  
that defines the **interactions**  
between the **components**.

**Suggested Reading**  
Complexity Explained  
<https://complexityexplained.github.io/>



Examples of

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# Complex Systems

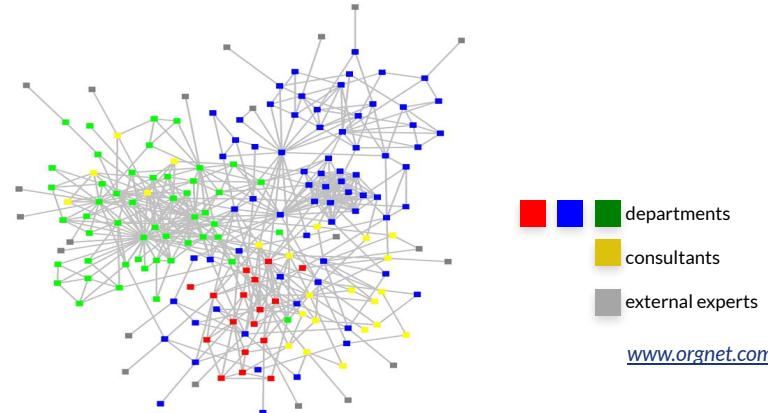
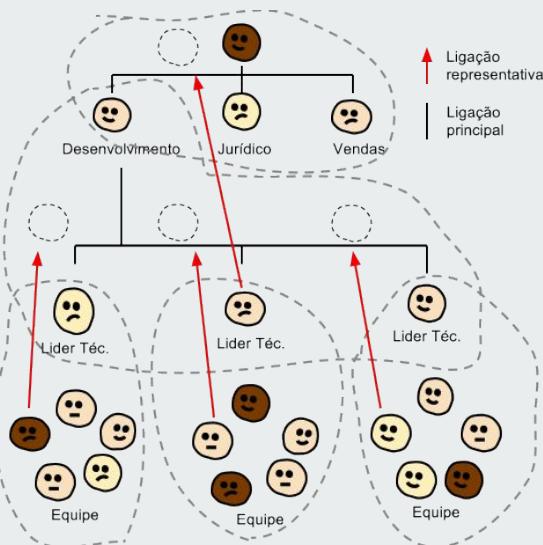
The Facebook “Social Graph”



Keith Shepherd's "Sunday Best".  
<http://baseballart.com/2010/07/shades-of-greatness-a-story-that-needed-to-be-told/>

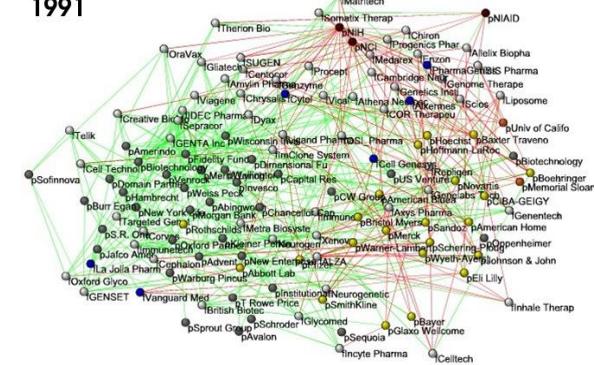
# Examples of Complex Systems

The structure of an organization



- Links:**
- Collaborations (Grey square)
  - Financial (Green square)
  - R&D (Red square)
- Nodes:**
- Companies (Green circle)
  - Investment (Grey circle)
  - Pharma (Yellow circle)
  - Research Labs (Red circle)
  - Public (Gold circle)
  - Biotechnology (Dark Blue circle)

