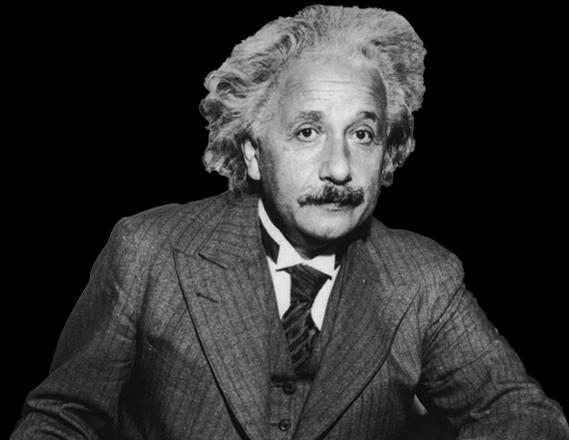


Künstliche Intelligenz oder künstliche Dummheit

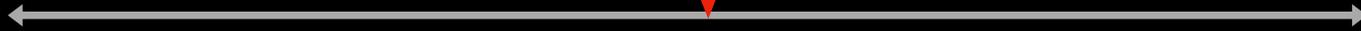
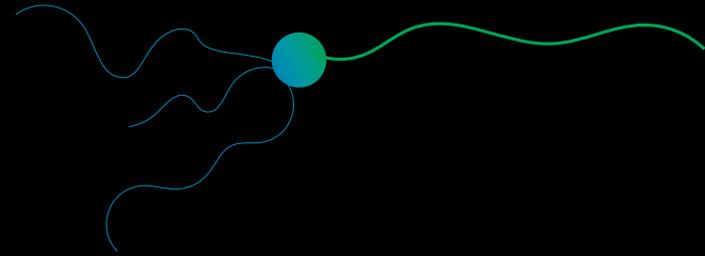
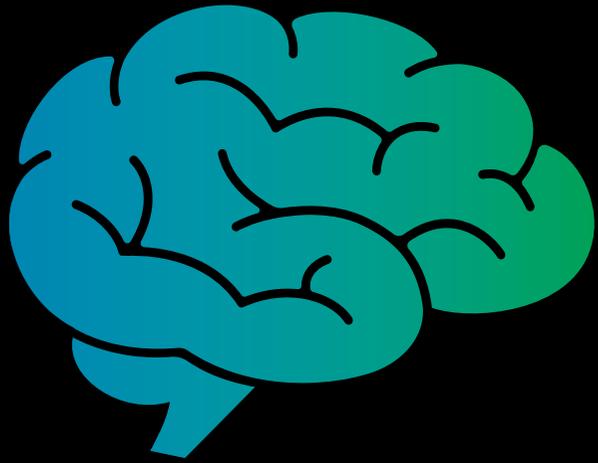
IQWiG Herbstsymposium 2022

Daniel Truhn

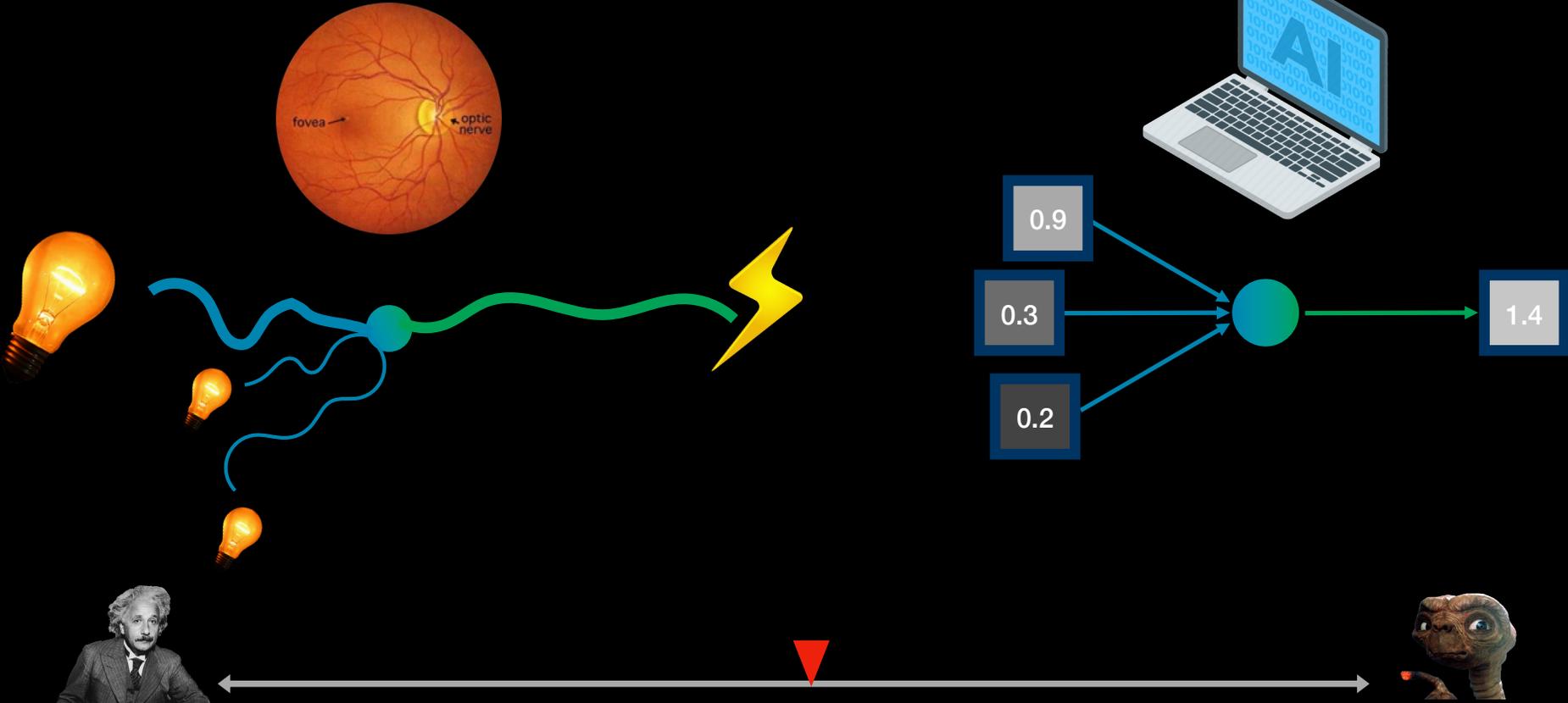




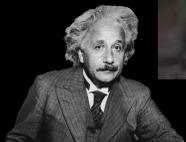
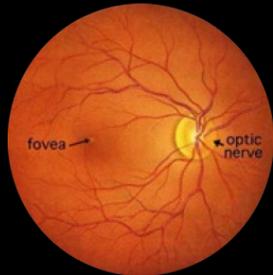
Human Intelligence



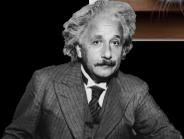
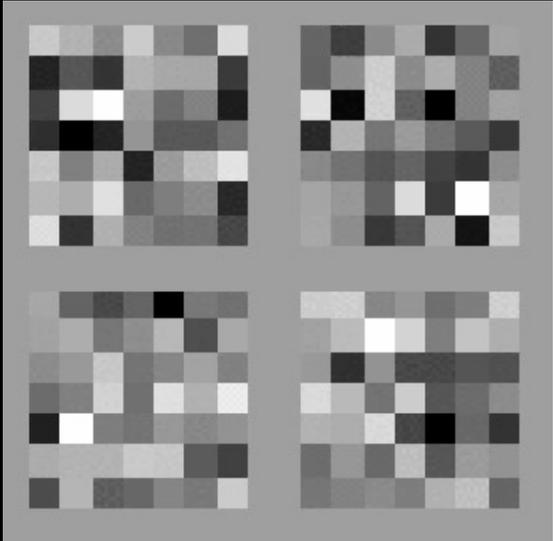
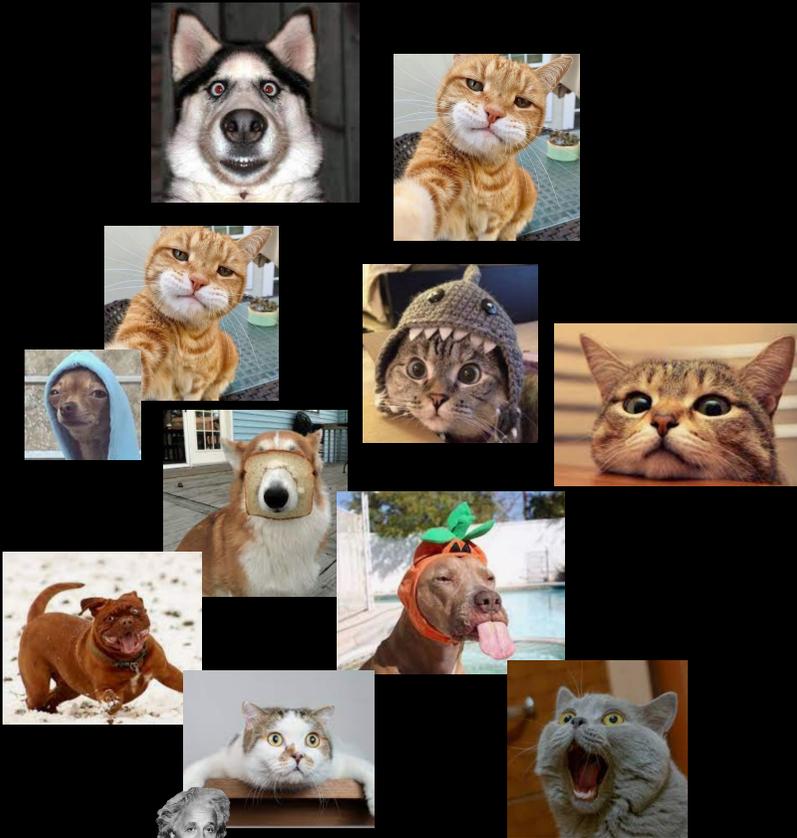
Human Intelligence - Machine Intelligence



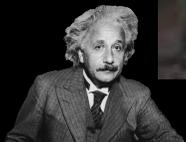
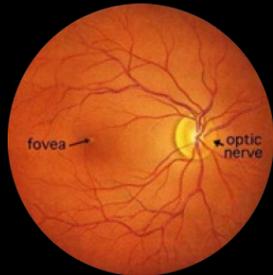
Human Intelligence - Machine Intelligence



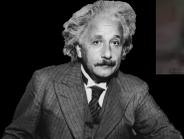
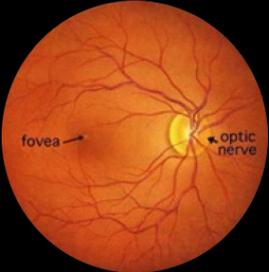
Human Intelligence - Machine Intelligence



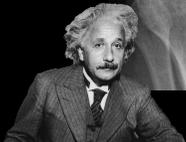
Human Intelligence - Machine Intelligence



