

# Case Studies: AI for Drug Discovery

[ter.ps/389iweek8](https://ter.ps/389iweek8)

# Last week, we discussed:

- Discovery of new therapeutics



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- Timeline from lab research → clinical trials → approval



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- Discovery of new therapeutics
- Timeline from lab research → clinical trials → approval
- How AI can intervene & accelerate the process



# This week

- Exploring examples of current industry initiatives



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- Exploring examples of current industry initiatives
- Motivation:

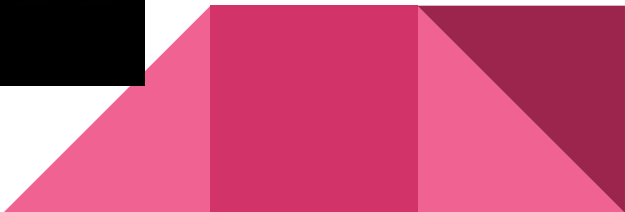


# This week

- Exploring examples of current industry initiatives
- Motivation:

*Finding **cures** for **diseases** that are lacking!*





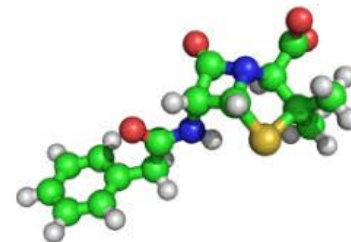


An abstract graphic featuring several blue and pink capsules on a light blue background. Some capsules are whole, while others are pixelated or breaking apart, with small blue and pink squares floating around them. The text "FUTURE OF PHARMA" is centered in white, bold, sans-serif font.

# FUTURE OF PHARMA

# Compound Libraries for Drug Discovery

- Features describe content, chemistry, and molecular topology
- Encoded by feature vector
  - Number of carbon & nitrogen atoms
  - Hydrogen-bonding donors and acceptors
  - Charges
  - Polar and nonpolar atoms
  - Functional groups (ketone, carboxylic acid, etc.)
  - Which atoms are bonded to which other atoms



<https://towardsdatascience.com/predicting-molecular-activity-using-deep-learning-in-tensorflow-5b6f8457f9>



Many companies are in this space



<https://blog.benchsci.com/startups-using-artificial-intelligence-in-drug-discovery>

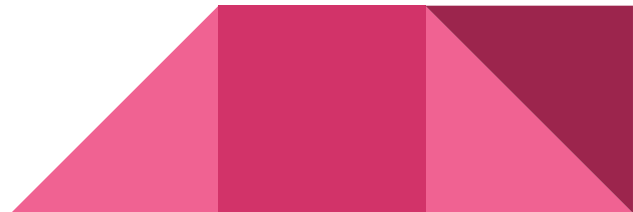
abbvie



**AMGEN**



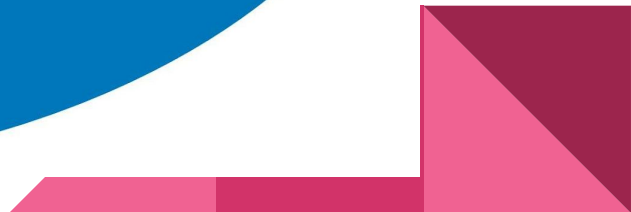






# Genentech

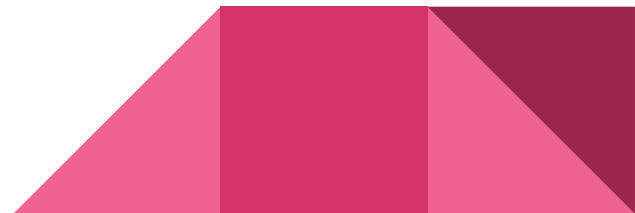
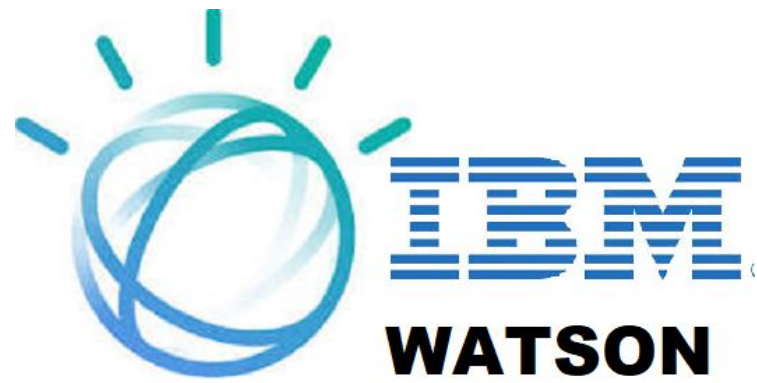




The Roche logo consists of a blue hexagonal border with a point on the left. Inside the hexagon, the word "Roche" is written in a bold, blue, sans-serif typeface.

