

KNOWLEDGE-AUGMENTED GRAPH MACHINE LEARNING FOR DRUG DISCOVERY: FROM PRECISION TO INTERPRETABILITY

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OUTLINE

- I. Introduction and Motivation
- II. Background of Drug Discovery
- III. Graph Machine Learning (GML) and Knowledge Graph (KG) in Drug Discovery
- IV. Knowledge-augmented Graph Machine Learning (KaGML) for Drug Discovery
- V. Practical Resources
- VI. Open Challenges and Future Directions

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SIGNIFICANCE AND CHALLENGES OF DRUG DISCOVERY



AARHUS
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DEPARTMENT OF COMPUTER SCIENCE

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DRUG DISCOVERY IS LONG AND EXPENSIVE

- It usually takes 10-15 years and costs around 2 billion US dollars

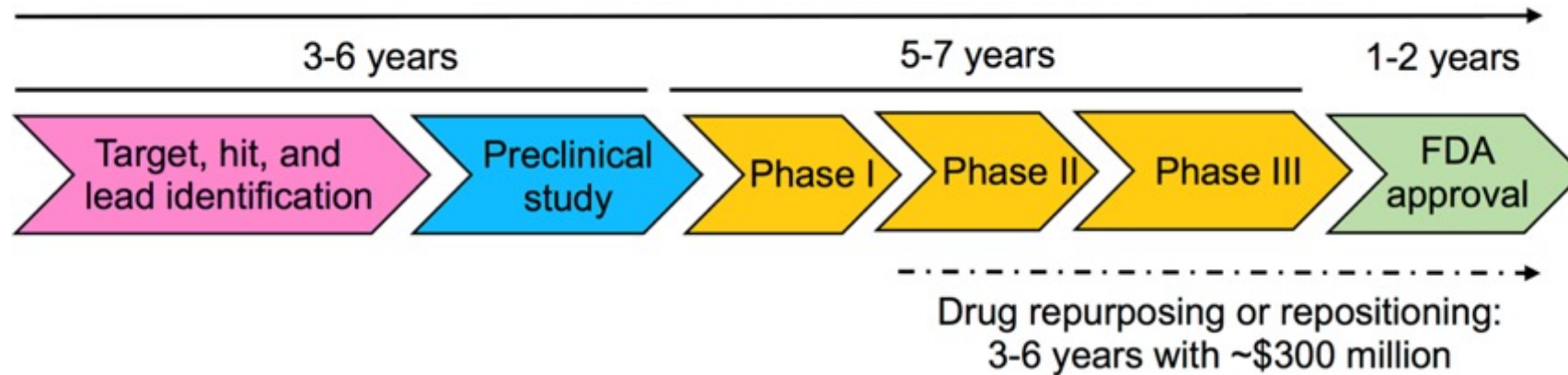
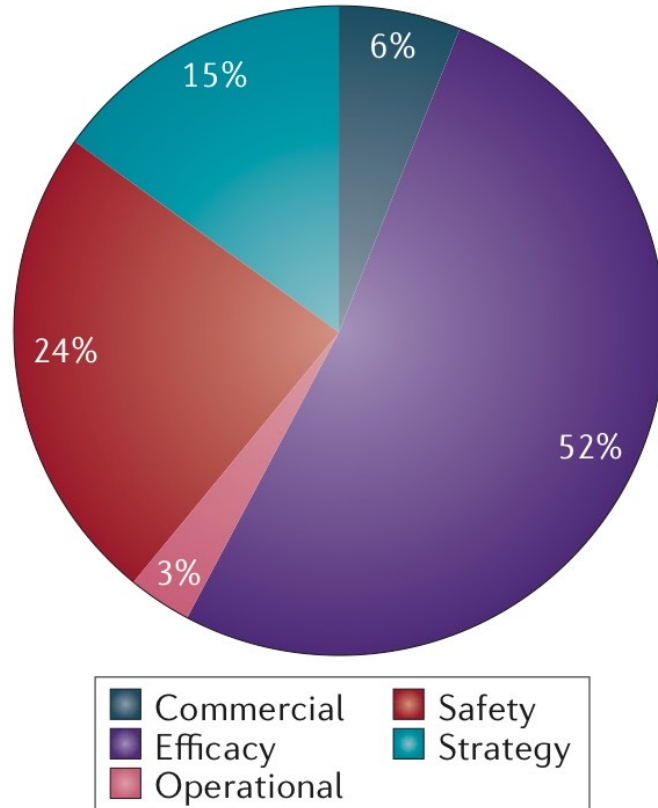


