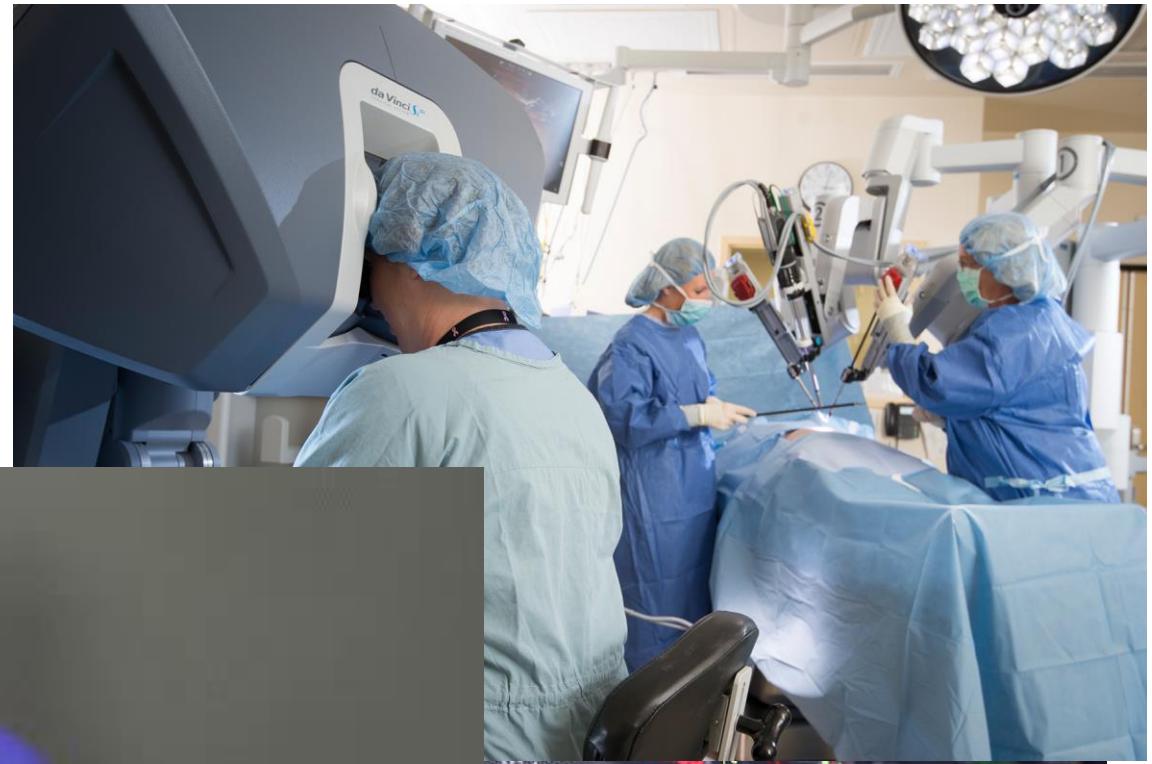


AI and Healthcare

Ahmed Serag, Ph.D.

Senior Scientist and Research Lead

22/10/2019



Agenda

- What's AI?
- What's AI potential impact for businesses?
- How AI can change healthcare?
- Medical data types
- Challenges in medical image analysis
- AI applications in radiology and pathology
- Challenges ahead
- Conclusions

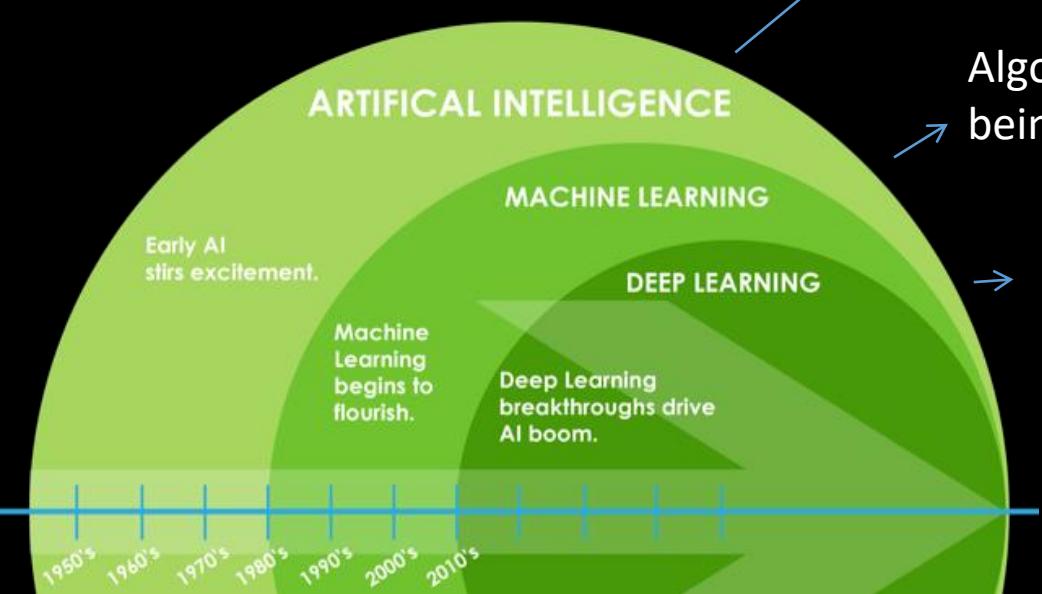
“A.I. is one of the most important things humanity is working on. It’s more profound than, I don’t know, electricity or fire.”