Human Intelligence - Machine Intelligence



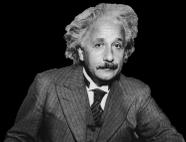
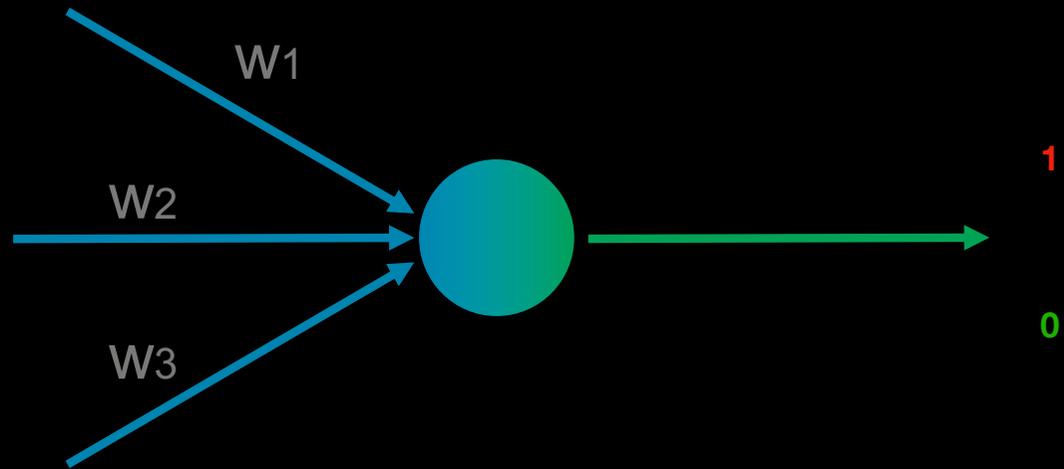
How Does Training Work?



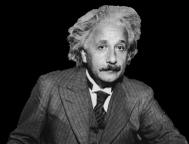
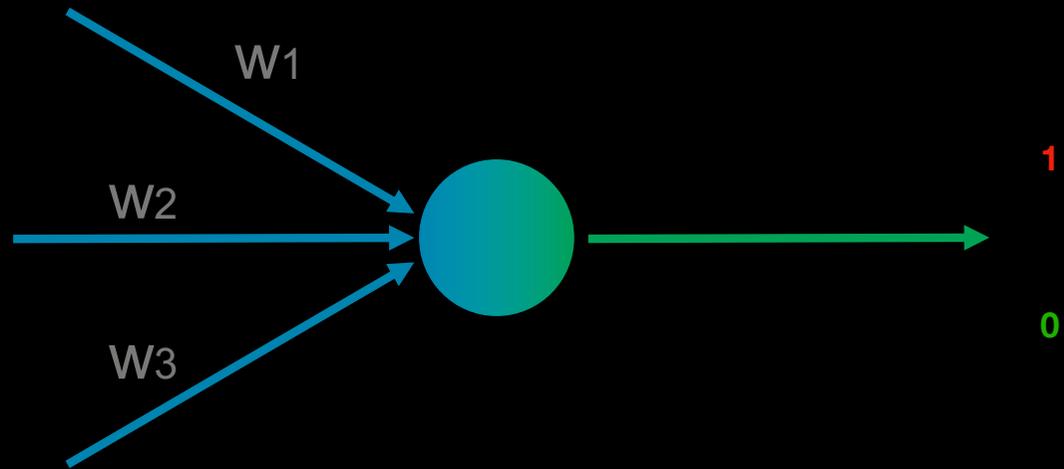
How Does Training Work?



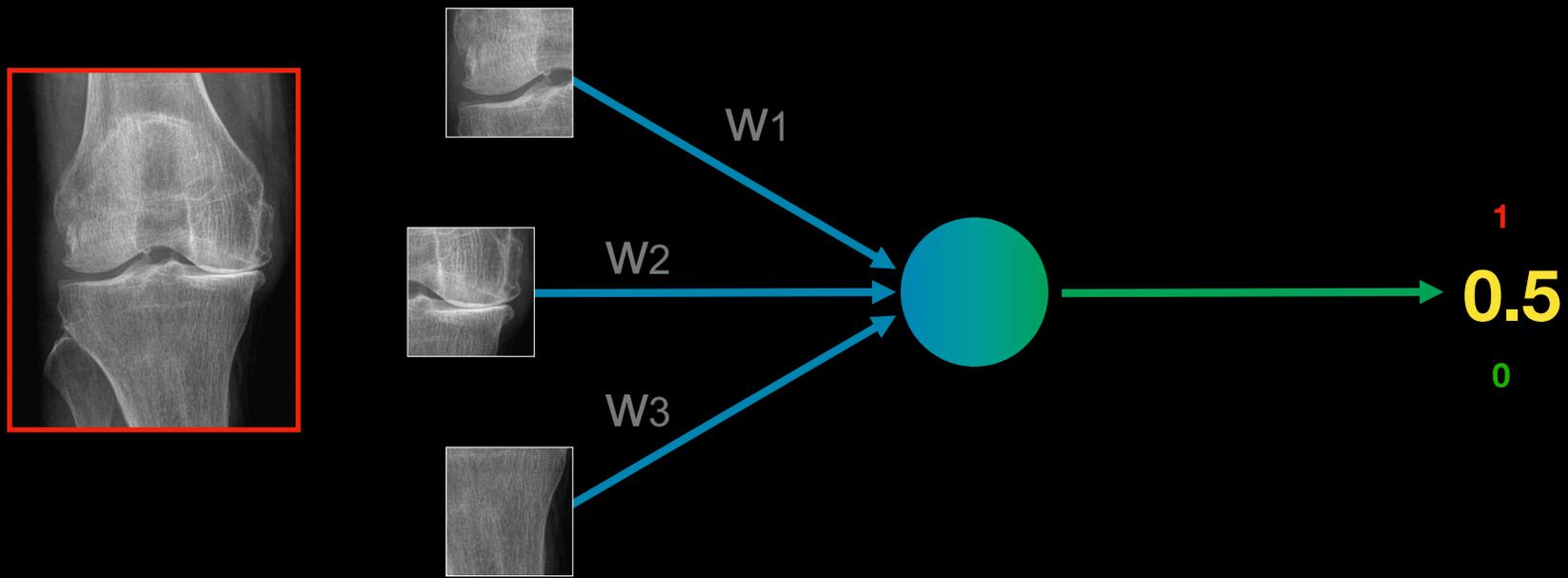
How Does Training Work?



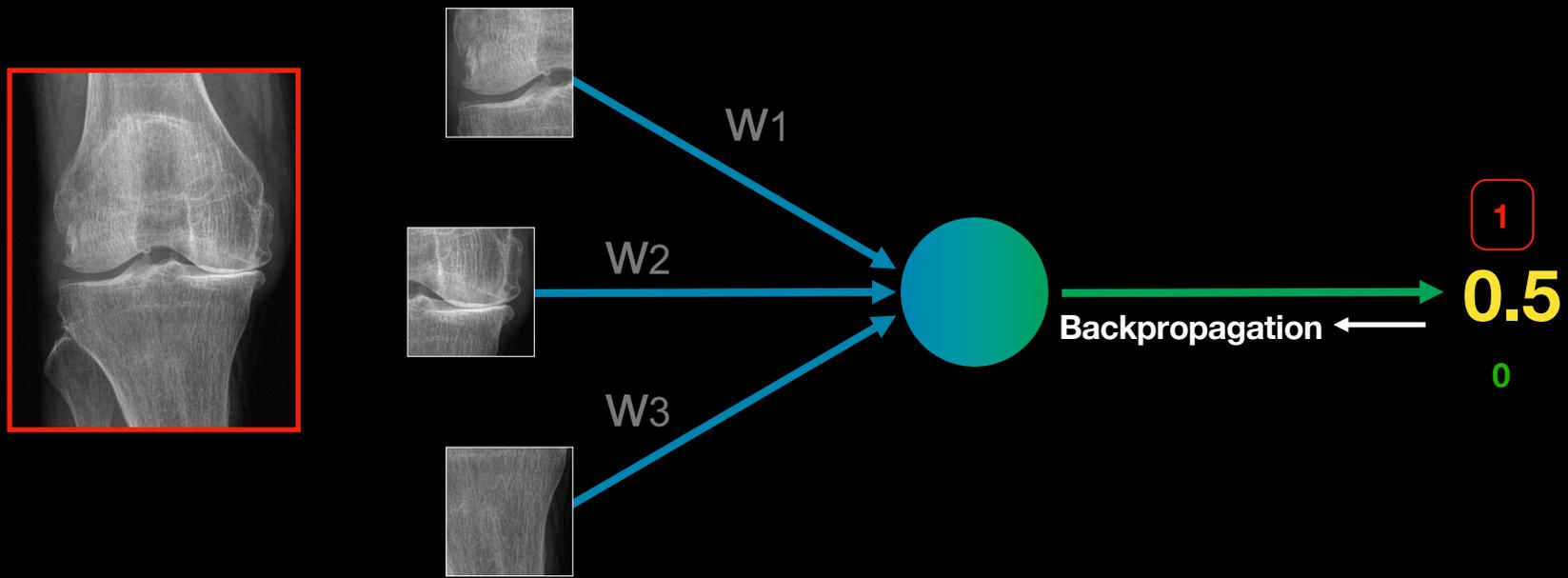
How Does Training Work?