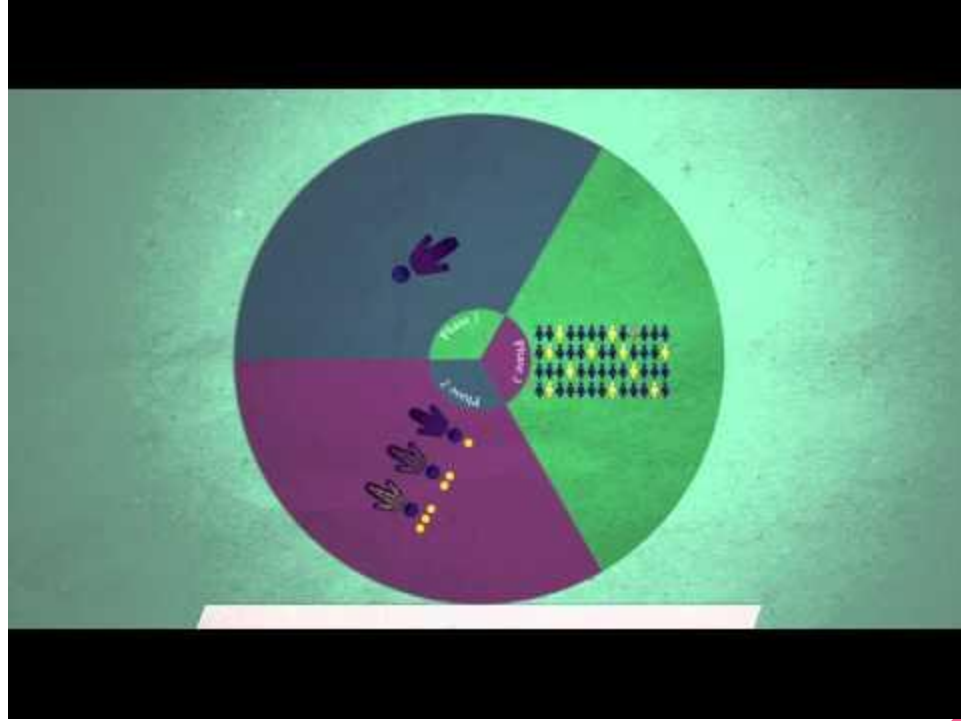
**Roche**

In the bottom right corner, there are several overlapping geometric shapes in shades of pink and red, including a square and several triangles. A solid dark blue horizontal bar runs across the bottom of the image.



*Industry giants are partnering with smaller startups*







+



# Pfizer implements IBM Watson

- 2016
- immuno-oncology
  - using immune system to fight cancer





# Pfizer implements IBM Watson



# Pfizer implements IBM Watson

- Avg. human researcher reads 200-300 science papers/year



# Pfizer implements IBM Watson

- Avg. human researcher reads 200-300 science papers/year
- Watson has analyzed
  - 25 million Medline abstracts
  - > 1 million full-text medical journal articles
  - 4 million patents



# Combination medicines

*Drugs working together > single drugs working alone*

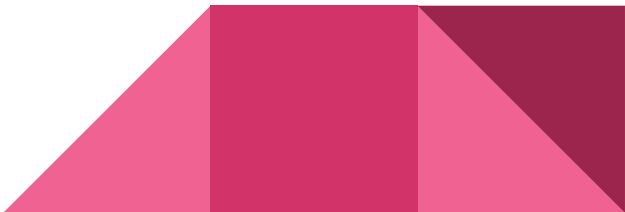
- Synergy
- Target multiple pathways
- Beat drug resistance