Sundar Pichai

GOOGLE CEO, ON ARTIFICIAL INTELLIGENCE



REVOLUTION
MSNBC & recode

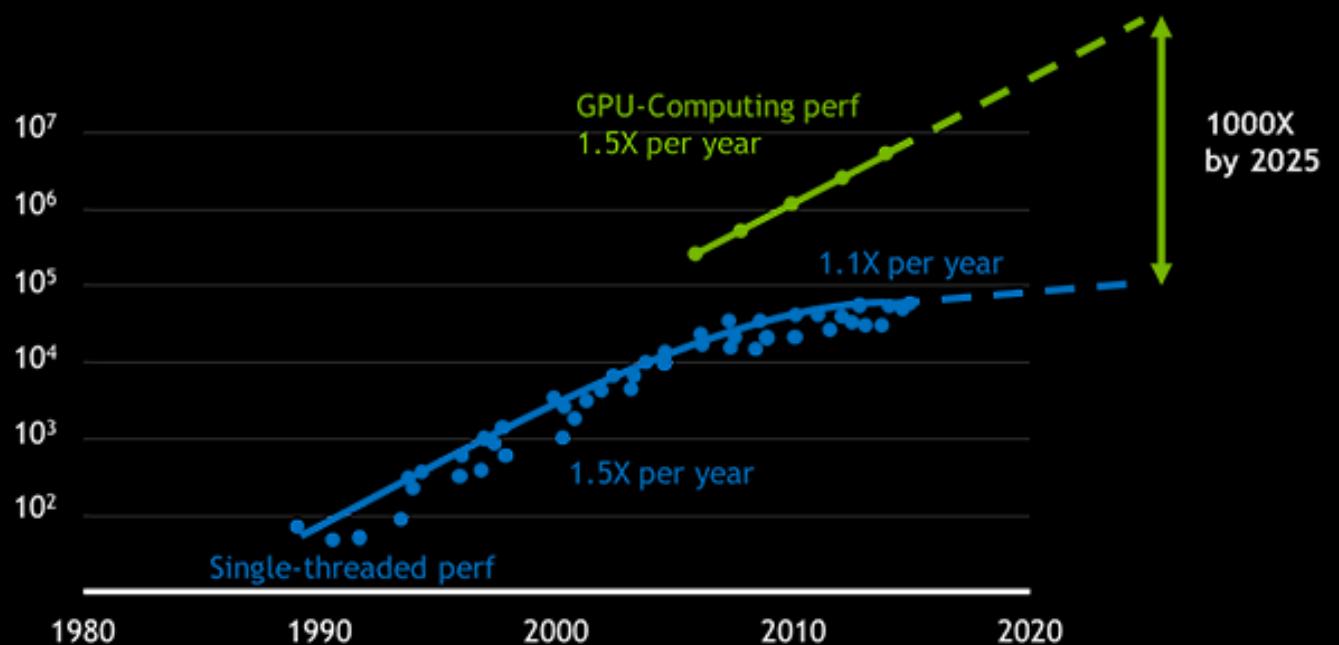
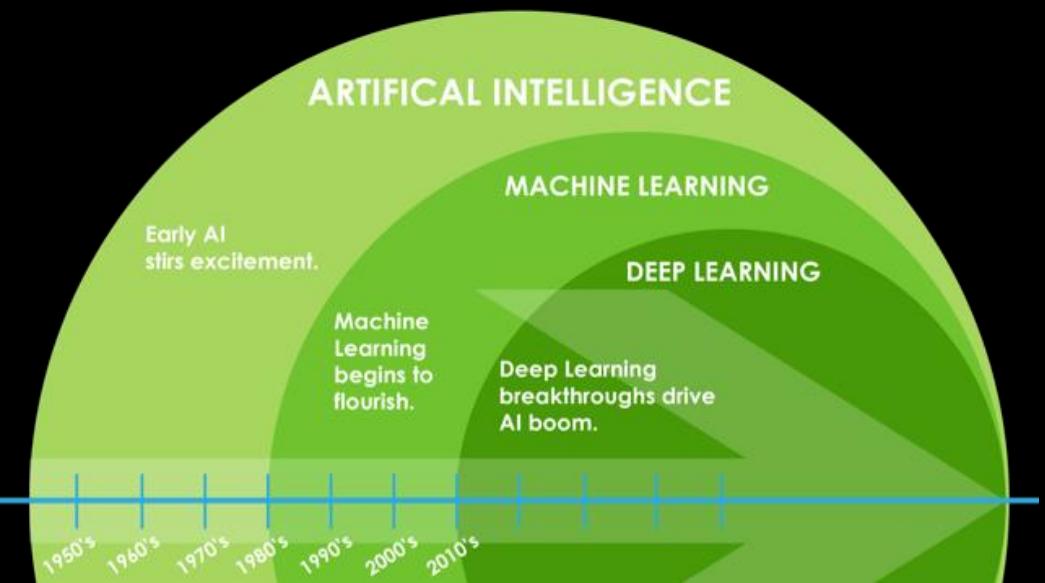


Any techniques that enable machines to solve a task in a way like humans do

Algorithms that allow machines to learn from examples without being explicitly programmed

→ A subset of ML techniques which uses deep artificial neural networks to build a hierarchy of data representations

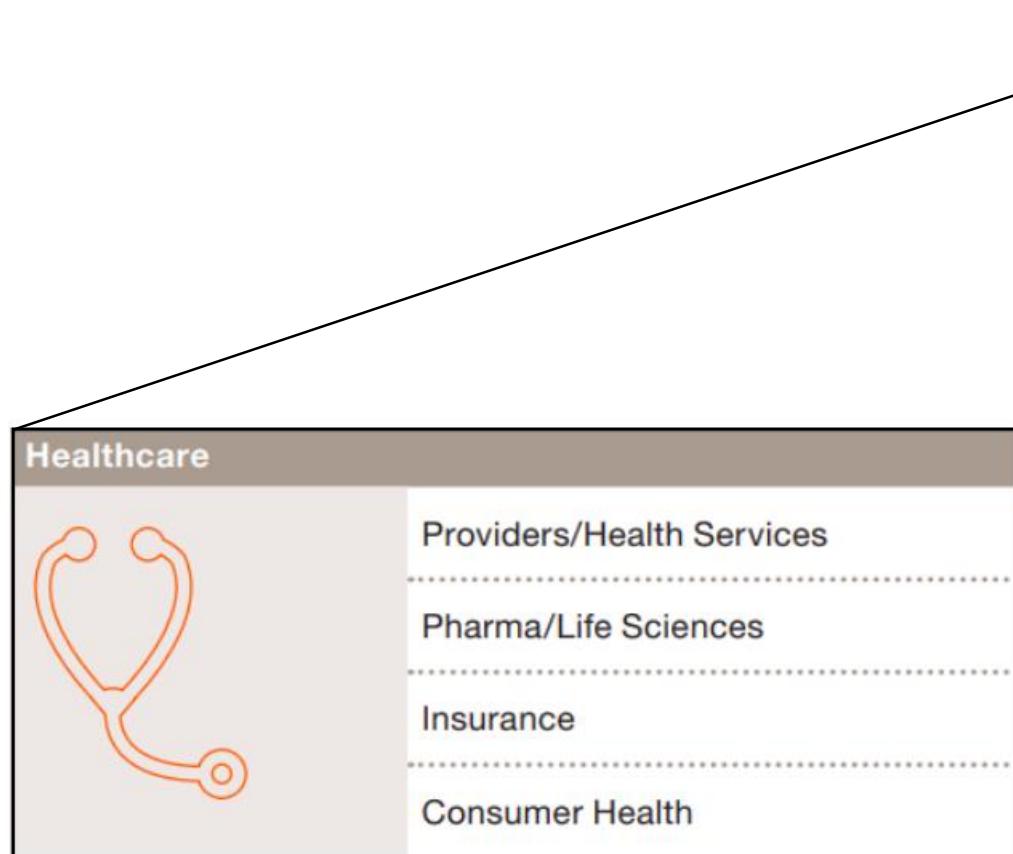
RISE OF GPU COMPUTING



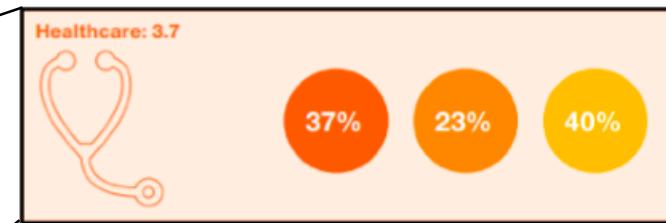
Original data up to the year 2010 collected and plotted by M. Horowitz, F. Labonte, O. Shacham, K. Olukotun, L. Hammond, and C. Batten. New plot and data collected for 2010-2015 by K. Rupp.