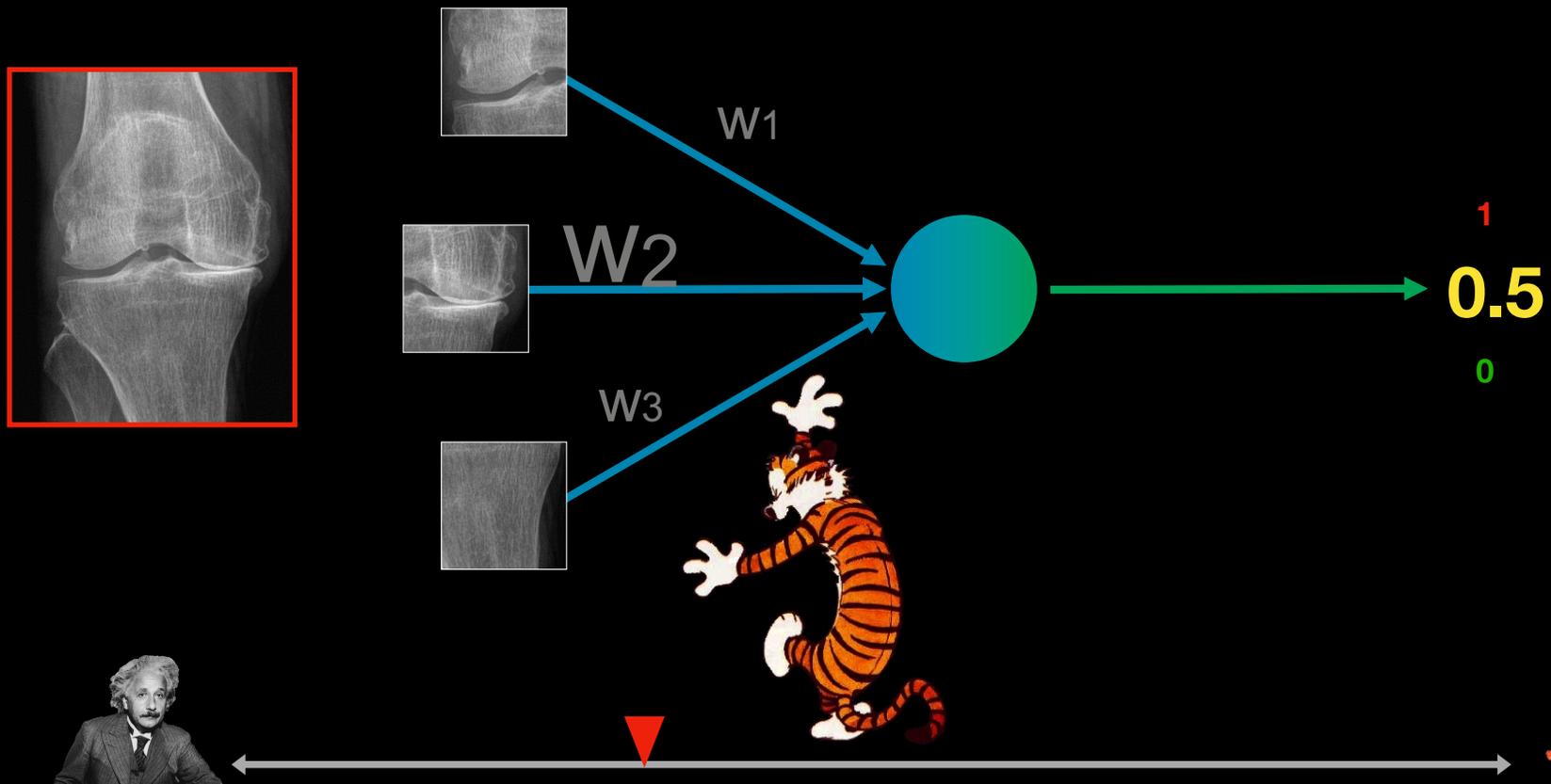
How Does Training Work?



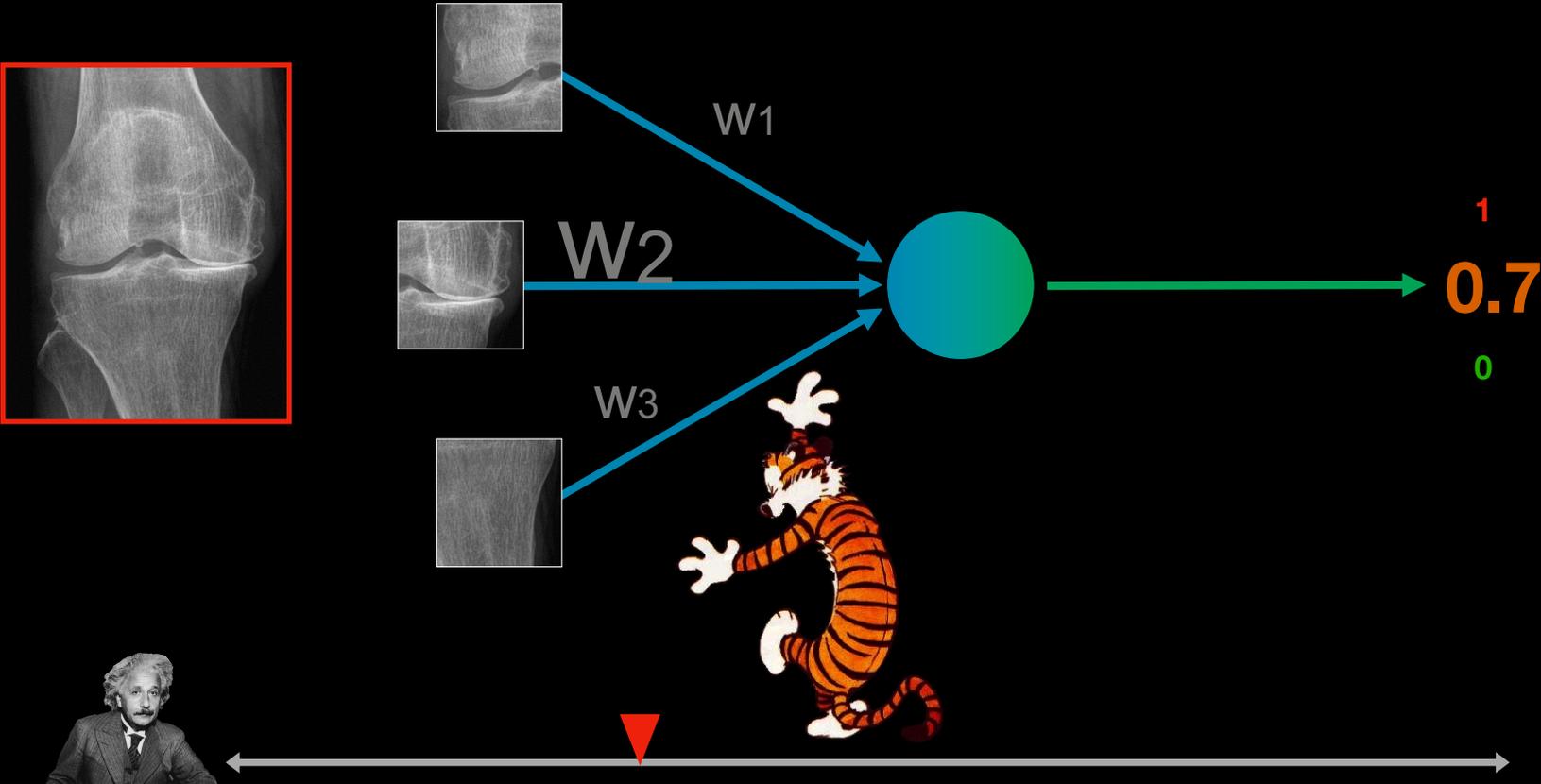
How Does Training Work?



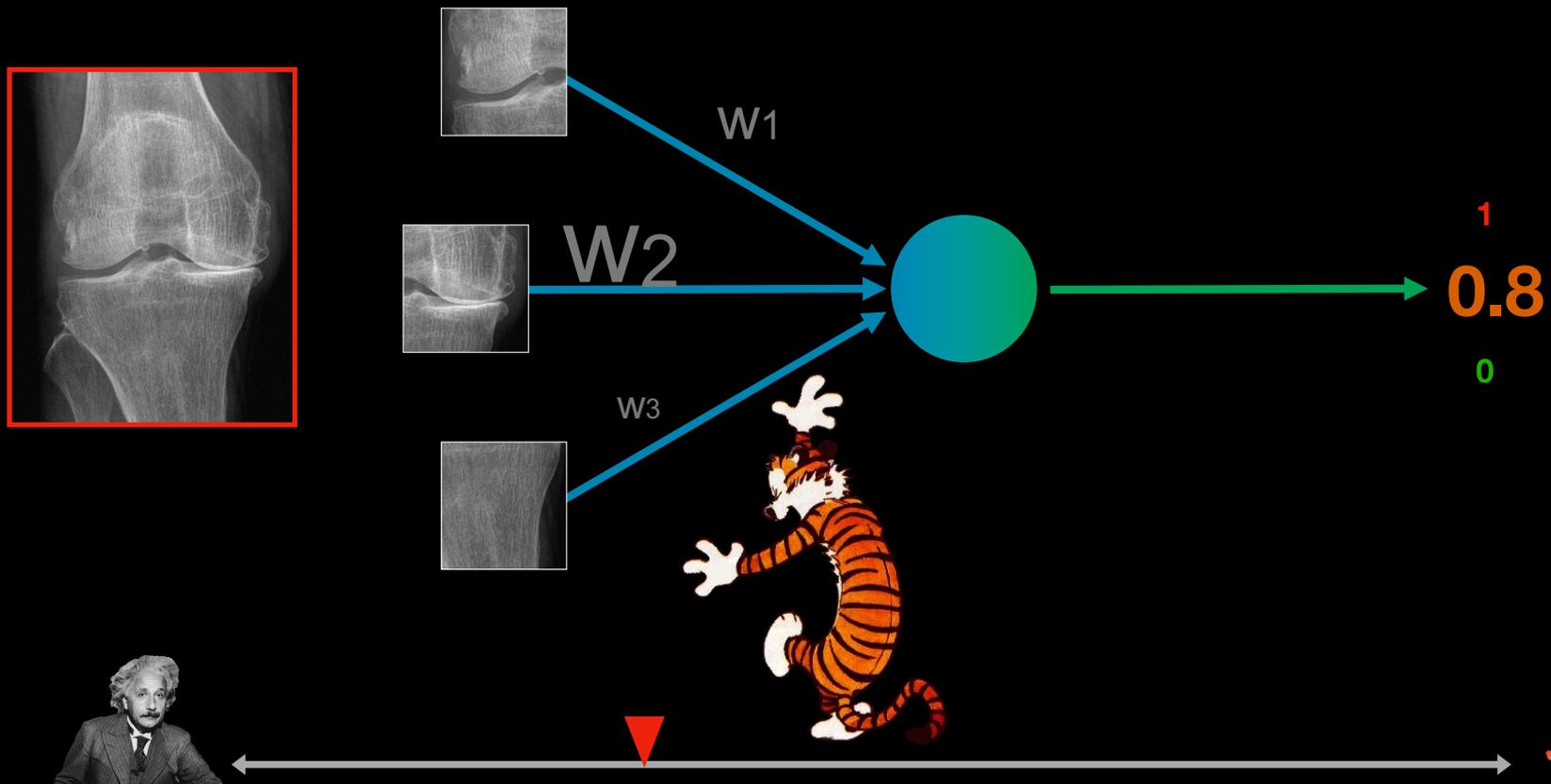
How Does Training Work?



