

# Success Stories of AI

Melih Kandemir

# Story 1: Computer Vision



Model	Top-1	Top-5
<i>Sparse coding</i> [2]	47.1%	28.2%
<i>SIFT + FVs</i> [24]	45.7%	25.7%
CNN	<b>37.5%</b>	<b>17.0%</b>



## ImageNet Classification with Deep Convolutional Neural Networks

Alex Krizhevsky  
University of Toronto  
kriz@cs.utoronto.ca

Ilya Sutskever  
University of Toronto  
ilsa@cs.utoronto.ca

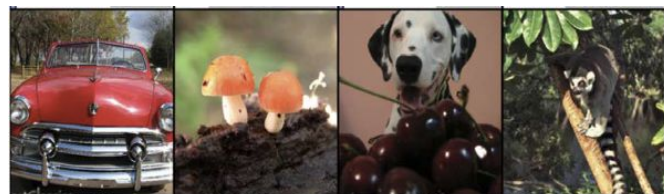
Geoffrey E. Hinton  
University of Toronto  
hinton@cs.utoronto.ca

### Abstract

We trained a large, deep convolutional neural network to classify the 1.2 million high-resolution images in the ImageNet ILSVRC-2010 contest into the 1000 different classes. On the test data, we achieved top-1 and top-5 error rates of 37.5% and 17.0% which is considerably better than the previous state-of-the-art. The neural network, which has 60 million parameters and 650,000 neurons, consists of five convolutional layers, some of which are followed by max-pooling layers, and three fully-connected layers with a final 1000-way softmax. To make training faster, we used non-saturating neurons and a very efficient GPU implementation of the convolution operation. To reduce overfitting in the fully-connected layers we employed a recently-developed regularization method called "dropout" that proved to be very effective. We also entered a variant of this model in the ILSVRC-2012 competition and achieved a winning top-5 test error rate of 15.3%, compared to 26.2% achieved by the second-best entry.



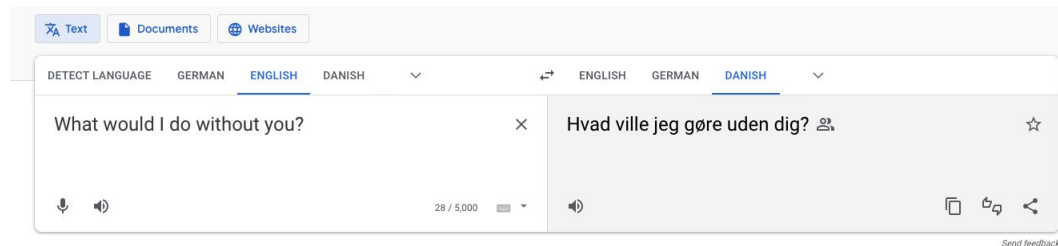
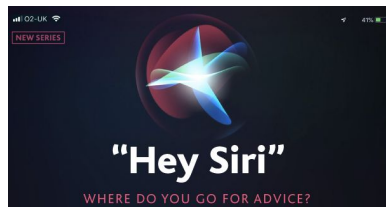
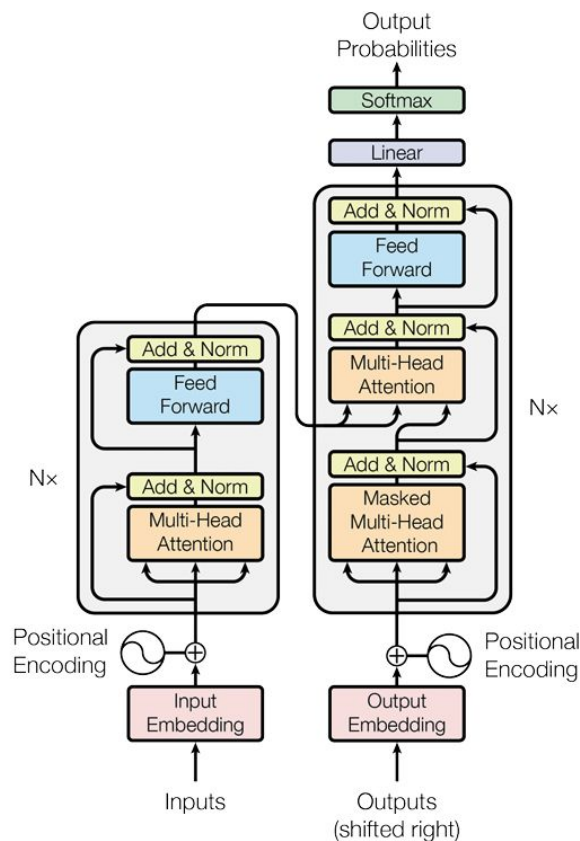
mite	container ship	motor scooter	leopard
black widow	lifeboat	go-kart	jaguar
cockroach	amphibian	moped	cheetah
tick	fireboat	bumper car	snow leopard
starfish	drilling platform	golfcart	Egyptian cat