Source: nvidia





- % Adoption maturity – Near term (0-3 yr)
- % Adoption maturity – Mid term (3-7 yr)
- % Adoption maturity – Long term (7+ yr)

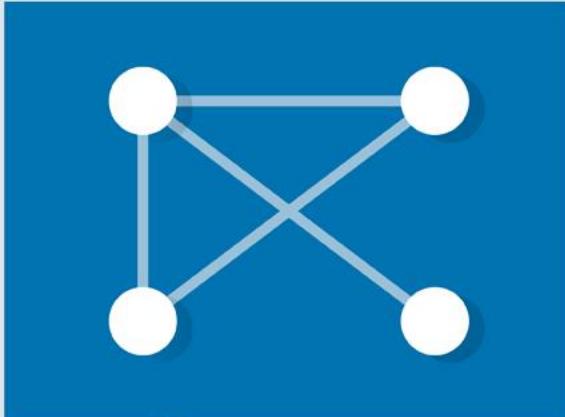


Source: PwC

10 AI Applications That Could Change Health Care

APPLICATION	POTENTIAL ANNUAL VALUE BY 2026	KEY DRIVERS FOR ADOPTION
Robot-assisted surgery	\$40B	Technological advances in robotic solutions for more types of surgery
Virtual nursing assistants	20	Increasing pressure caused by medical labor shortage
Administrative workflow	18	Easier integration with existing technology infrastructure
Fraud detection	17	Need to address increasingly complex service and payment fraud attempts
Dosage error reduction	16	Prevalence of medical errors, which leads to tangible penalties
Connected machines	14	Proliferation of connected machines/devices
Clinical trial participation	13	Patent cliff; plethora of data; outcomes-driven approach
Preliminary diagnosis	5	Interoperability/data architecture to enhance accuracy
Automated image diagnosis	3	Storage capacity; greater trust in AI technology
Cybersecurity	2	Increase in breaches; pressure to protect health data

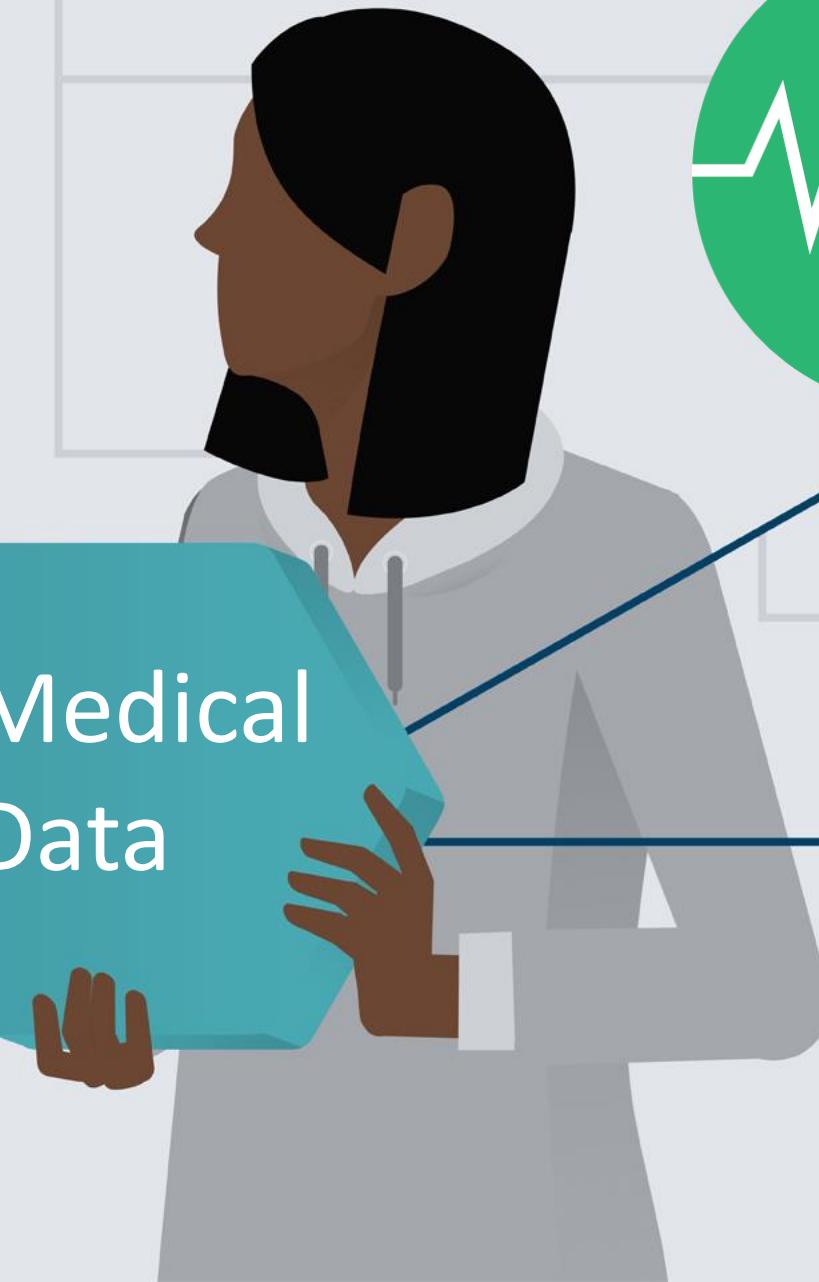
Narrative, textual data



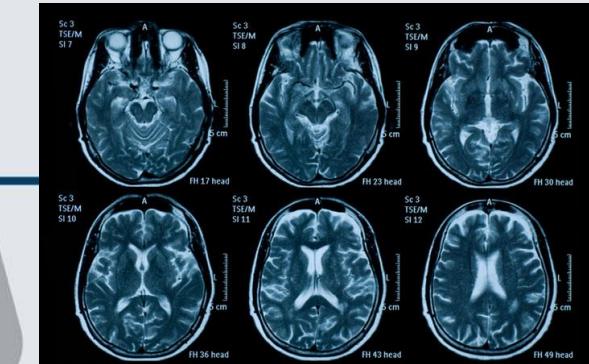
Signals



Medical
Data



Numerical measurements



Images

Medical Records & Signals

Hospital develops AI to identify patients likely to skip appointments

Exclusive: London's UCLH creates tool predicting 90% of no-shows – potentially saving NHS millions



▲ Even an imprecise indication of which patients will attend could save hospitals vast sums of money and help cut waiting times. Photograph: Hannah McKay

A leading hospital has developed artificial intelligence to predict which patients are most likely to miss appointments.

University College Hospital in [London](#) created an algorithm using records from 22,000 appointments for MRI scans, allowing it to identify 90% of those patients who would turn out to be no-shows.