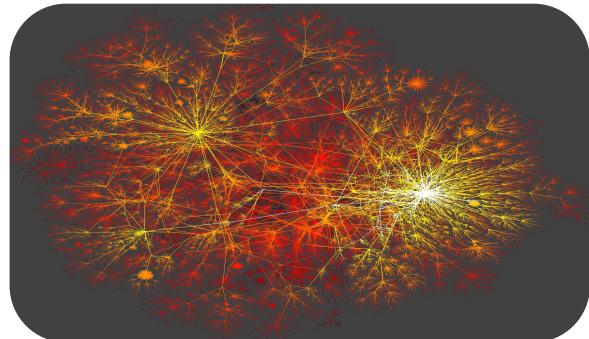
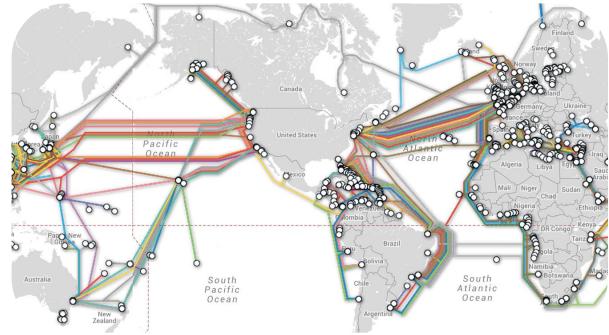
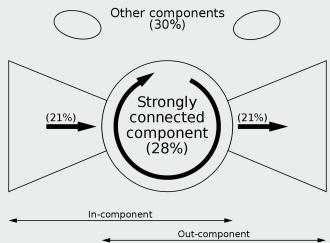
1991



<http://ecclectic.ss.uci.edu/~drwhite/Movie>

# Examples of Complex Systems

The Internet backbone,  
The World Wide Web...



Examples of

## Complex Systems

### Human Genes

Humans have only about three times as many genes as the fly, so human complexity seems unlikely to come from a sheer quantity of genes.

Rather, some scientists suggest, each human has a network with different parts like genes, proteins and groups.



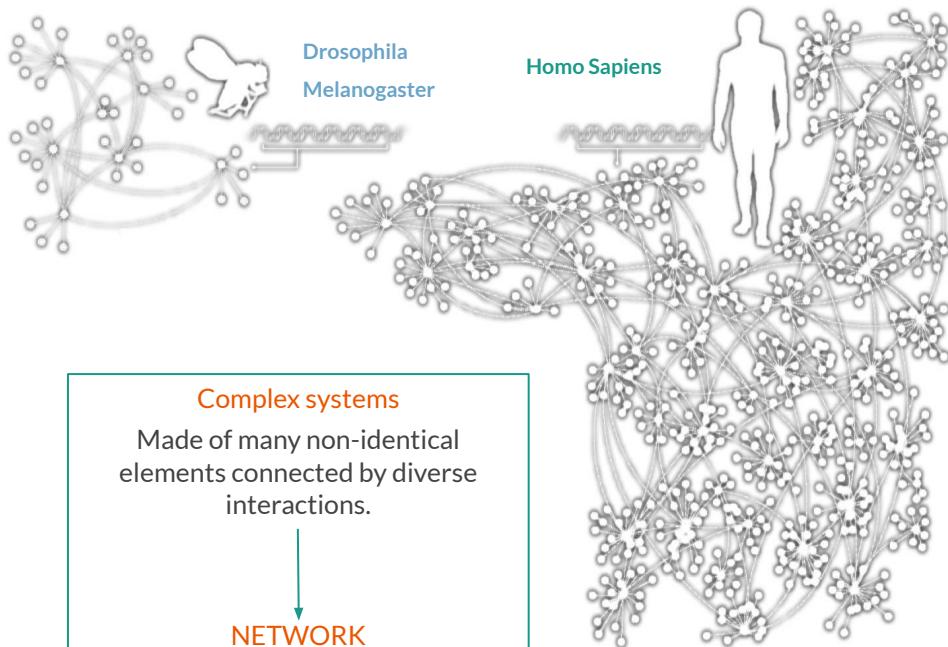
Examples of

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# Complex Systems

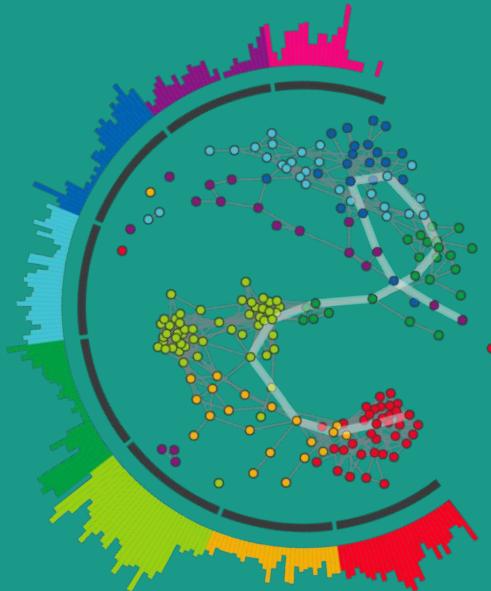
## Human Genes (cont'd)

In the generic networks shown, the points represent the elements of each organism's genetic network, and the dotted lines show the interactions between them.