grille	mushroom	cherry	Madagascar cat
convertible	agaric	dalmatian	squirrel monkey
grille	mushroom	grape	spider monkey
pickup	jelly fungus	elderberry	titi
beach wagon	gill fungus	fordshire bullterrier	indri
fire engine	dead-man's-fingers	currant	howler monkey

# Story 2: Natural Language Understanding

Attention Is All You Need



Ashish Vaswani\*  
Google Brain  
avaswani@google.com

Noam Shazeer\*  
Google Brain  
noam@google.com

Niki Parmar\*  
Google Research  
nikip@google.com

Jakob Uszkoreit\*  
Google Research  
usz@google.com

Llion Jones\*  
Google Research  
llion@google.com

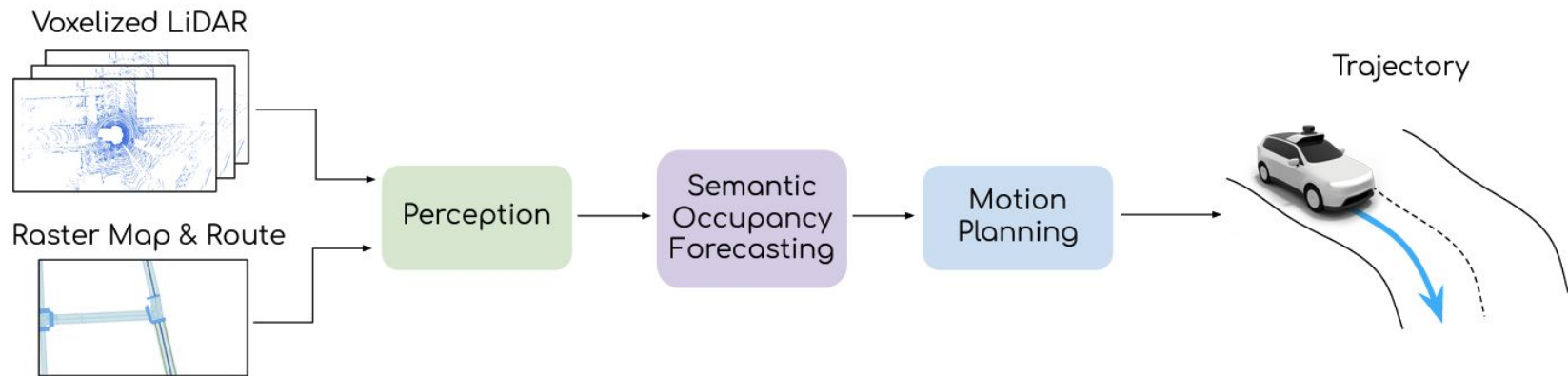
Aidan N. Gomez\*<sup>†</sup>  
University of Toronto  
aidan@cs.toronto.edu