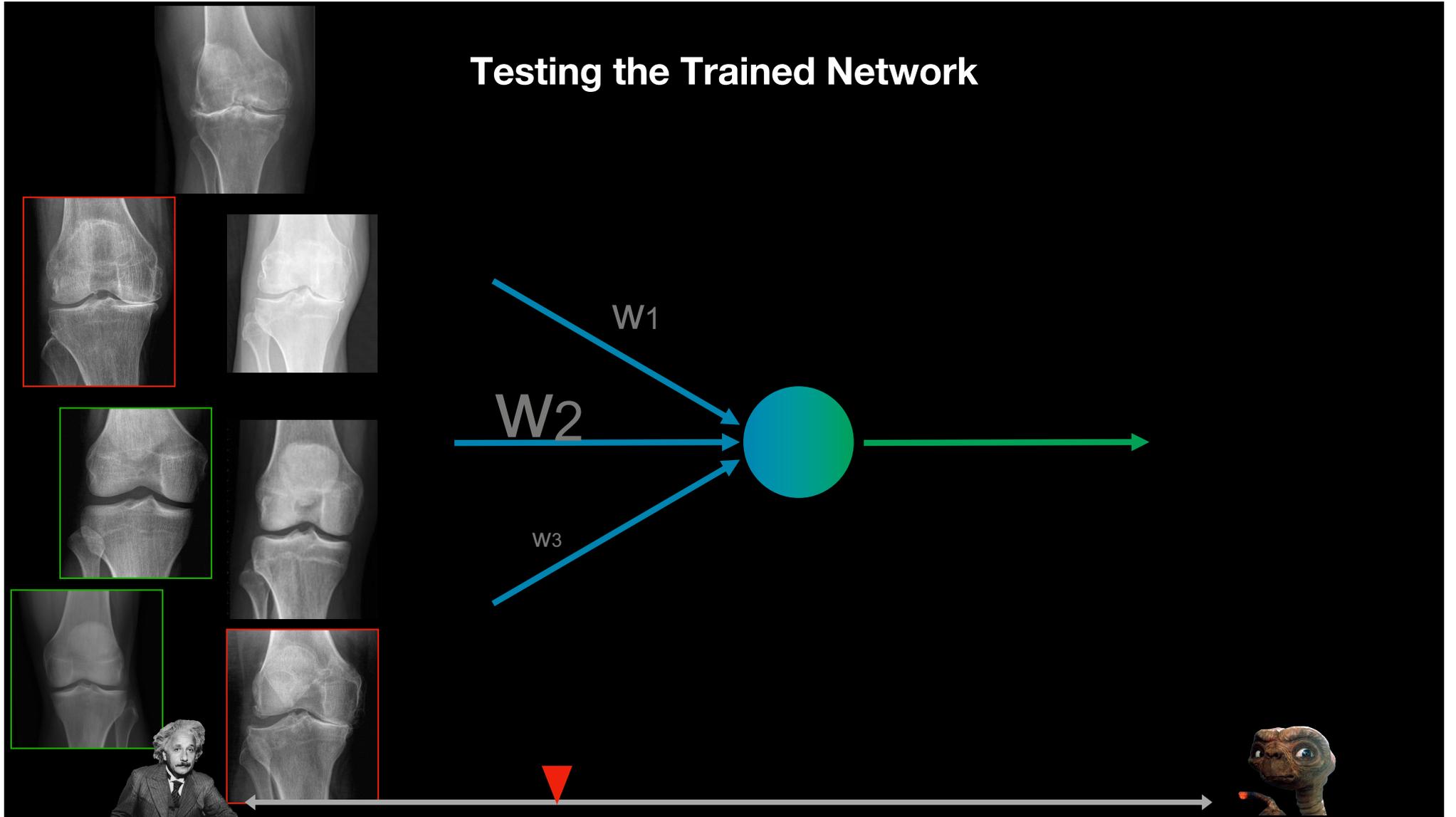
How Does Training Work?



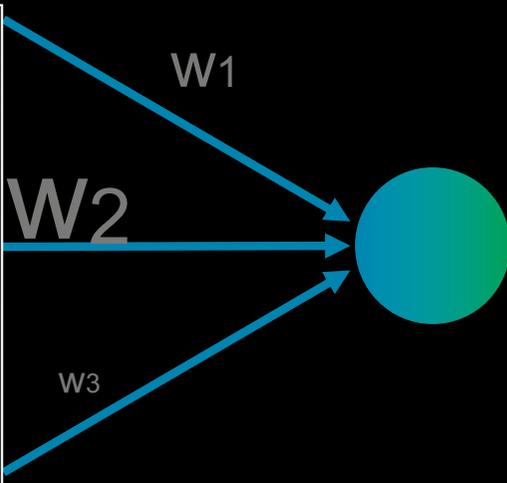
How Does Training Work?



Testing the Trained Network



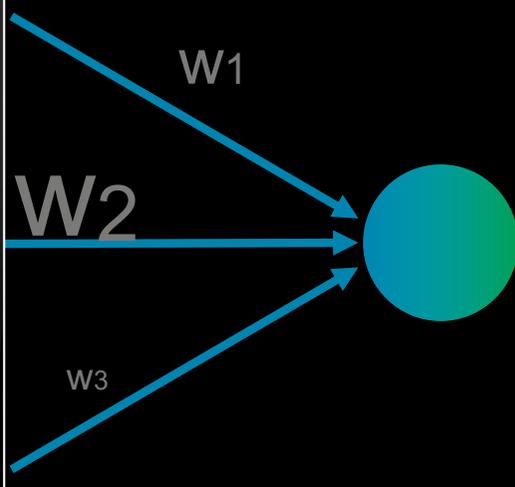
Testing the Trained Network



0.95



Testing the Trained Network



Testing the Trained Network



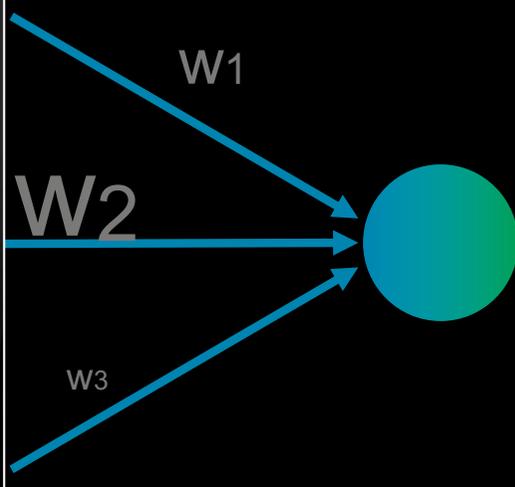
0.10



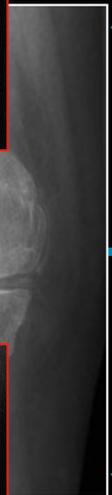
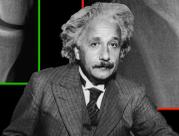
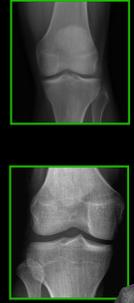
?



Testing the Trained Network



Testing the Trained Network



W1

W2

W3



0.10



Training Data

AI performance depends crucially on the data it is trained on.

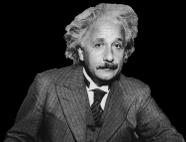


Training Data

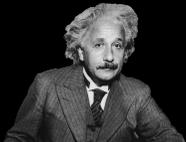
AI performance depends crucially on the data it is trained on.



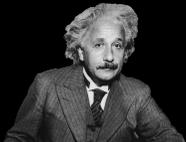
Training Data



Training Data



Training Data



Training Data



Training Data



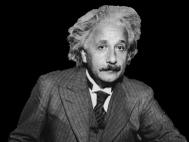
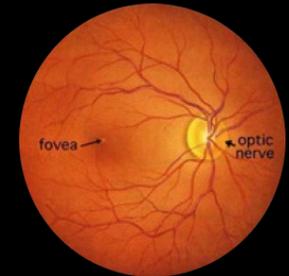
Critical Period
proper stimuli needed



Training Data



Critical Period
proper stimuli needed

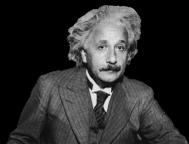


Training Data

AI performance depends crucially on the data it is trained on.



Human performance depends crucially on the data it is trained on.



Training Data

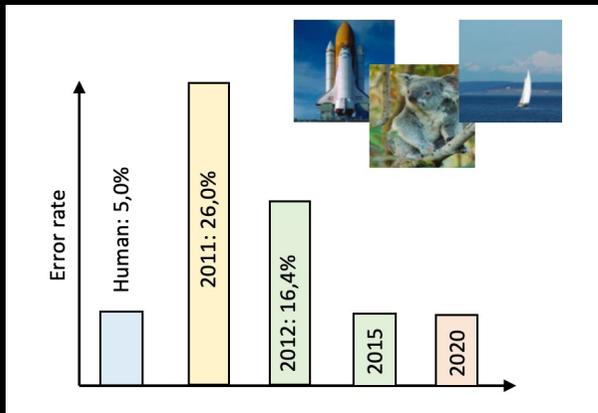
AI performance depends crucially on the data it is trained on.



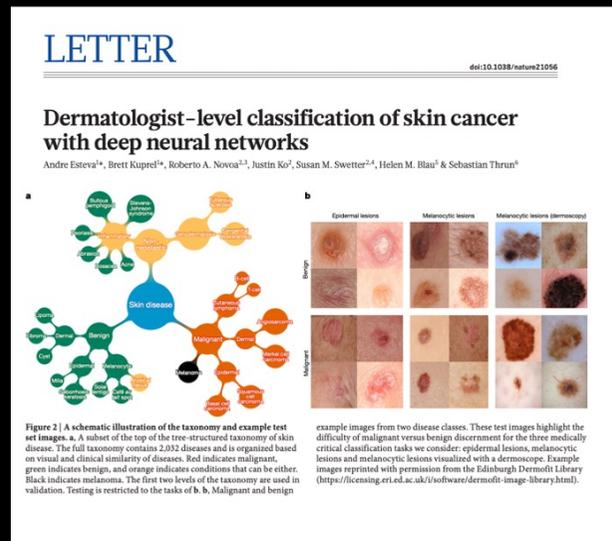
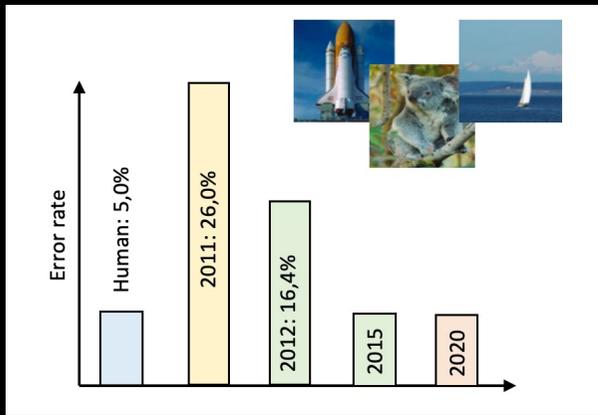
Human performance depends crucially on the data it is trained on.



AI is powerful



AI is powerful

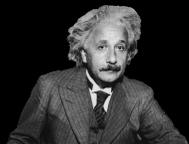


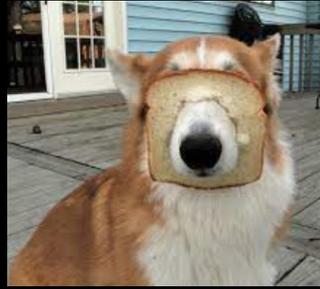
nature medicine

Deep learning can predict microsatellite instability directly from histology in gastrointestinal cancer

Jakob Nikolas Kather^{1,2,3,4,5*}, Alexander T. Pearson⁴, Niels Halama^{1,2,5,6}, Dirk Jäger^{2,3,5}, Jeremias Krause¹, Sven H. Loosen¹, Alexander Marx⁷, Peter Boor⁸, Frank Tacke⁹, Ulf Peter Neumann¹⁰, Heike I. Grabsch^{11,12}, Takaki Yoshikawa^{13,14}, Hermann Brenner^{2,15,16}, Jenny Chang-Claude^{17,18}, Michael Hoffmeister⁵, Christian Trautwein¹ and Tom Luedde^{1*}

a Find tumor. **b** Tessellate. **c** Normalize and sort MSI MSS. **d** Train Net 1, Net 2. **e** Predict MSI, MSS.