AI predicts hospital readmission rates from clinical notes

KYLE WIGGERS @KYLE_L_WIGGERS APRIL 11, 2019 9:28 AM



Image Credit: iStock / Steve Debenport

Electronic health records store valuable information about hospital patients, but they're often sparse and unstructured, making them difficult for potentially labor- and time-saving AI systems to parse. Fortunately, researchers at New York University and Princeton have developed a framework that evaluates clinical notes (i.e., descriptions of symptoms, reasons for diagnoses, and radiology results) and autonomously assigns a risk score indicating whether patients will be readmitted within 30 days.

[Home](#) > [Behind the Headlines](#) > [Medical practice](#)

Mobile phone app 'helps doctors detect acute kidney injury'

Thursday 1 August 2019

BBC News reports: "A mobile phone app has speeded up the detection of a potentially fatal kidney condition in hospital patients."

While it is relatively unknown, acute kidney injury puts a considerable strain on NHS resources (estimated at £1 billion in England) and is responsible for around 100,000 deaths per year in the UK.

The app, called Streams, is a secure mobile device that brings together important medical information, like patients' blood test results, in one place.

It brings together data and test results from a range of IT systems used by the hospital and alerts medical teams if acute kidney injury has been confirmed.

AI neural network detects heart failure from a single heartbeat

30 September 2019

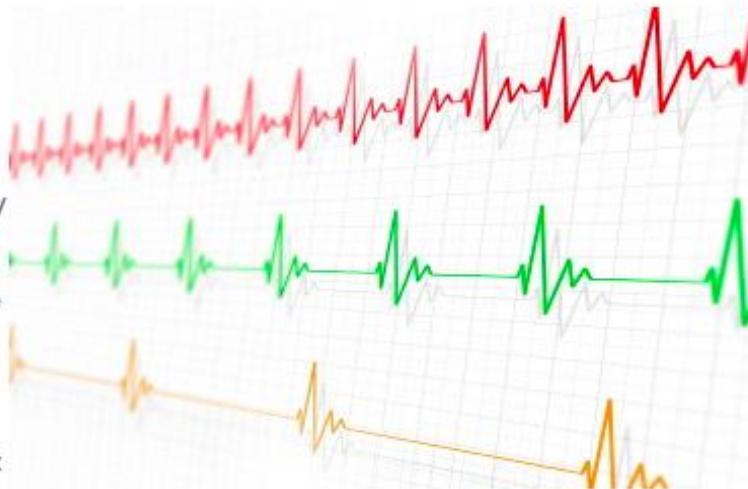
Researchers developed a neural network that identifies congestive heart failure with 100% accuracy through analysis of just one raw electrocardiogram heartbeat.

Congestive heart failure (CHF) is a chronic progressive condition that affects the pumping power of the heart muscles. Associated with high prevalence, significant mortality rates and sustained healthcare costs, clinical practitioners and health systems urgently require efficient detection processes.

Dr Sebastiano Massaro, Associate Professor of Organisational Neuroscience at the [University of Surrey](#), has worked with colleagues Mihaela Porumb and Dr Leandro Pecchia at the University of Warwick and Ernesto Iadanza at the University of Florence, to tackle these important concerns by using Convolutional Neural Networks (CNN) – hierarchical neural networks highly effective in recognising patterns and structures in data.

Published in Biomedical Signal Processing and Control Journal, their research drastically improves existing CHF detection methods typically focused on heart rate variability that, whilst effective, are time-consuming and prone to errors. Conversely, their new model uses a combination of advanced signal processing and machine learning [tools](#) on raw ECG signals, delivering 100% accuracy.

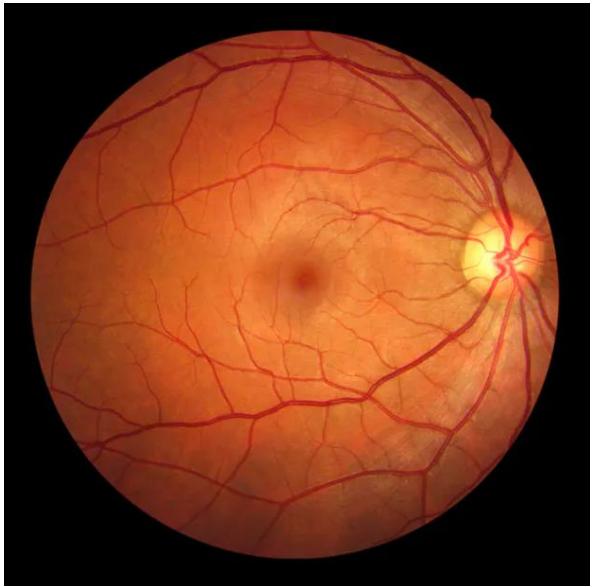
Dr Massaro said: "We trained and tested the CNN model on large publicly available ECG datasets featuring subjects with CHF as well as healthy, non-arrhythmic hearts. Our model delivered 100% accuracy: by checking just one heartbeat we are able detect whether or not a person has heart failure. Our model is also one of the first known to be able to identify the ECG's morphological features specifically associated to the severity of the condition."



Medical Image Analysis



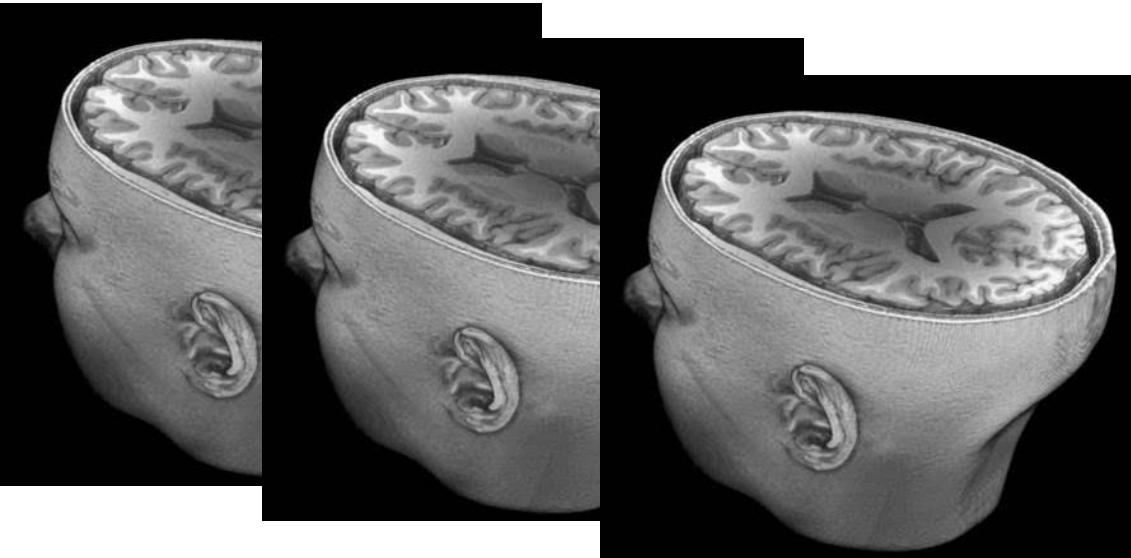
Grayscale Image (2D)



Color Image (2D)



Grayscale Image (3D)