# The role of networks

Behind each system studied in complexity there is an intricate wiring diagram, or a **network**, that defines the interactions between the component.



We will never understand **complex system** unless we map out and understand the networks behind them.

Examples of

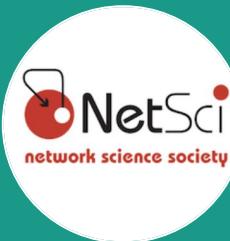
# Real world Networks



Type: Social  
Nodes: Individuals  
Links: Social relationship



Type: Actor connectivity  
Nodes: Actors  
Links: Cast jointly



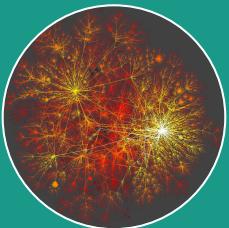
Type: Scientific Collaborations  
Nodes: Researchers  
Links: Co-Authorships



Type: Communication  
Nodes: Phones, Airports..  
Links: Phone calls, Flights..

Examples of

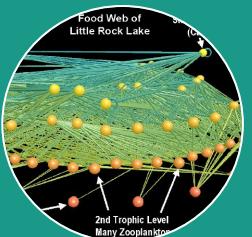
## Real world Networks (cont'd)



Type: Technological  
Nodes: PC, Routers  
Links: Physical lines



Type: Scientific Citation  
Nodes: Papers  
Links: Citations



Type: Biological  
Nodes: Species  
Links: Trophic interactions



Type: Mobility  
Nodes: Individuals, Cars...  
Links: Co-Location...

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# The Emergence of Network Science

## The (urgent) need to understand complexity

Despite the challenges complex systems offer us, we cannot afford to not address their behavior, a view increasingly shared both by scientists and policy makers.

Networks are not only essential for this journey, but during the past decade some of the most important advances towards understanding complexity were provided in context of network theory.

### Data Availability

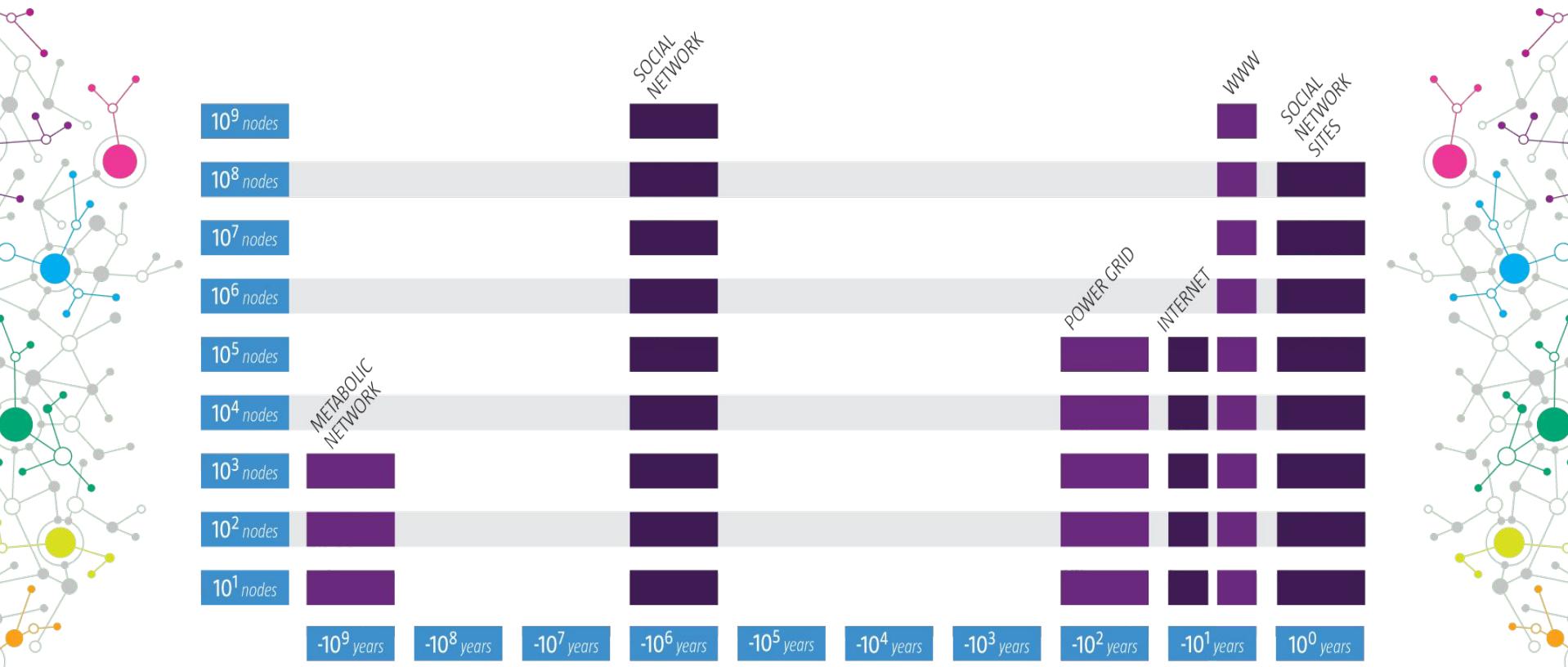
- 1990 C. elegans neural wiring diagram
- 1998 - Movie Actor Network
- 1998 - Citation Networks
- 1999 -World Wide Web
- 2000 - Metabolic Networks
- 2001 - PPI network
- 2008 - OSNs