Airplane: 98%



Dog: 84%



Dog: 93%



Dog: 89%





Dog: 96%



Airplane: 98%





Dog: 96%



Airplane: 98%



Dog: 96%



Adversarial Noise



+





Dog: 96%



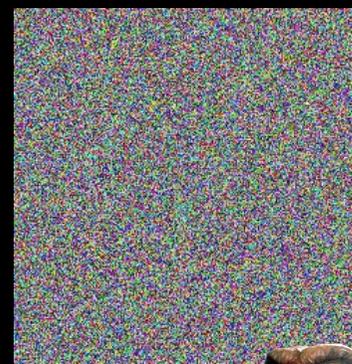
Airplane: 98%



Dog: 96%



Adversarial Noise



+

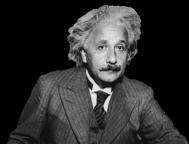
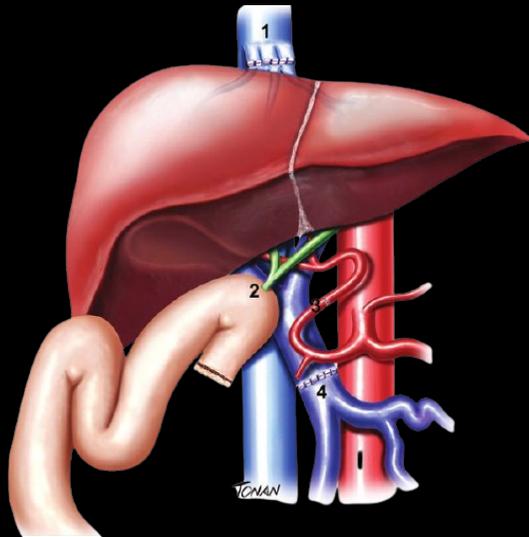


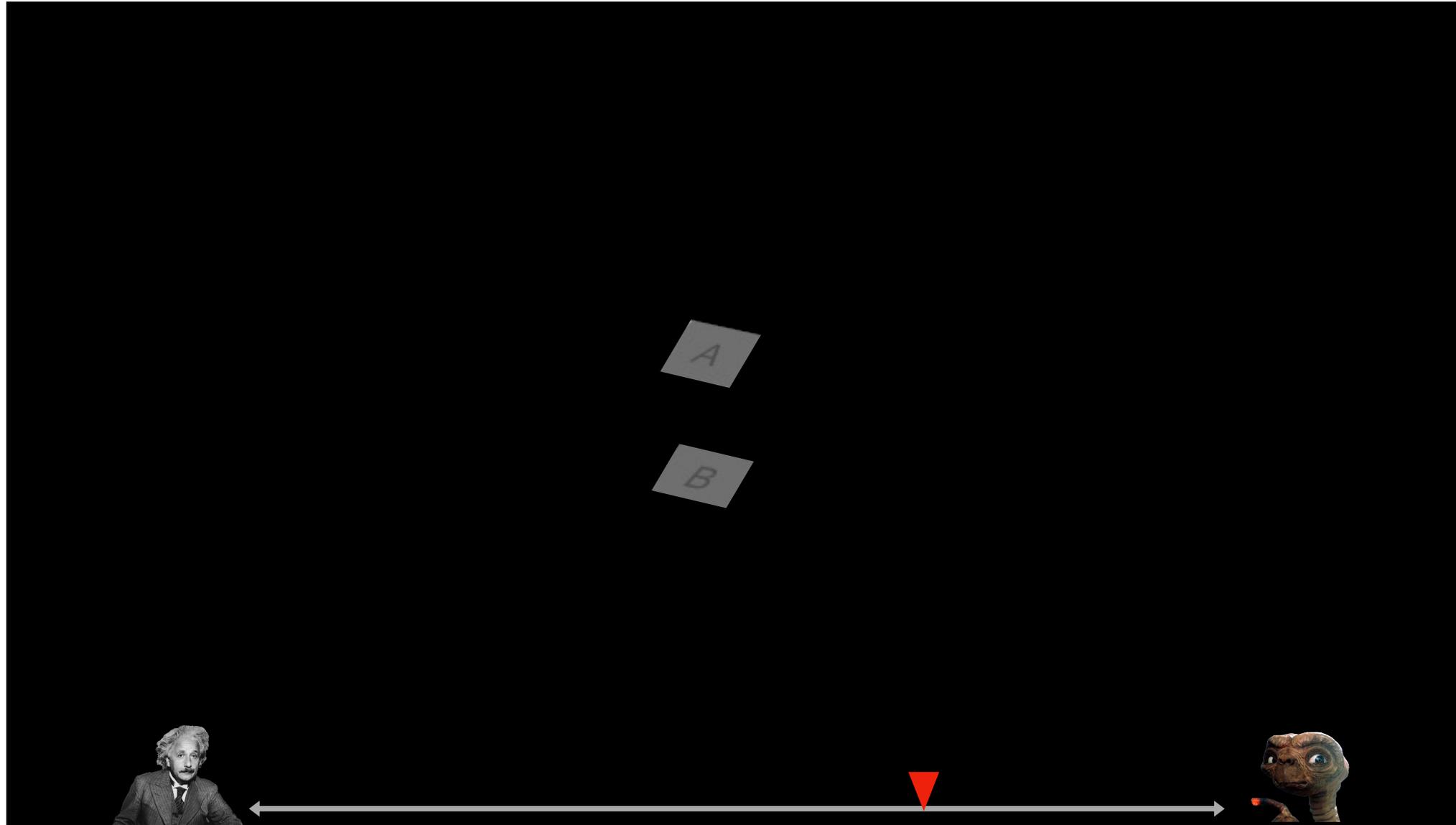
Advancing diagnostic performance and clinical usability of neural networks via adversarial training and dual batch normalization

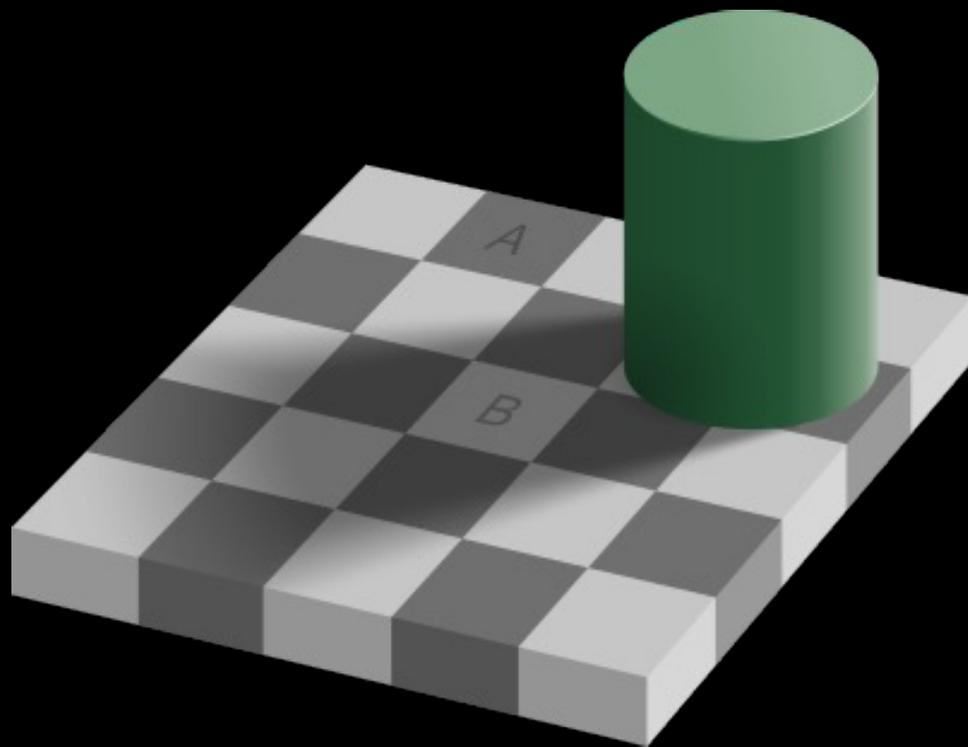
Tianyu Han^{1,5,8}, Sven Nebelung², Federico Pedersoli², Markus Zimmermann², Maximilian Schulze-Hagen², Michael Ho³, Christoph Haaburger³, Fabian Kiessling^{4,5,6}, Christiane Kuhl², Volkmar Schulz^{1,5,6,7,8,9} & Daniel Truhn^{2,7,8,9}

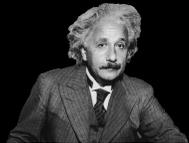
Adversarial attacks and adversarial robustness in computational pathology

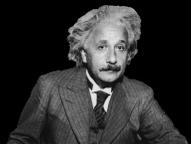
Narmin Ghaffari Laleh (1), Daniel Truhn (2), Gregory Patrick Veldhuizen (1), Tianyu Han (3), Marko van Treeck (1), Roman D. Buelow (4), Rupert Langer (5, 6), Bastian Dislich (5), Peter Boor (4), Volkmar Schulz (3, 7, 8), Jakob Nikolas Kather (1, 9, 10, 11)















2021



"a hedgehog using a calculator"



"a corgi wearing a red bowtie and a purple party hat"

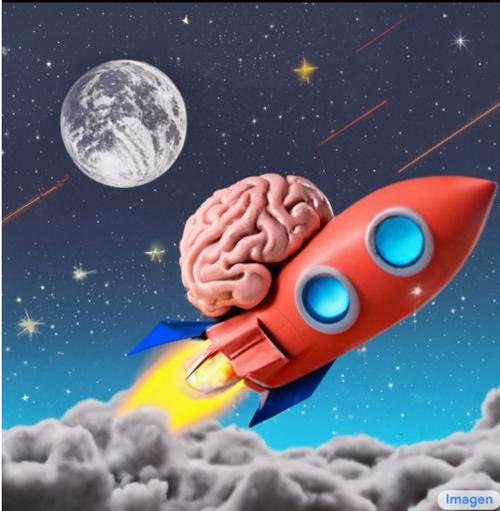


"robots meditating in a vipassana retreat"



"a fall landscape with a small cottage next to a lake"

2022



A brain riding a rocketship heading towards the moon.



A dragon fruit wearing karate belt in the snow.



A small cactus wearing a straw hat and neon sunglasses in the Sahara desert.



A photo of a Corgi dog riding a bike in Times Square. It is wearing sunglasses and a beach hat.