Łukasz Kaiser\*  
Google Brain  
lukasz.kaiser@google.com

Illia Polosukhin\*<sup>‡</sup>  
illia.polosukhin@gmail.com



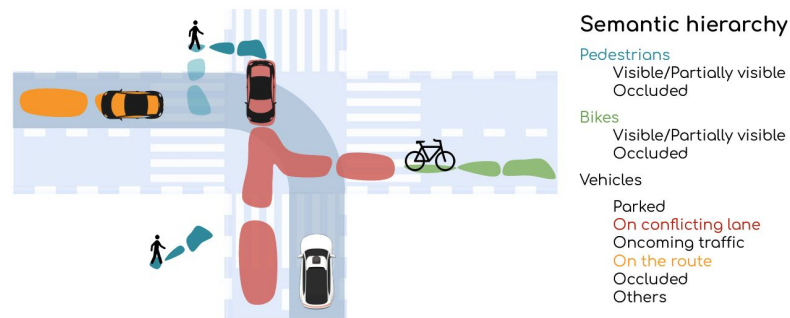
# Story 3: Autonomous Driving



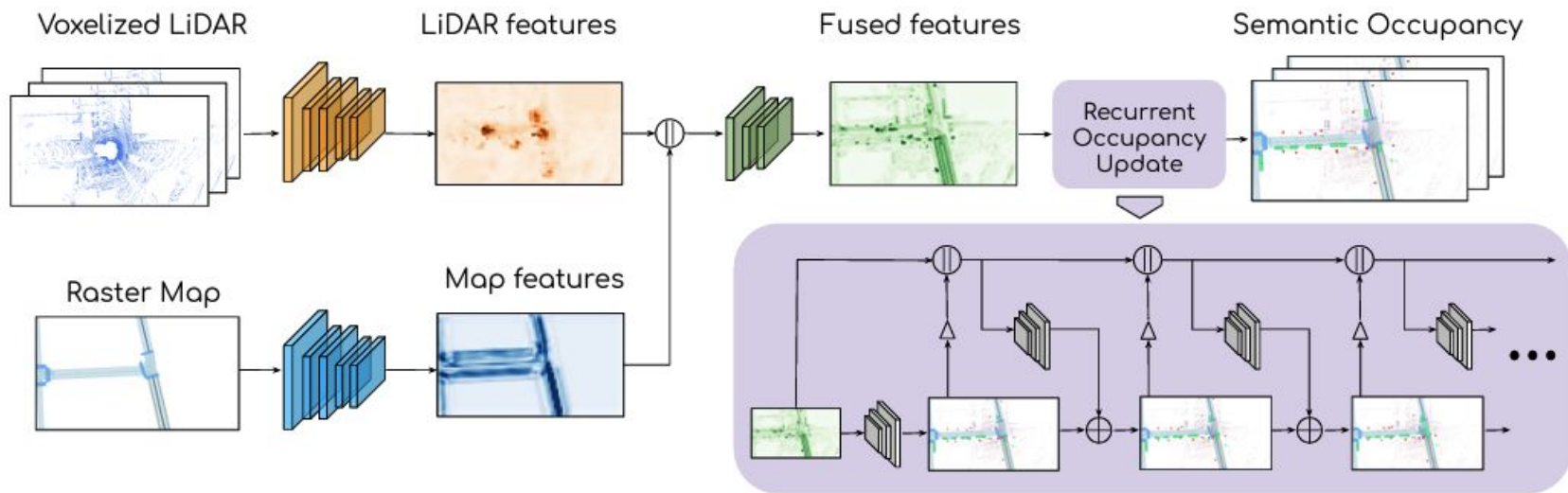
## Perceive, Predict, and Plan: Safe Motion Planning Through Interpretable Semantic Representations

Abbas Sadat<sup>\*1</sup>, Sergio Casas<sup>\*1,2</sup>,  
Mengye Ren<sup>1,2</sup>, Xinyu Wu<sup>1</sup>, Pranaab Dhawan<sup>1</sup>, Raquel Urtasun<sup>1,2</sup>

Uber ATG<sup>1</sup>, University of Toronto<sup>2</sup>  
{asadat, sergio.casas, mren3, xinyuw, pdhawan, urtasun}@uber.com