### Universality

The architecture of networks emerging in various domains of science, nature, and technology are more similar to each other than one would have expected.



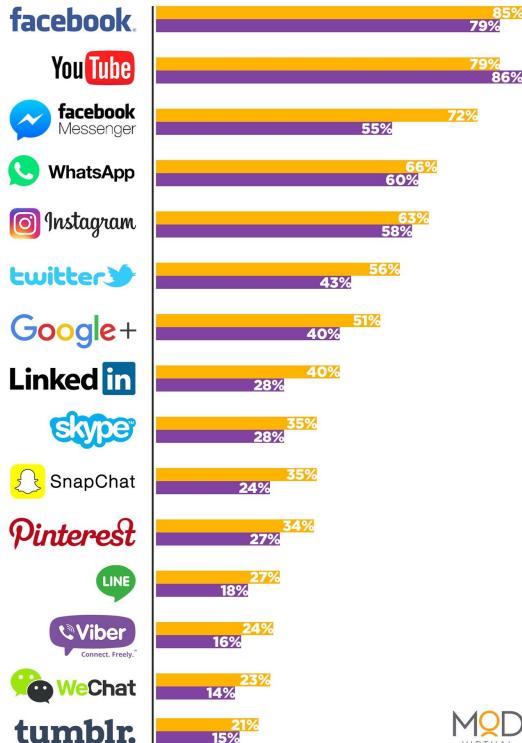
# The Life of Networks



# TOP 15 MOST POPULAR SOCIAL NETWORKS

MEMBERS / REGISTERED USERS

VISITORS / ACTIVE USERS



Source: GlobalWebIndex - Flagship Report 2018 | Survey Base: 98,011 Internet users aged 16-64 from outside China (Q3 2018) | digitalinformationworld.com