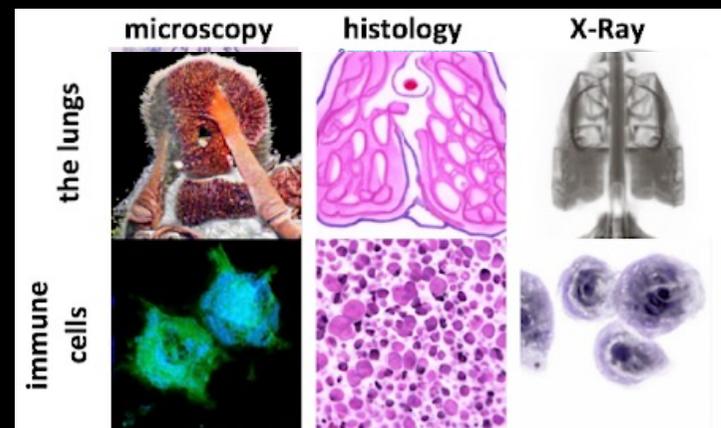


COMMENT OPEN



Medical domain knowledge in domain-agnostic generative AI

Jakob Nikolas Kather^{1,2,3,4}, Narmin Ghaffari Laleh¹, Sebastian Foersch⁵ and Daniel Truhn⁶



COMMENT OPEN

Check for updates

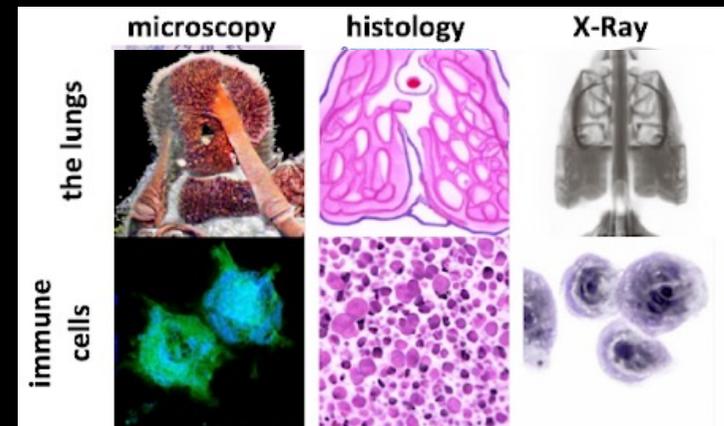
Medical domain knowledge in domain-agnostic generative AI

Jakob Nikolas Kather^{1,2,3,4,5}, Narmin Ghaffari Laleh¹, Sebastian Foersch⁵ and Daniel Truhn⁶

"A photo of blood vessels"



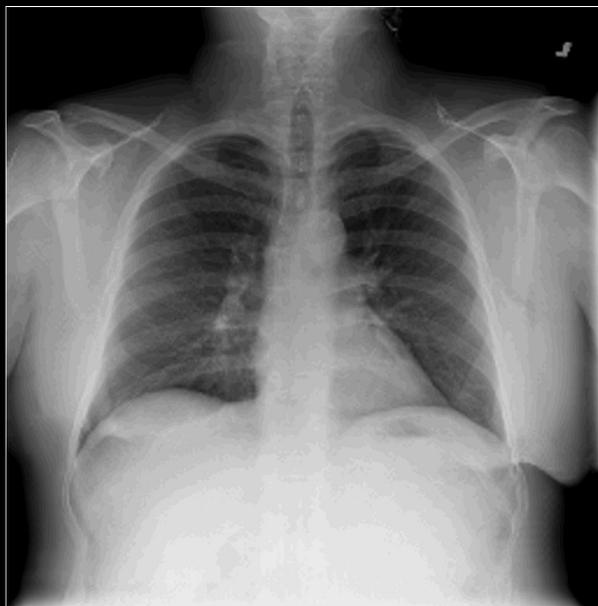
"A histopathological image of Grave's disease"



COMPUTER SCIENCE

Breaking medical data sharing boundaries by using synthesized radiographs

Tianyu Han¹, Sven Nebelung², Christoph Haaburger³, Nicolas Horst⁴, Sebastian Reinartz^{1,5}, Dorit Merhof^{6,6,7}, Fabian Kiessling^{6,7,8}, Volkmar Schulz^{1,6,7,4,1}, Daniel Truhn^{3,5,4}



COMPUTER SCIENCE

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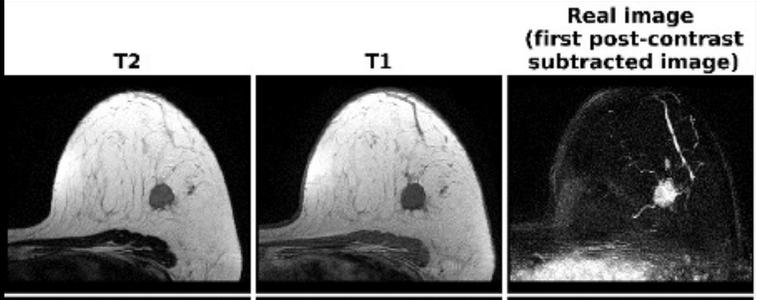


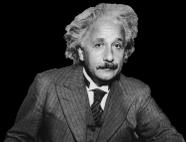
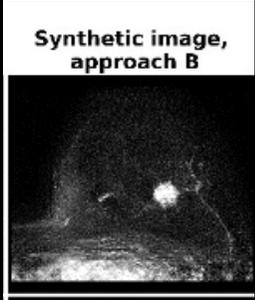
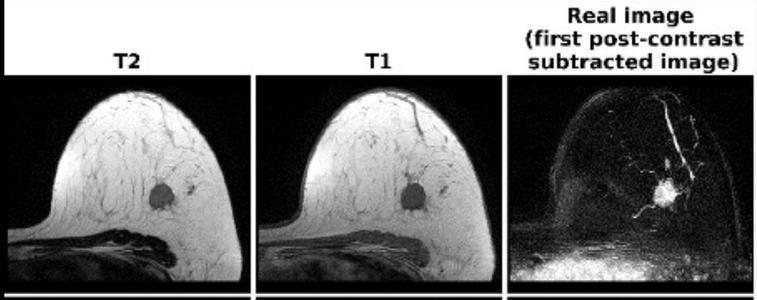
COMPUTER SCIENCE

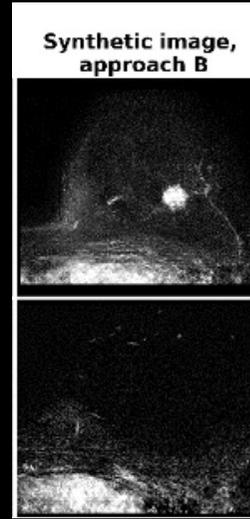
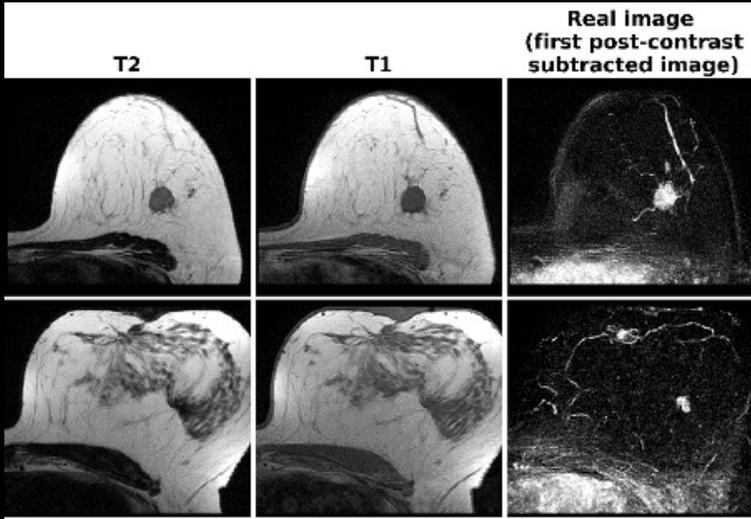
Breaking medical data sharing boundaries by using synthesized radiographs

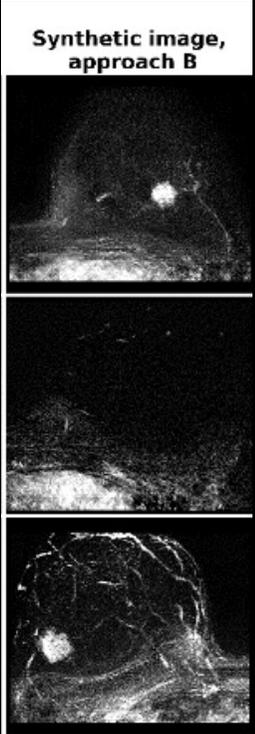
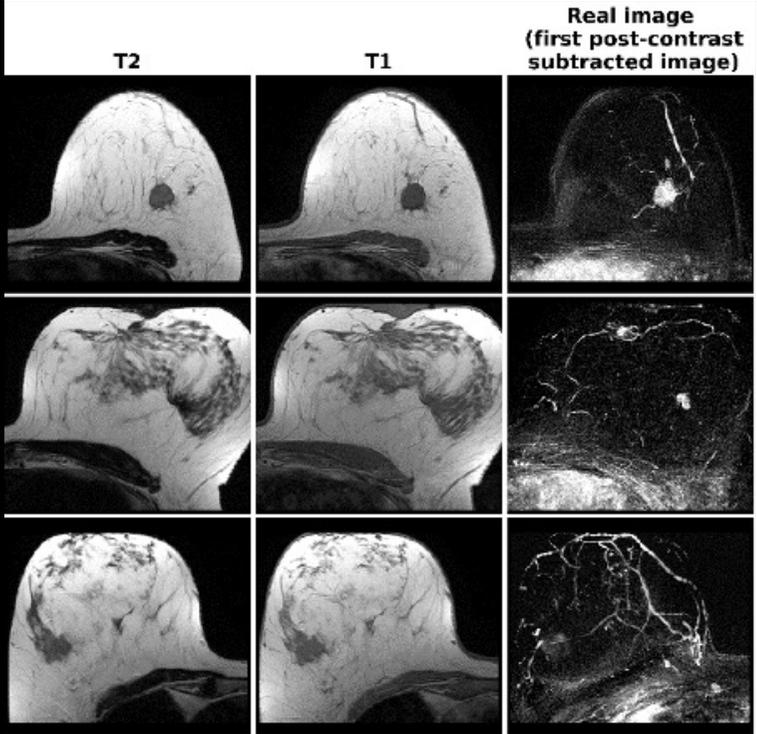
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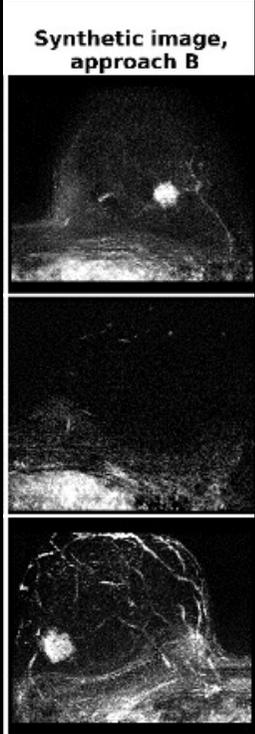
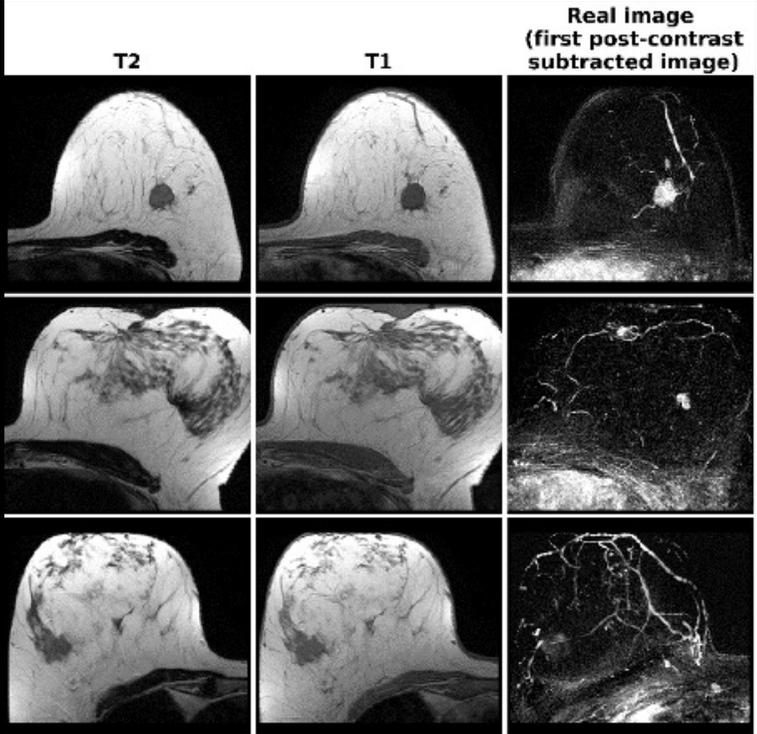