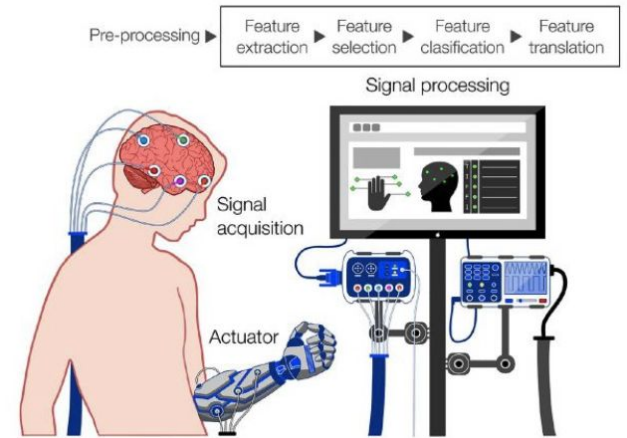
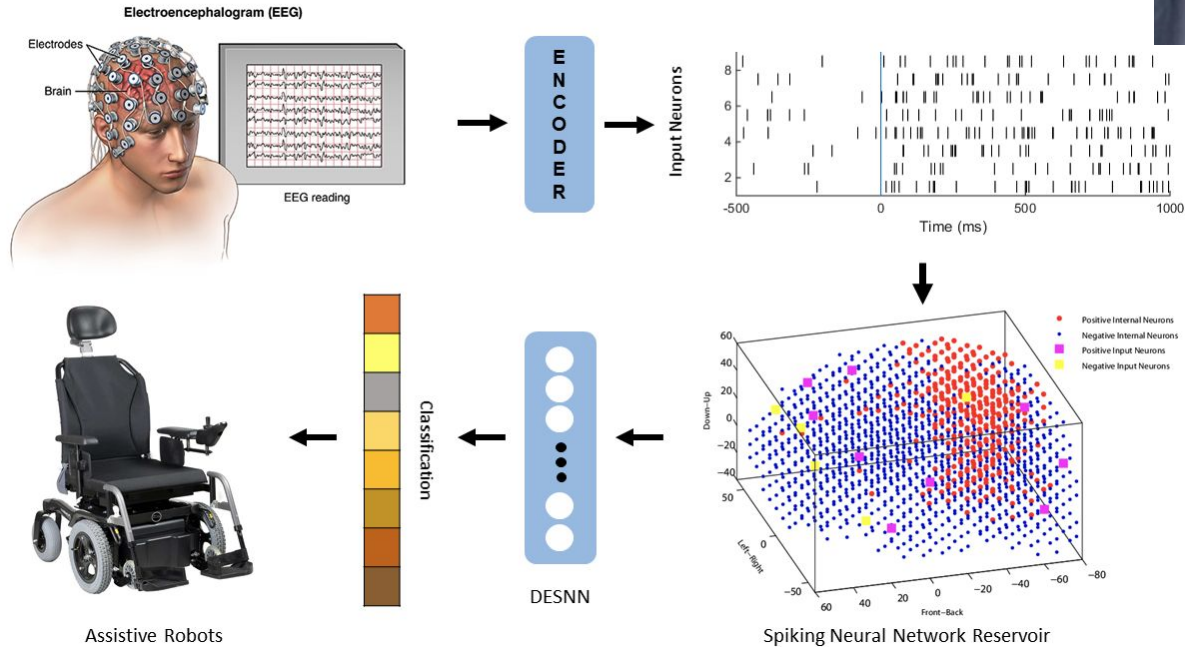
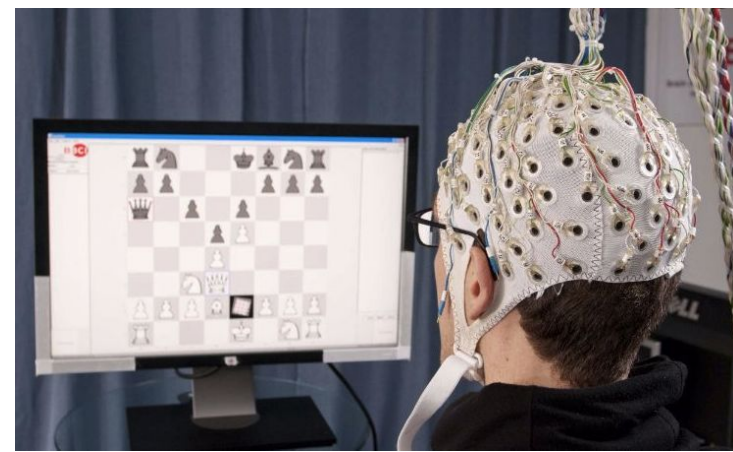