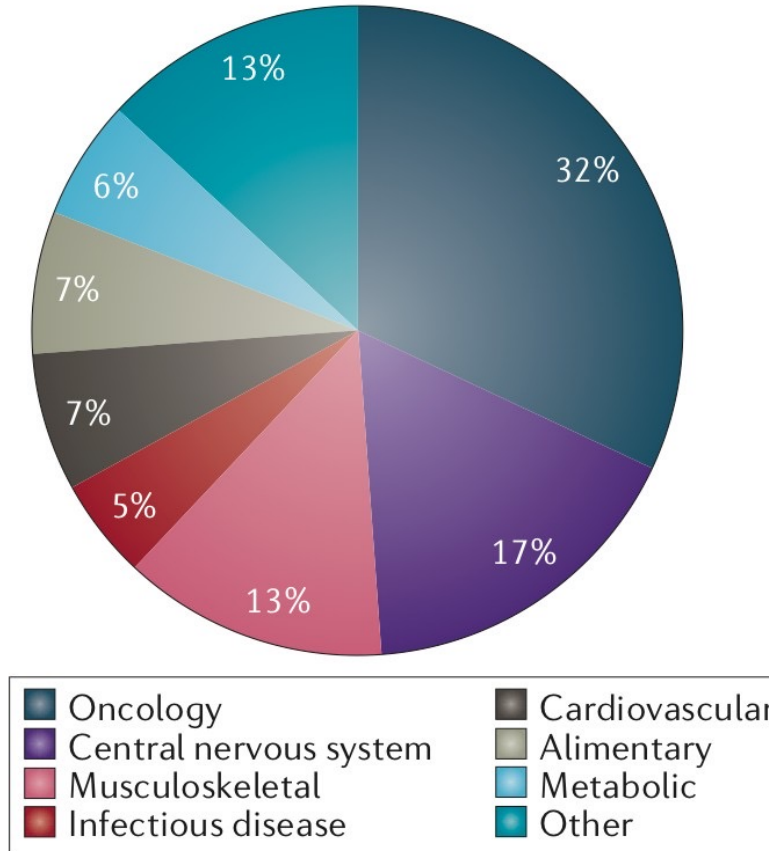
Figure Source: *Cheng F.*, Methods Mol. Biol., 2019