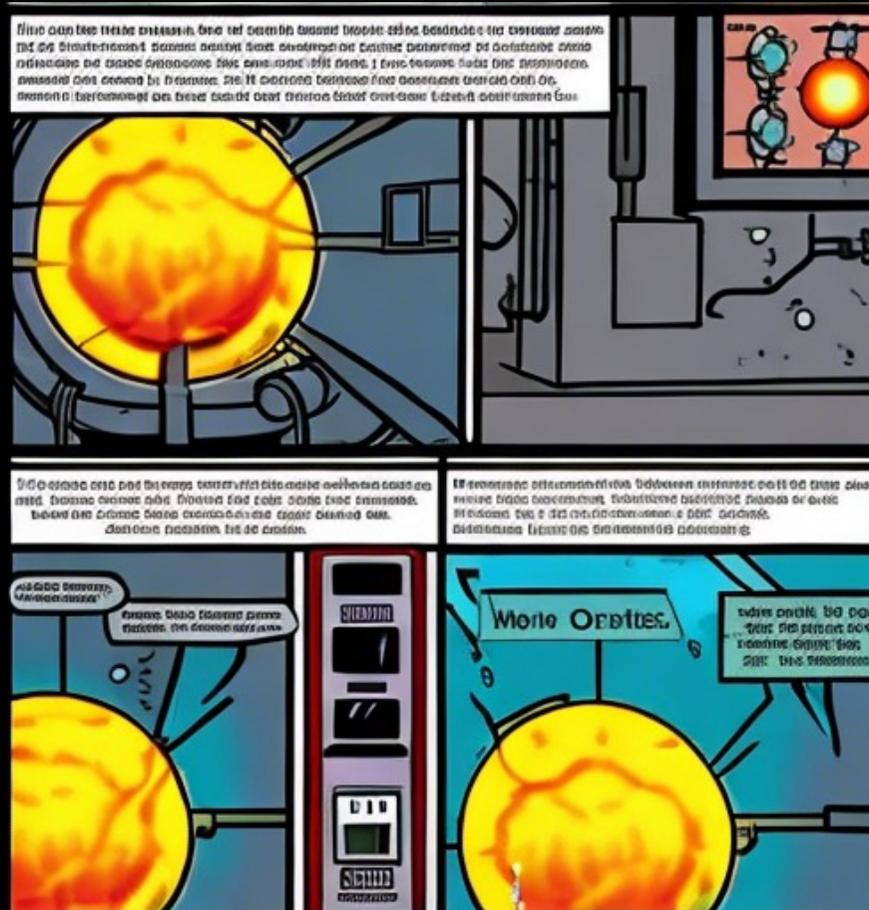




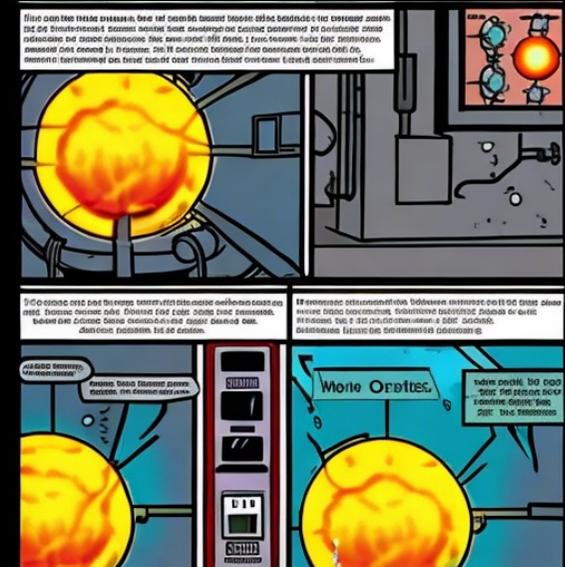
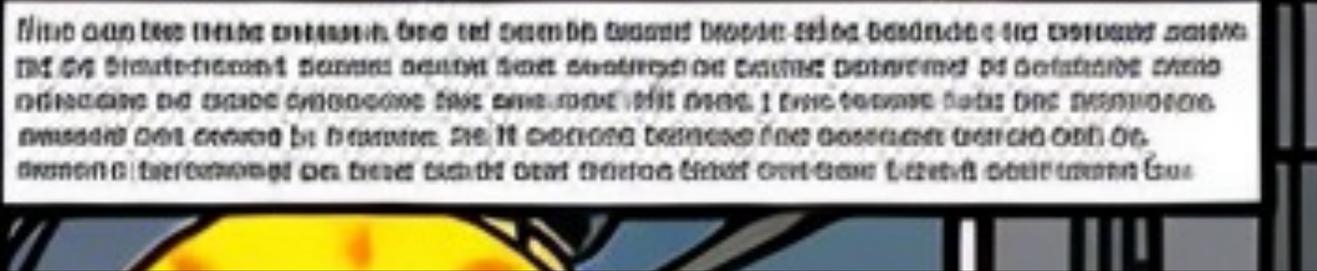


*A comic page that depicts how to achieve
nuclear fusion to solve the energy crisis.*

A comic page that depicts how to achieve nuclear fusion to solve the energy crisis.



A comic page that depicts how to achieve nuclear fusion to solve the energy crisis.



The future of planet earth

The future of planet earth



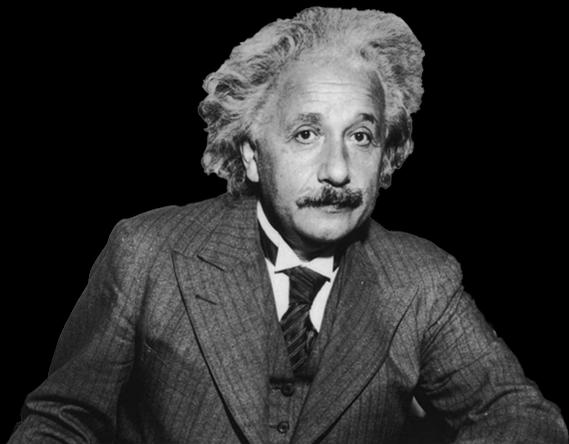
*Medical doctors running from a robot that
exhibits artificial intelligence.*

Medical doctors running from a robot that exhibits artificial intelligence.



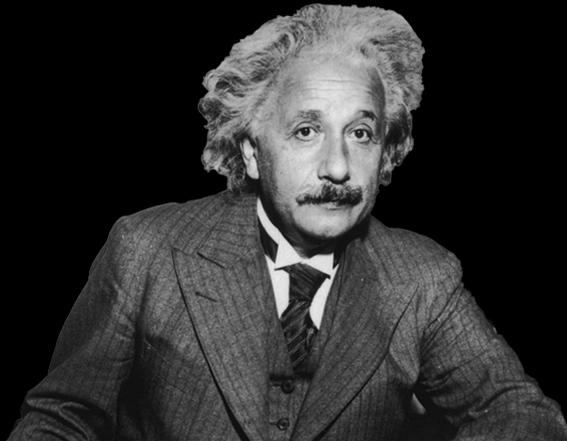
*A schematic drawing of how AI imagines its
integration into clinical routine.*







$$E = mc^2$$

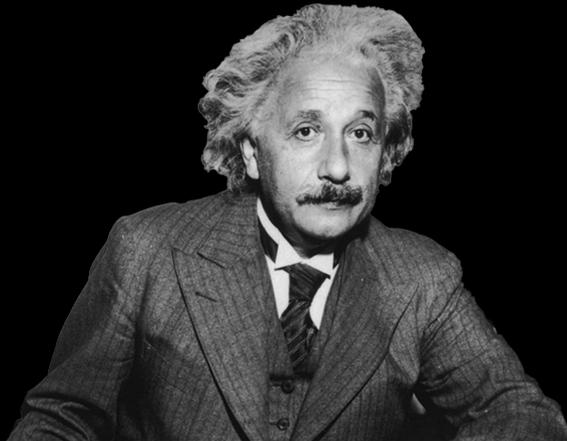


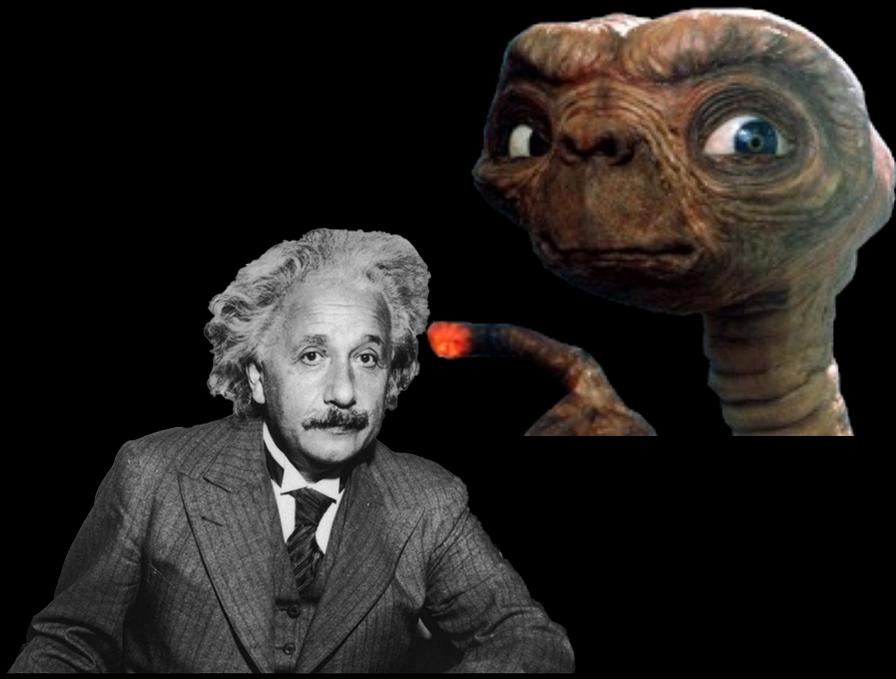


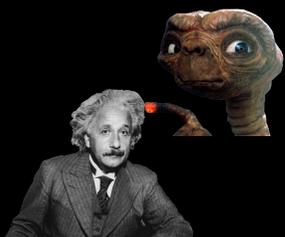
$$E = mc^2$$

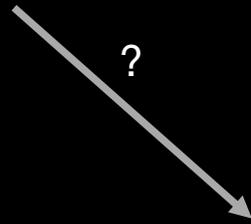
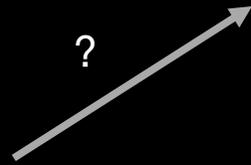