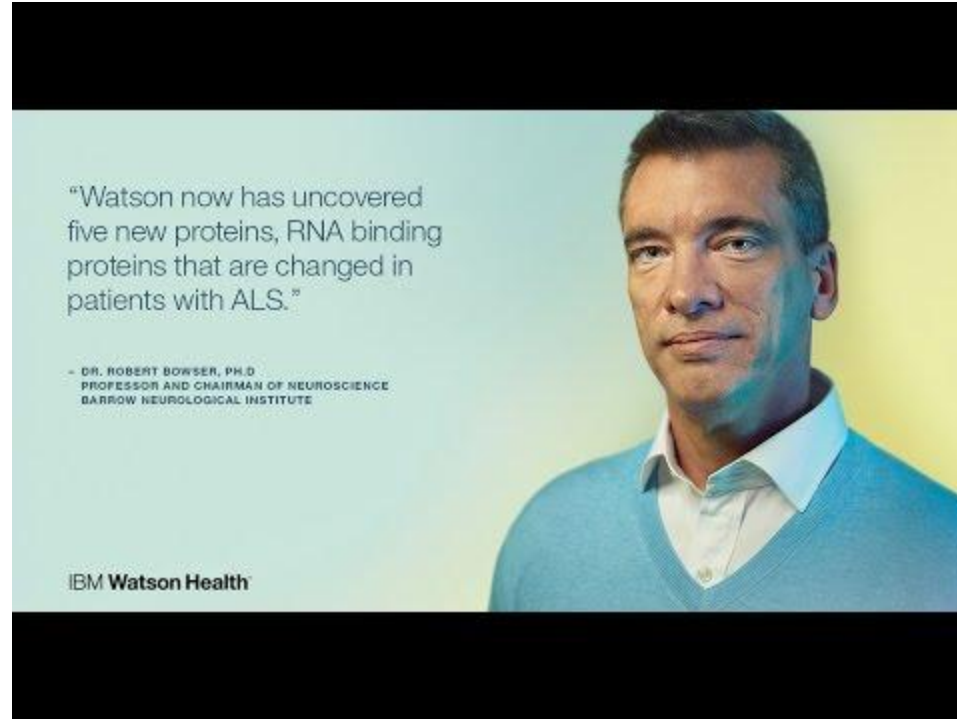
# Combination medicines: Pfizer

- Best way to fight tumor:

*Combination of drugs to kill tumor via the immune system*

- *Many* combinations exist
  - IBM Watson → narrow combinations
  - Prediction
- 

# IBM Watson: ALS



# However...IBM Watson in Hot Water

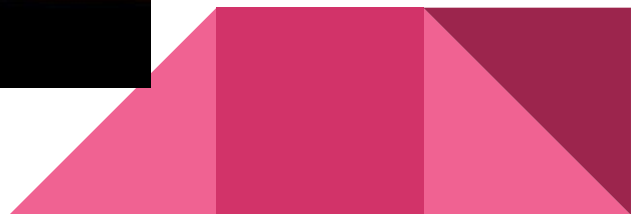
- IBM Watson still has to prove itself!
  - not a generalizable framework
- MD Anderson breakup
  - \$62 million, 4 years, no output
  - <https://www.technologyreview.com/s/607965/a-reality-check-for-ibms-ai-ambitions/>
  - <https://thomaswdinsmore.com/2018/02/21/notes-on-a-watson-fail/>



# Recursion Pharmaceuticals









# Google AI Blog

The latest news from Google AI

## Automating Drug Discoveries Using Computer Vision

Thursday, July 12, 2018

Vincent Vanhoucke, Principal Scientist, Google Brain Team

# Protein Crystal Identification

*“Every time you miss a protein crystal, because they are so rare, you risk missing on an important biomedical discovery.”*

- [Patrick Charbonneau](#), Duke University Dept. of Chemistry and Lead Researcher, [MARCO initiative](#).

Neural networks → >94% accuracy on protein crystal identification



Image of protein crystal, courtesy of the MARCO repository  
(CC-BY-4.0 license)

# How AI Can Speed Up Drug Discovery

<https://medium.com/syncedreview/how-ai-can-speed-up-drug-discovery-3c7f01654625>



# Challenges

# Challenges

- Forbes survey:  
“Nearly Half Of All Scientists Are Unfamiliar With AI For Drug Discovery”
- 41% of drug discovery scientists are unfamiliar with AI
- Skepticism



# Challenges cont'd

- Even with AI, most drug candidates will still fail
- The goal is to make them fail *less*
  - *proving that the failure rate is slightly smaller requires large datasets*
- Trade secrets



# The Promise

- Creating new compounds
- Finding combination medicines
- Discovering new uses of existing medicines
- Personalized medicine





# Datasets

- <https://www.kaggle.com/uciml/bioassay-datasets>
- <https://www.kaggle.com/c/MerckActivity/data>
- <https://www.kaggle.com/c/toxic-molecule-prediction/data>



# In-Class Activity

Pick ONE to read

<https://www.nature.com/articles/nbt0717-604>

<https://www.nature.com/articles/d41586-018-05267-x>

Get in groups of 3-4 & discuss

Write down 3 things you learned



# Next Week

- Mental health
- Codelab - questions?



# Readings

<https://www.techemergence.com/machine-learning-drug-discovery-applications-pfizer-roche-gsk/>

<https://www.forbes.com/sites/forbestechcouncil/2018/02/02/the-top-barrier-to-ai-in-drug-discovery-may-surprise-you/#7af9100d4fd1>

<https://www.nature.com/articles/d41586-018-05267-x>

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