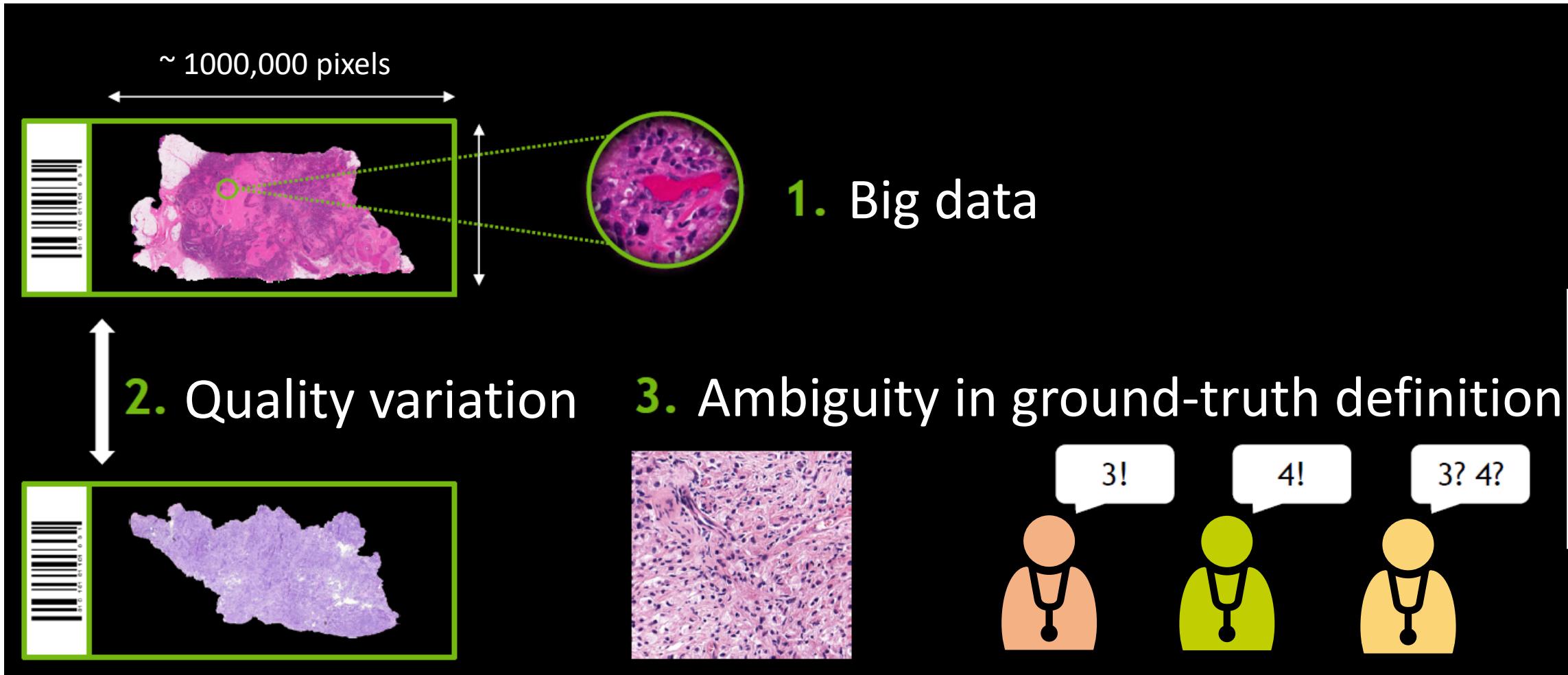


Grayscale Image (4D)



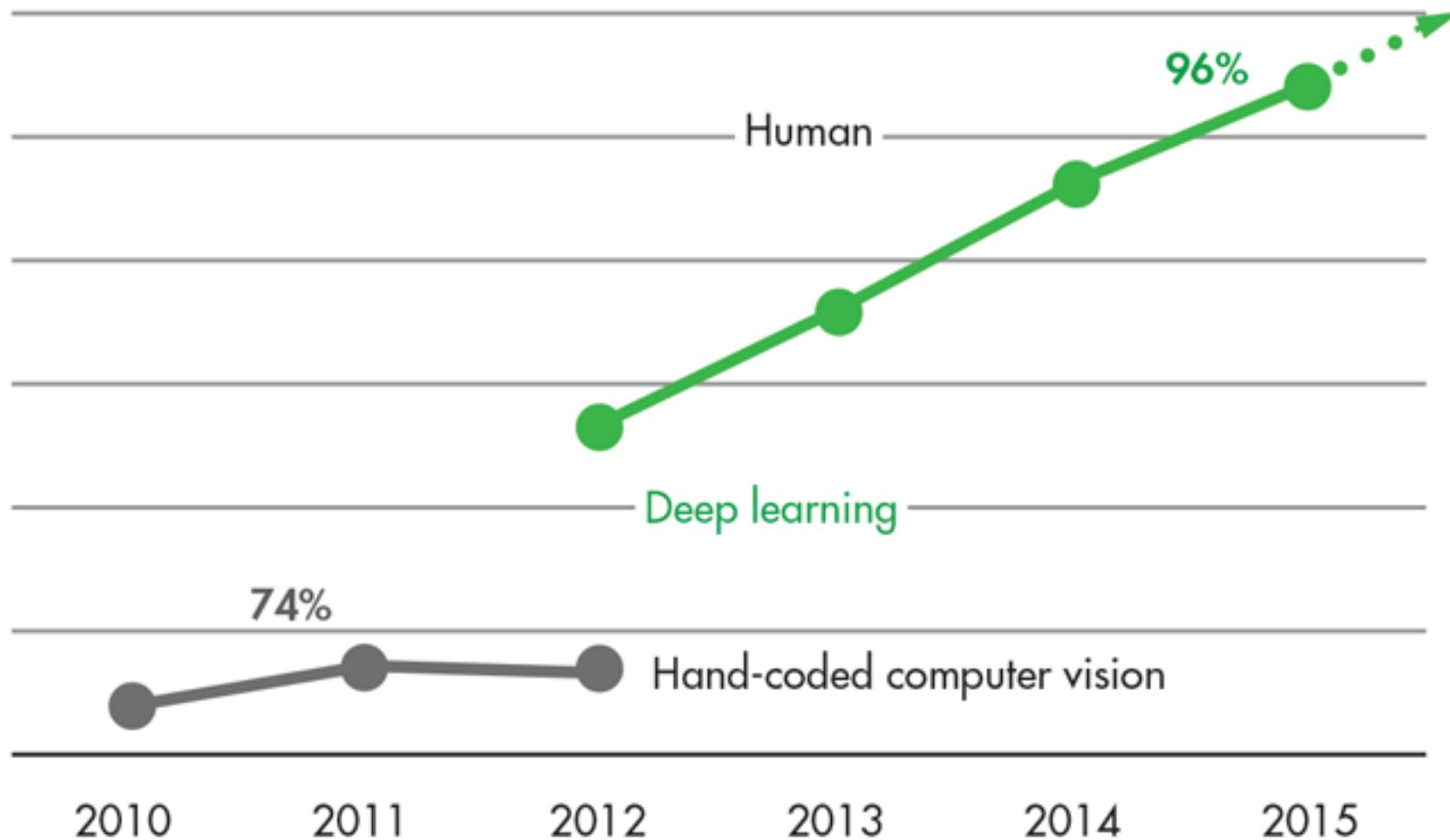
High-resolution
Color Image (2D)