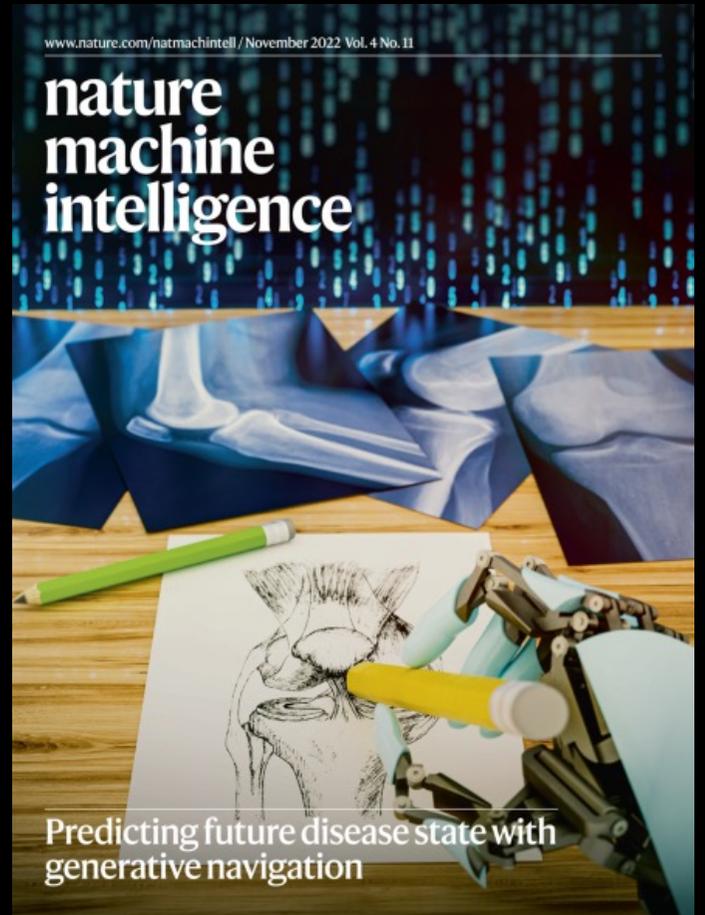
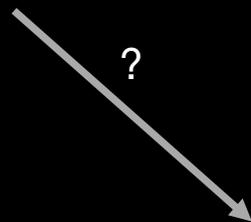
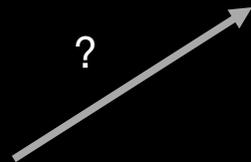
"Phone home"







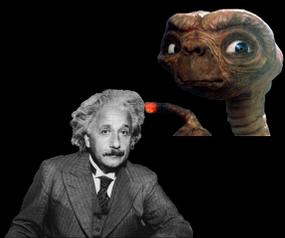


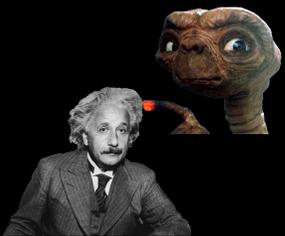


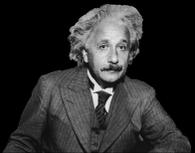
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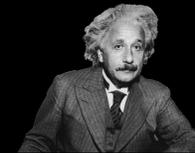
nature machine intelligence

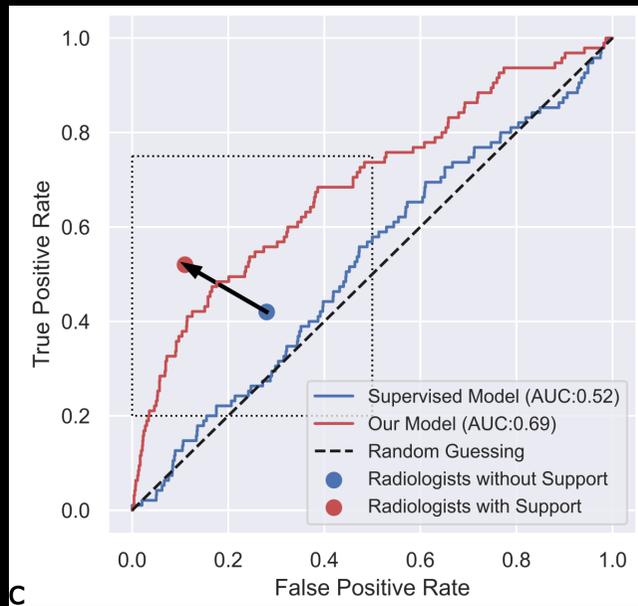
Predicting future disease state with
generative navigation

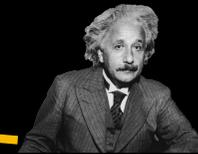
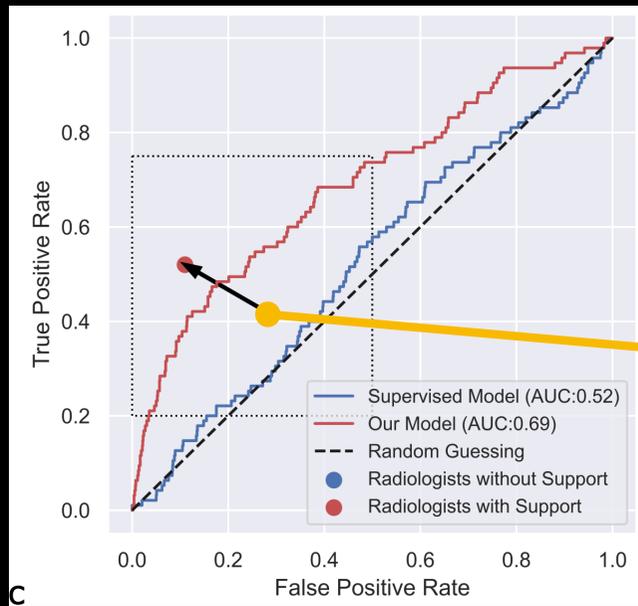
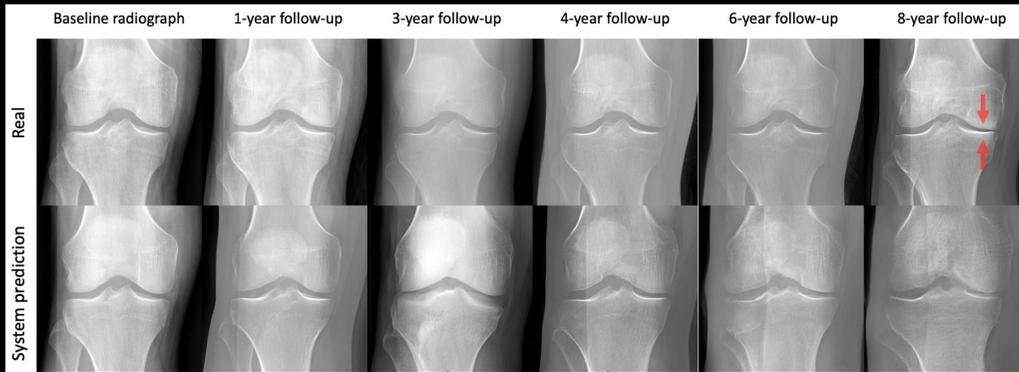


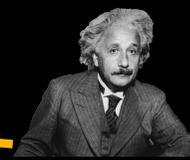
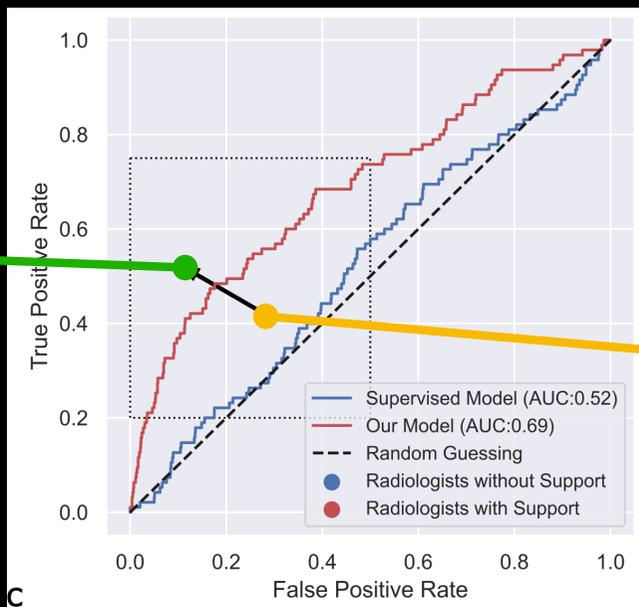
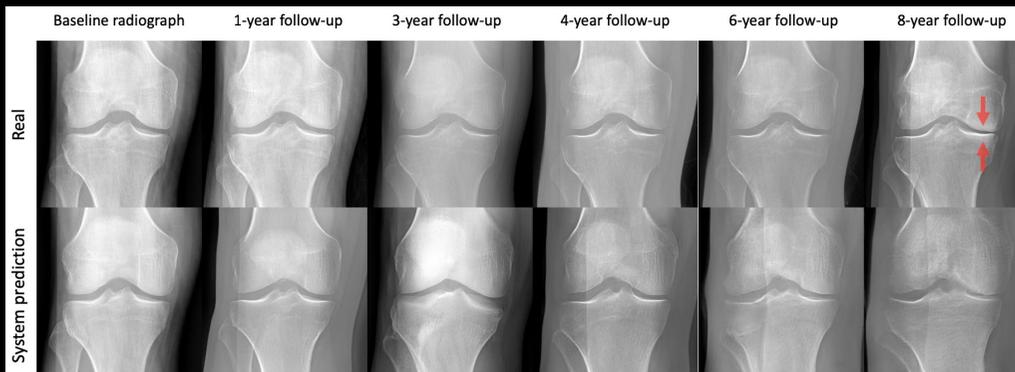












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Thank you!