# Story 3: Autonomous Driving





# Story 4: Brain-Computer Interfaces



# Story 5: Human-Robot Interaction

- a) Skill transfer
- b) Cobots

## Is imitation learning the route to humanoid robots?

Stefan Schaal

This review investigates two recent developments in artificial intelligence and neural computation: learning from imitation and the development of humanoid robots. It is postulated that the study of imitation learning offers a promising route to gain new insights into mechanisms of perceptual motor control that could ultimately lead to the creation of autonomous humanoid robots. Imitation learning focuses on three important issues: efficient motor learning, the connection between action and perception, and modular motor control in the form of movement primitives. It is reviewed here how research on representations of, and functional connections between, action and perception have contributed to our understanding of motor acts of other beings. The recent discovery that some areas in the primate brain are active during both movement perception and execution has provided a hypothetical neural basis of imitation. Computational approaches to imitation learning are also described, initially from the perspective of traditional AI and robotics, but also from the perspective of neural network models and statistical-learning research. Parallels and differences between biological and computational approaches to imitation are highlighted and an overview of current projects that actually employ imitation learning for humanoid robots is given.



# Story 6: Ad Placement

## How do search engines make money?

Léon Bottou

LEON@BOTTOUT.ORG

Microsoft Research, Redmond, WA.

Jonas Peters<sup>‡</sup>

JONAS.PETERS@TUEBINGEN.MPG.DE

Max Planck Institute, Tübingen.

Joaquin Quiñonero-Candela,<sup>a‡</sup> Denis X. Charles,<sup>b</sup> D. Max Chickering,<sup>b</sup>

Elon Portugaly,<sup>a</sup> Dipankar Ray,<sup>c</sup> Patrice Simard,<sup>b</sup> Ed Snelson<sup>a</sup>

<sup>a</sup> Microsoft Cambridge, UK.

<sup>b</sup> Microsoft Research, Redmond, WA.

<sup>c</sup> Microsoft Online Services Division, Bellevue, WA.

WEB IMAGES VIDEOS MAPS MORE

bing organic apples

100,000,000 RESULTS

**Organic |ust Apples**  
iHerb.com  
Consumer Rated #1 Online Retailer - Great Value and Fast Shipping  
iHerb.com is rated on PriceGrabber (43 reviews)

Other ideas: [apples](#)

[Comparing apples to organic apples - Boston.com](#)  
articles.boston.com/2008-11-10/news/29271514\_1\_organic-food...  
Nov 10, 2008 · With the recession breathing down our necks, you may be looking for ways to cut the household budget without seriously compromising family well-being. ...

[Five Reasons to Eat Organic Apples: Pesticides, Healthy ...](#)  
www.forbes.com/.../23/five-reasons-to-eat-organic-apples-pesticides...  
Apr 23, 2012 · There are good reasons to eat **organic** and locally raised fruits and vegetables. For one, they usually taste better and are a whole lot fresher. Yet ...

**Ads**

**Organic Fruit Deal \$29.99**  
[www.CherryMoonFarms.com/Fruit](#)  
Use PromoCode GET10 for Discount on All Fresh **Organic** Fruit Baskets  
cherrymoonfarms.com is rated on Bizrate (106 reviews)

**Organic Fruit Delivery**  
[TheFruitCompany.com/Organic](#)  
Find Great Fresh **Organic** Gifts From The Fruit Company® Ship Today.

**Organic Apples at Amazon**  
[www.Amazon.com](#)  
Low prices on **Organic Apples**.  
Qualified orders over \$25 ship free