Challenges in Image Analysis



Computer Vision

Microsoft, Google
3.5% error rate



DeepMind's AI can detect over 50 eye diseases as accurately as a doctor

The system analyzes 3D scans of the retina and could help speed up diagnoses in hospitals

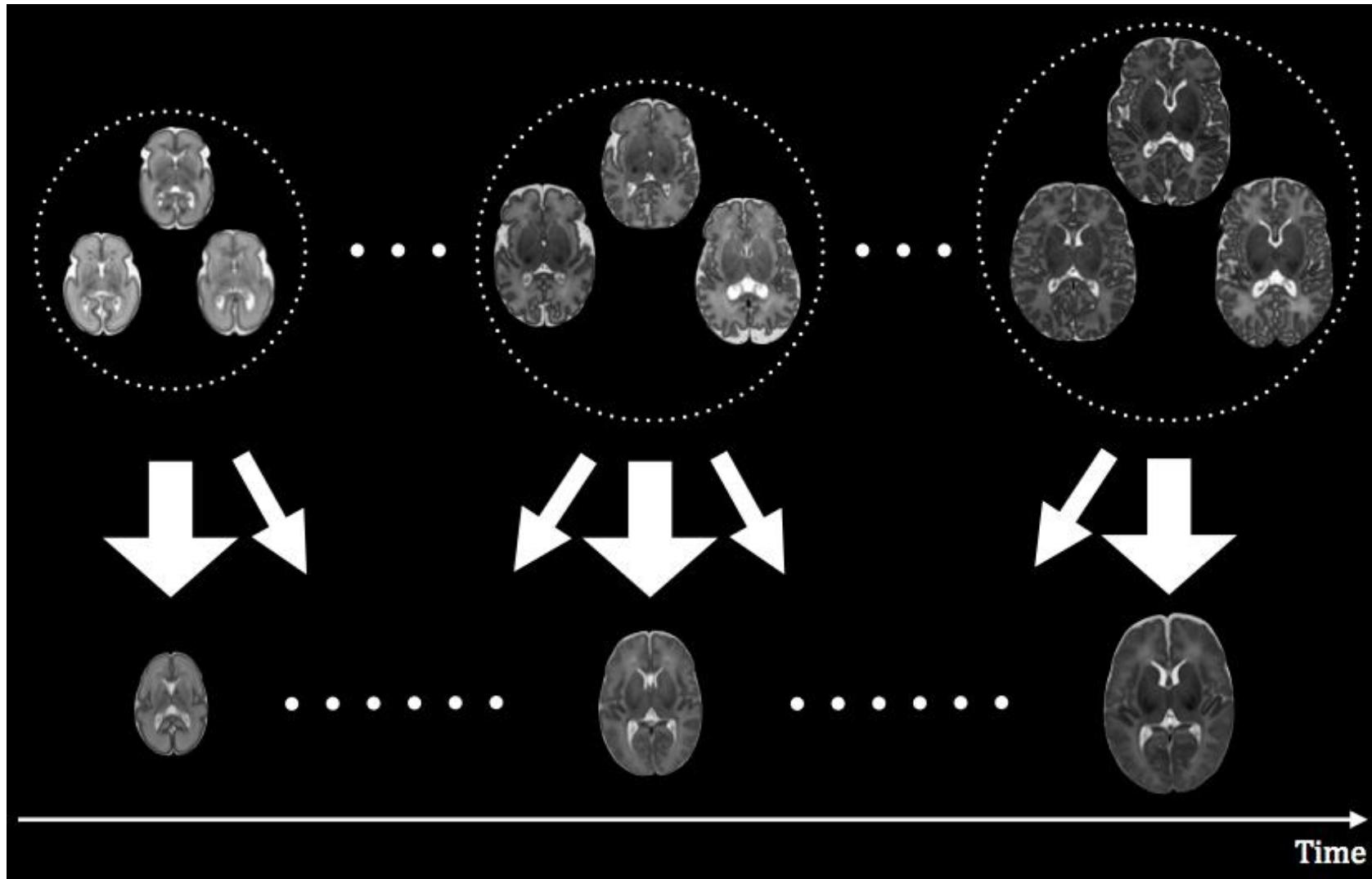
By [James Vincent](#) | Aug 13, 2018, 11:01am EDT

[!\[\]\(b6fe3d974b20682aca79f7e6638f28cd_img.jpg\) f](#) [!\[\]\(4d2f183b9073f2246e8ef770da4ac962_img.jpg\) t](#) [!\[\]\(6bc4dbb80d8a4d910283071e821355d5_img.jpg\) SHARE](#)