REASONS FOR DRUG DISCOVERY **FAILURES**

a Reason for failure 2013–2015



b Percentage failure by therapeutic area



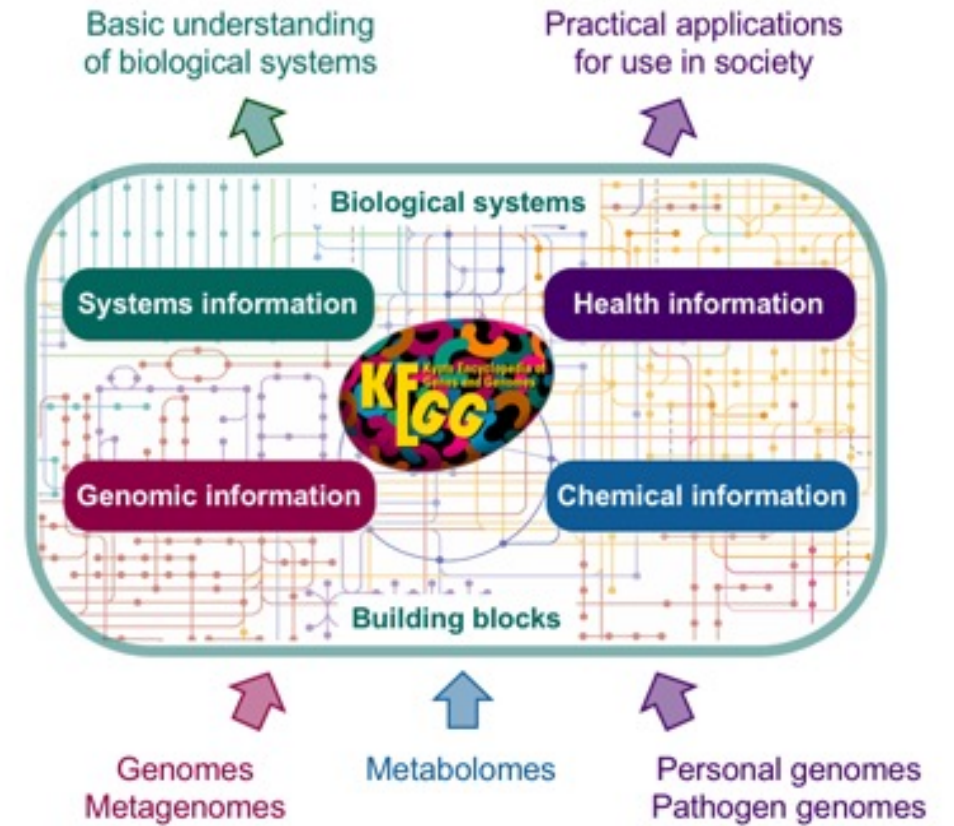
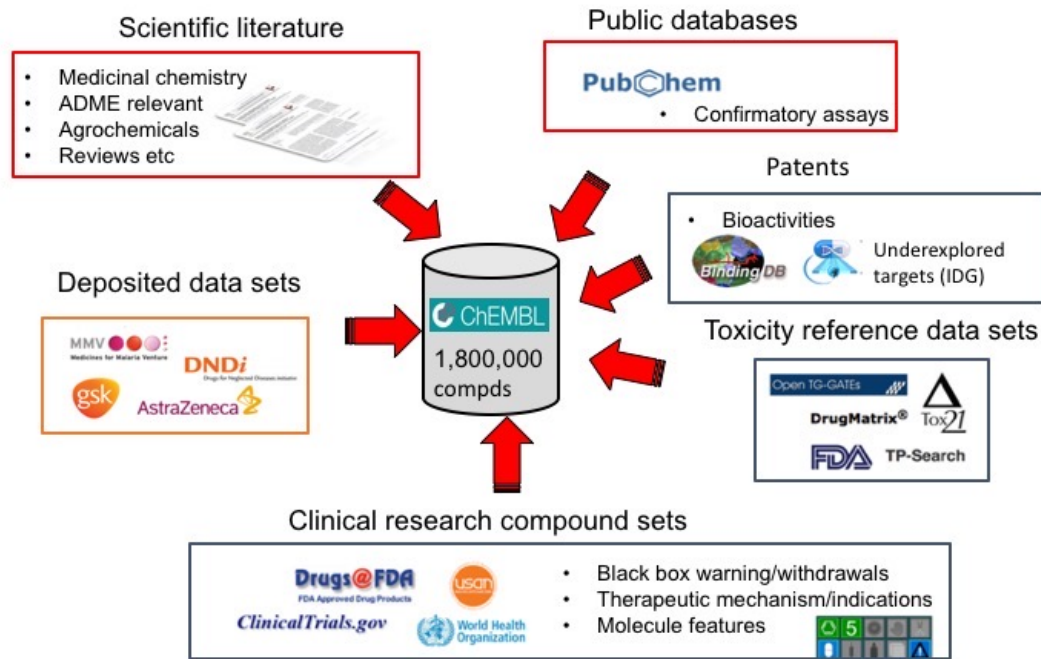
- AI techniques can potentially address **major** failures.