Mainline

Sidebar

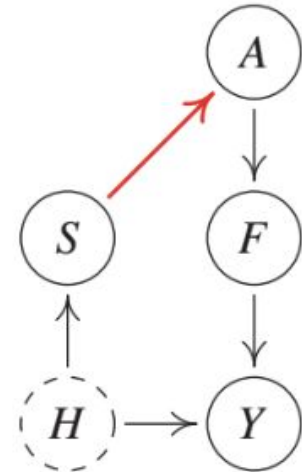
Y: Whether user clicked

A: mainline reserve

F: number of ads in the mainline

S: User status and statistics

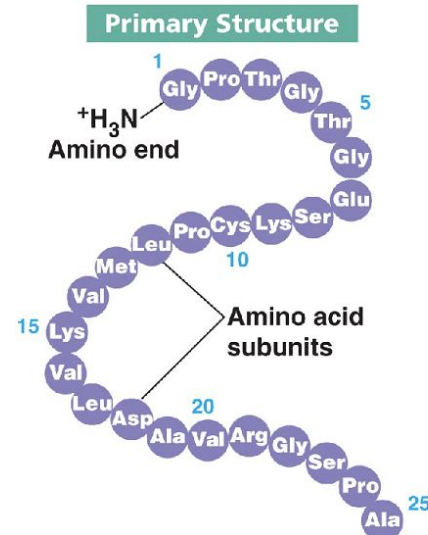
H: Hidden user state





# Story 7: Protein Folding

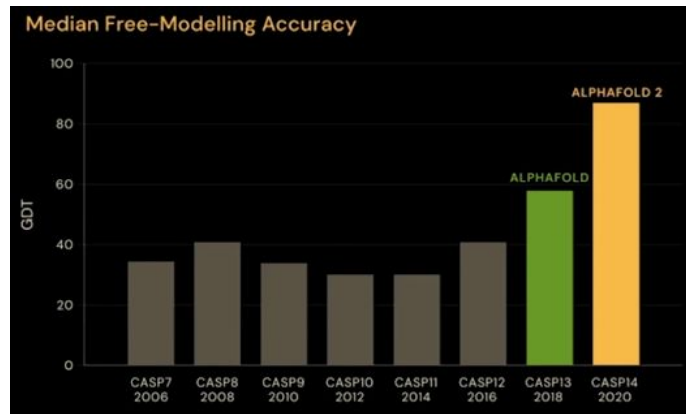
- Biggest advancement in structural biology since 20+ years
- Proteins are structure providers, mover, reaction catalyst, etc. of living things
- Proteins are chains of 21 elementary molecules called “amino acids”
- The problem:
  - Given the 1D chain, predict the 3D structure
- Why care?
  - 3D structure determines its function



Amino Acid	Abbreviations
Alanine	Ala; A
Arginine	Arg; R
Asparagine	Asn; N
Aspartic acid	Asp; D
Cysteine	Cys; C
Glutamic acid	Glu; E
Glutamine	Gln; Q
Glycine	Gly; G
Histidine	His; H
Isoleucine	Ile; I
Leucine	Leu; L
Lysine	Lys; K
Methionine	Met; M
Phenylalanine	Phe; F
Proline	Pro; P
Serine	Ser; S
Threonine	Thr; T
Tyrosine	Tyr; Y
Tryptophan	Trp; W
Valine	Val; V

# The CASP Competition

- 200 million proteins as AA sequences
- Ground-truth 3D structures for 170000 proteins
  - Super-expensive data! Requires X-ray crystallography
  - 120000\$ and take one year “per protein”
- $10^{143}$  possibilities (compared to  $10^{80}$  atoms in the universe)