Radiology

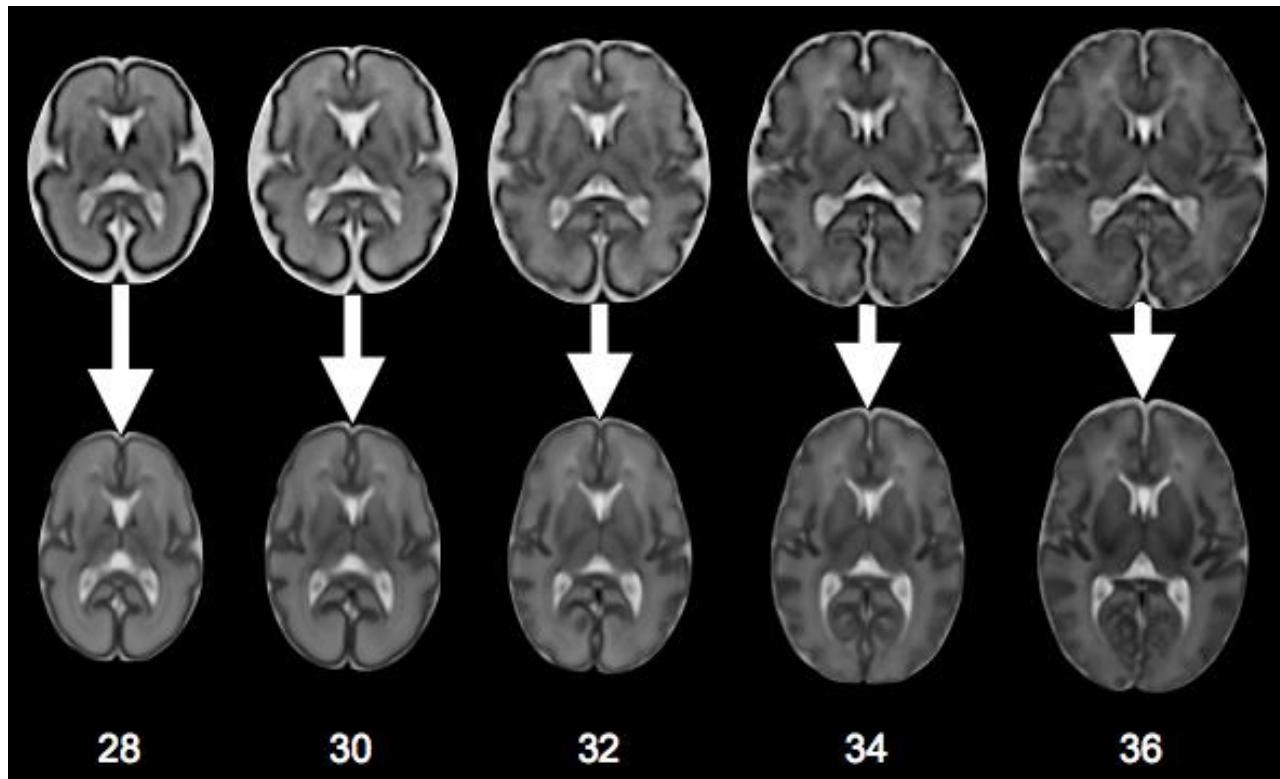
“Normal” Models



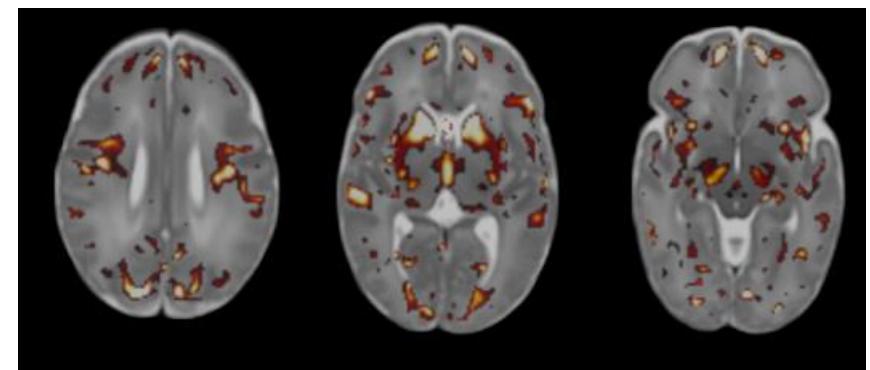
Serag, 2012

Detection of variations

Fetal Brain
“Model”