Figure Source: *Harrison RK.*, Nat Rev Drug Discovery 2020

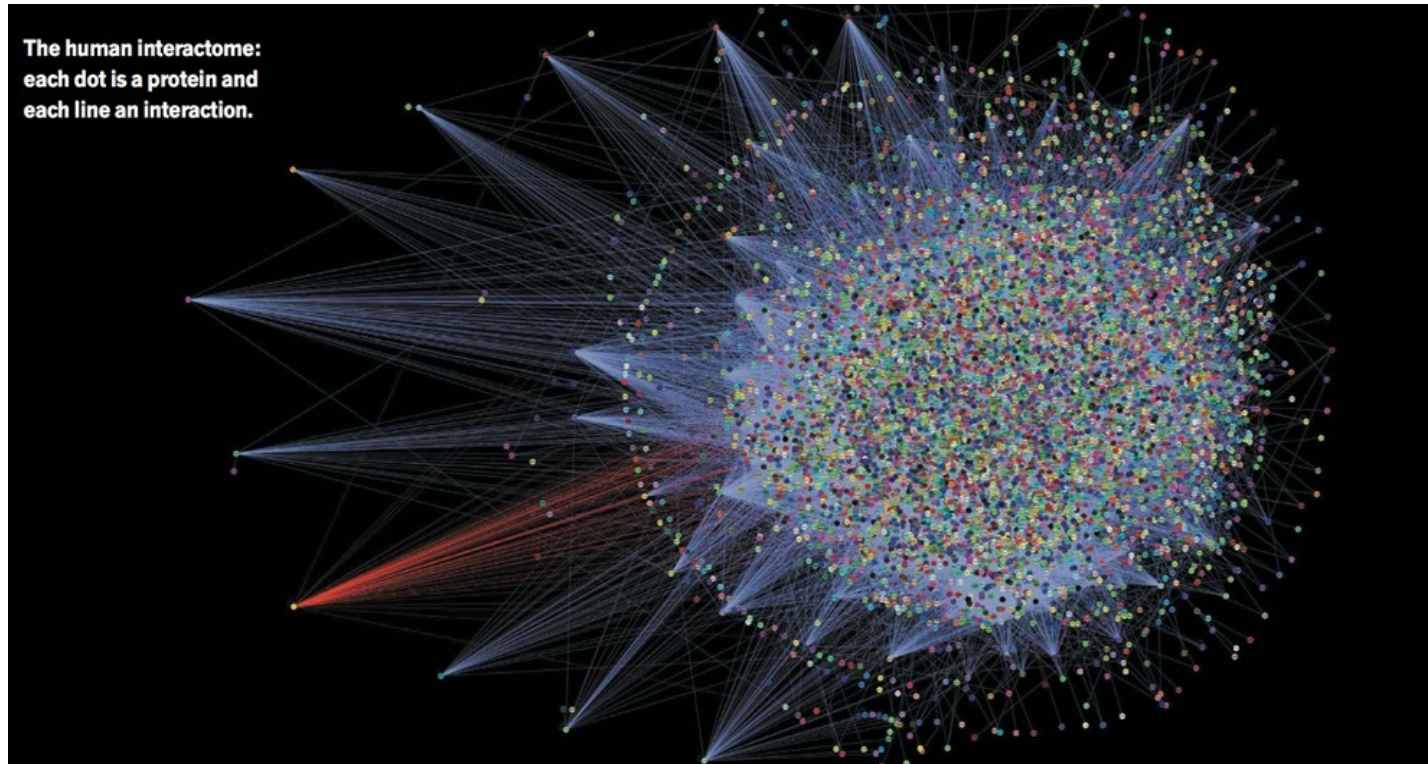
BIG OPPORTUNITY FOR AI

- A huge amount of data is generated in the biomedical domain

ChEMBL Database Content



BIG OPPORTUNITY FOR AI



Fessenden et al., Nature 2017

Luck et al., Nature 2020

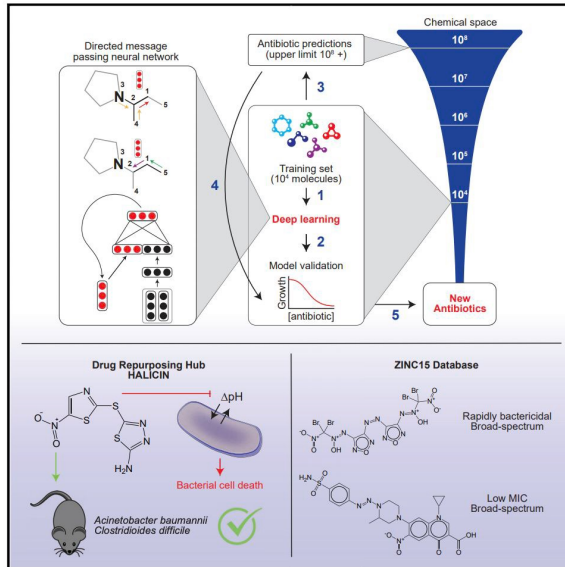
- ~13 major organ systems
- ~200-300 cell types
- ~10-50 trillion total human cells
- ~20,000 protein-coding genes
- ~3,000 metabolites
- ~300 different post-translational modifications
- ~600K binary interactions of proteins
- Over 2M nodes among # DNA, RNA, protein and variants

PROMISING AI IN DRUG DISCOVERY

Cell

A Deep Learning Approach to Antibiotic Discovery

Graphical Abstract



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In Brief

A trained deep neural network predicts antibiotic activity in molecules that are structurally different from known antibiotics, among which Halicin exhibits efficacy against broad-spectrum bacterial infections in mice.

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Powerful antibiotics discovered using AI

Machine learning spots molecules that work even against ‘untreatable’ strains of bacteria.

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Highly accurate protein structure prediction with AlphaFold

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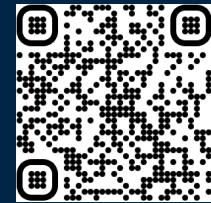
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Thank you!

Questions?

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