# DeepMind's solution

## Article

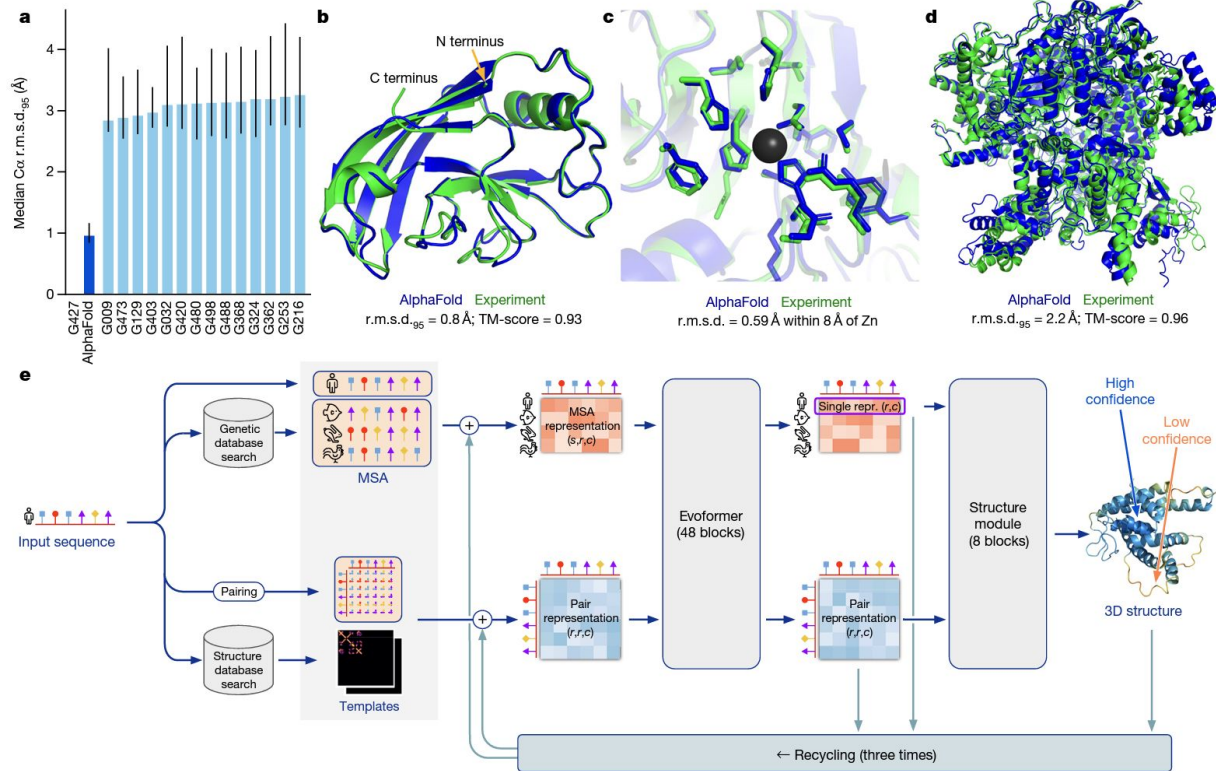
# Highly accurate protein structure prediction with AlphaFold

<https://doi.org/10.1038/s41586-021-03819-2>

Received: 11 May 2021

Accepted: 12 July 2021

John Jumper<sup>1,4,5</sup>, Richard Evans<sup>1,4</sup>, Alexander Pritzel<sup>1,4</sup>, Tim Green<sup>1,4</sup>, Michael Figurnov<sup>1,4</sup>, Olaf Ronneberger<sup>1,4</sup>, Kathryn Tunyasuvunakool<sup>1,4</sup>, Russ Bates<sup>1,4</sup>, Augustin Židek<sup>1,4</sup>, Anna Potapenko<sup>1,4</sup>, Alex Bridgland<sup>1,4</sup>, Clemens Meyer<sup>1,4</sup>, Simon A. Kohl<sup>1,4</sup>, Andrew J. Ballard<sup>1,4</sup>, Andrew Cowie<sup>1,4</sup>, Bernardino Romera-Paredes<sup>1,4</sup>, Stanislav Nikolov<sup>1,4</sup>, Rishub Jain<sup>1,4</sup>, Jonas Adler<sup>1</sup>, Trevor Back<sup>1</sup>, Stig Petersen<sup>1</sup>, David Reiman<sup>1</sup>, Ellen Clancy<sup>1</sup>, Michal Zielinski<sup>1</sup>, Martin Steinegger<sup>2,3</sup>, Michalina Pacholska<sup>1</sup>, Tamas Berghammer<sup>1</sup>, Sebastian Bodenstein<sup>1</sup>, David Silver<sup>1</sup>, Oriol Vinyals<sup>1</sup>, Andrew W. Senior<sup>1</sup>, Koray Kavukcuoglu<sup>1</sup>, Pushmeet Kohli<sup>1</sup> & Demis Hassabis<sup>1,4,5</sup>



# Impact: Accurate physics-based simulation of biological systems

- Discovery of unknown functions of the human genome
- Understanding both genetic and environmental causes of many diseases
- Quick design of new proteins that alter the function of existing ones that would enable
  - New treatment methods
  - New agriculture solutions (green, more nutritious, and better protected food production)
  - New preventive health and anti-aging solutions
  - New biomaterials (e.g. textile)