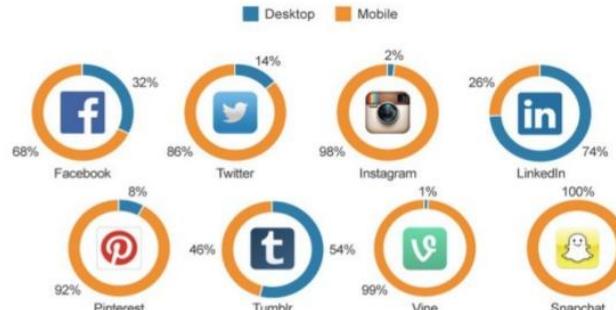
MQD  
VIRTUAL

# (Online) Social Networks

## Time Spent on Social Media...

<http://www.statista.com/chart/2109/time-spent-on-social-networks-by-platform/>

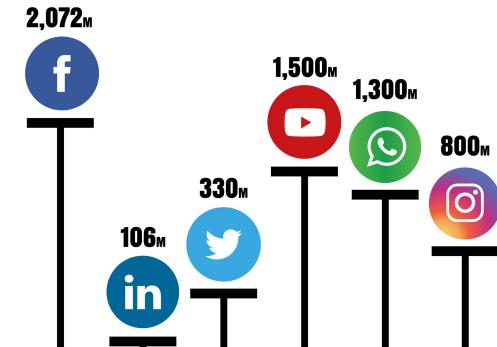
Most Social Networks Are Now Mobile-First  
% of time spent on social networks in the United States, by platform\*



THE WALL STREET JOURNAL • December 2013, Age 18+

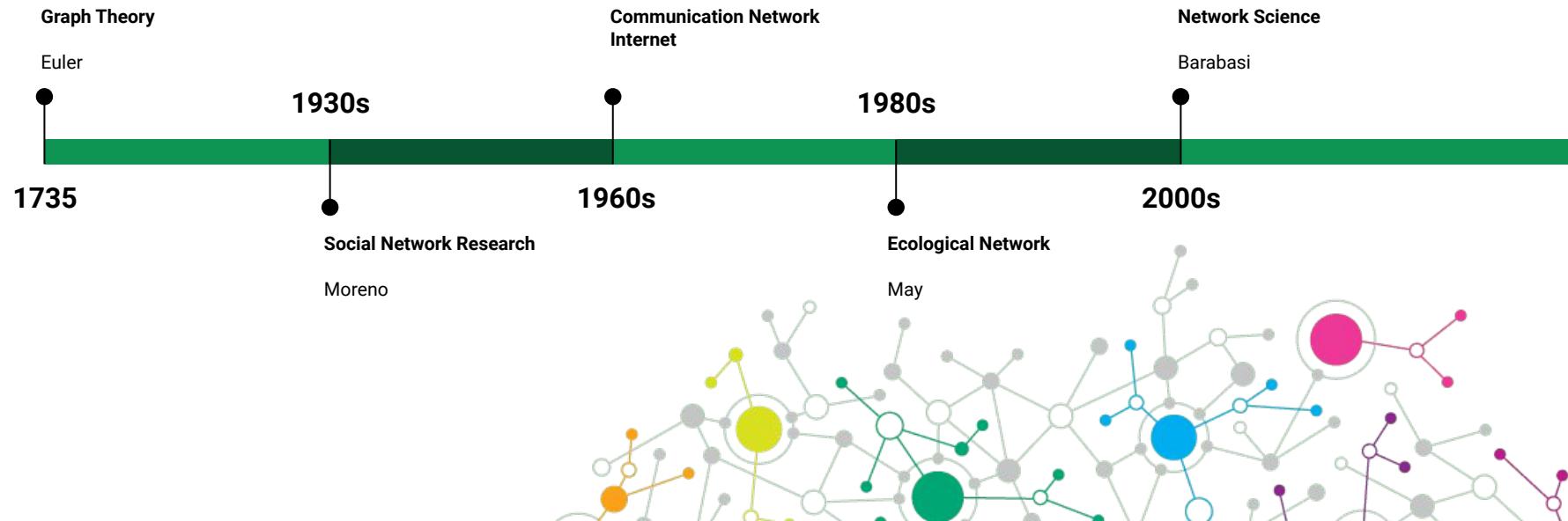
Source: comScore statista

# Social Media Totals



(Incomplete)

# History of Network Analysis



The Tools of  
**Modern Network Theory**

- 1 Graph Theory
- 2 Social Network Theory
- 3 Statistical Physics
- 4 Computer Science
- 5 Biology
- 6 Statistics



## Chapter 1

# Conclusion

### Take Away Messages

1. Complex Systems can be modeled with networks!
2. Node & Edge semantics shape the networks structure
3. Network Science is, by definition, an interdisciplinary field of study

### Suggested Readings

- Chapter 1 & 2 of Kleinberg's book
- Chapter 1 of Barabasi's book.
- Complexity Explained  
<https://complexityexplained.github.io/>

### What's Next

Chapter 2:  
**Networks & Graphs: Basic Measures**