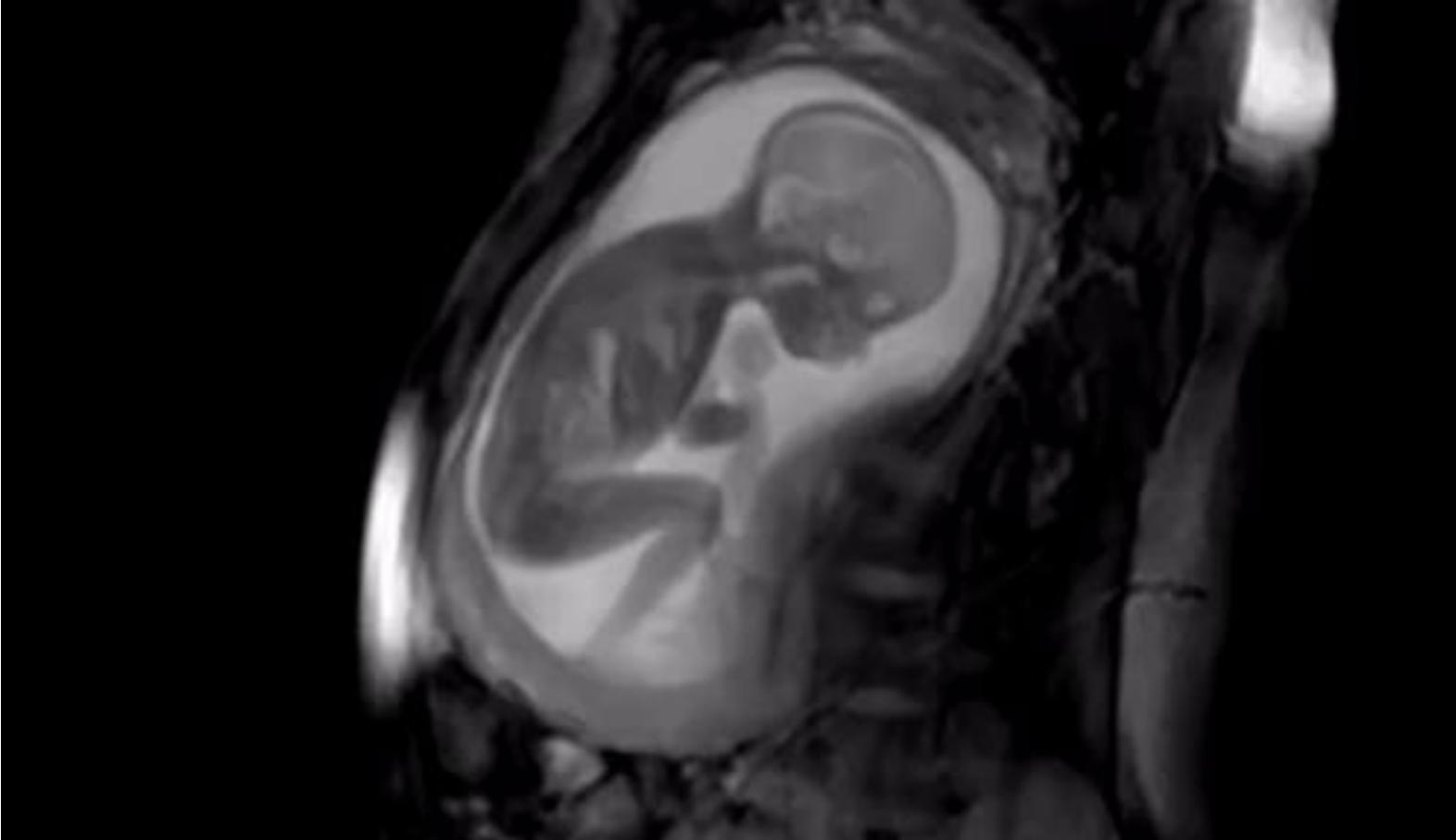


Variations from model



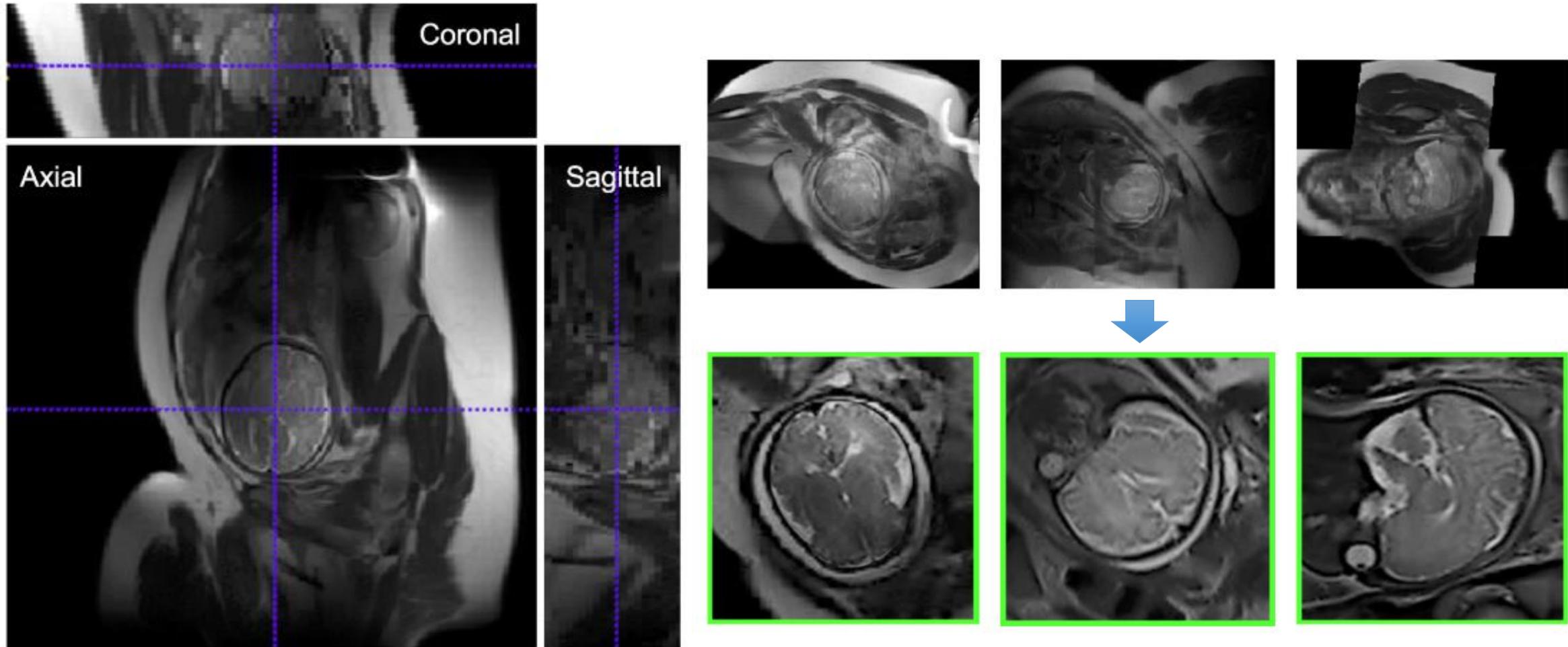
Serag, 2012

Motion correction



Source: youtu.be

Motion correction



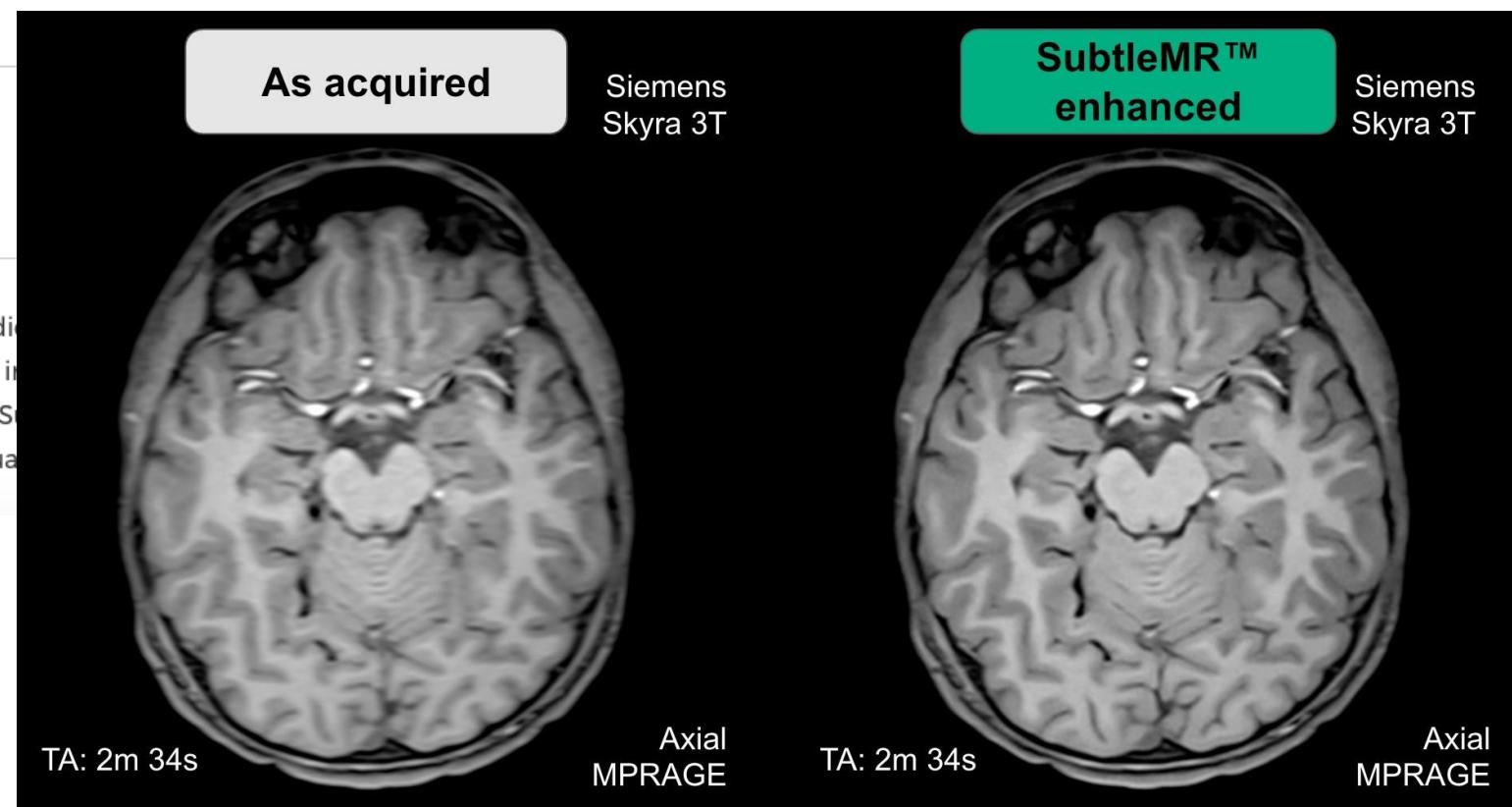
Serag, 2016

Subtle Medical Receives FDA 510(k) Clearance for AI-Powered SubtleMR™

First AI Product Cleared for MRI Image Enhancement

NEWS PROVIDED BY
Subtle Medical, Inc. →
Oct 15, 2019, 08:12 ET

MENLO PARK, Calif., Oct. 15, 2019 /PRNewswire/ -- Subtle Medical has received U.S. Food and Drug Administration (FDA) clearance for its SubtleMR™ software, the first AI-powered MRI enhancement solution to receive FDA clearance. SubtleMR™ uses deep learning to automatically denoise and resolution enhance MRI images, improving the quality, efficiency, and accessibility of medical imaging.



Pathology

NEWS

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Health

Pathologists shortage 'delaying cancer diagnosis'

By Emma Forde
5 live Investigates

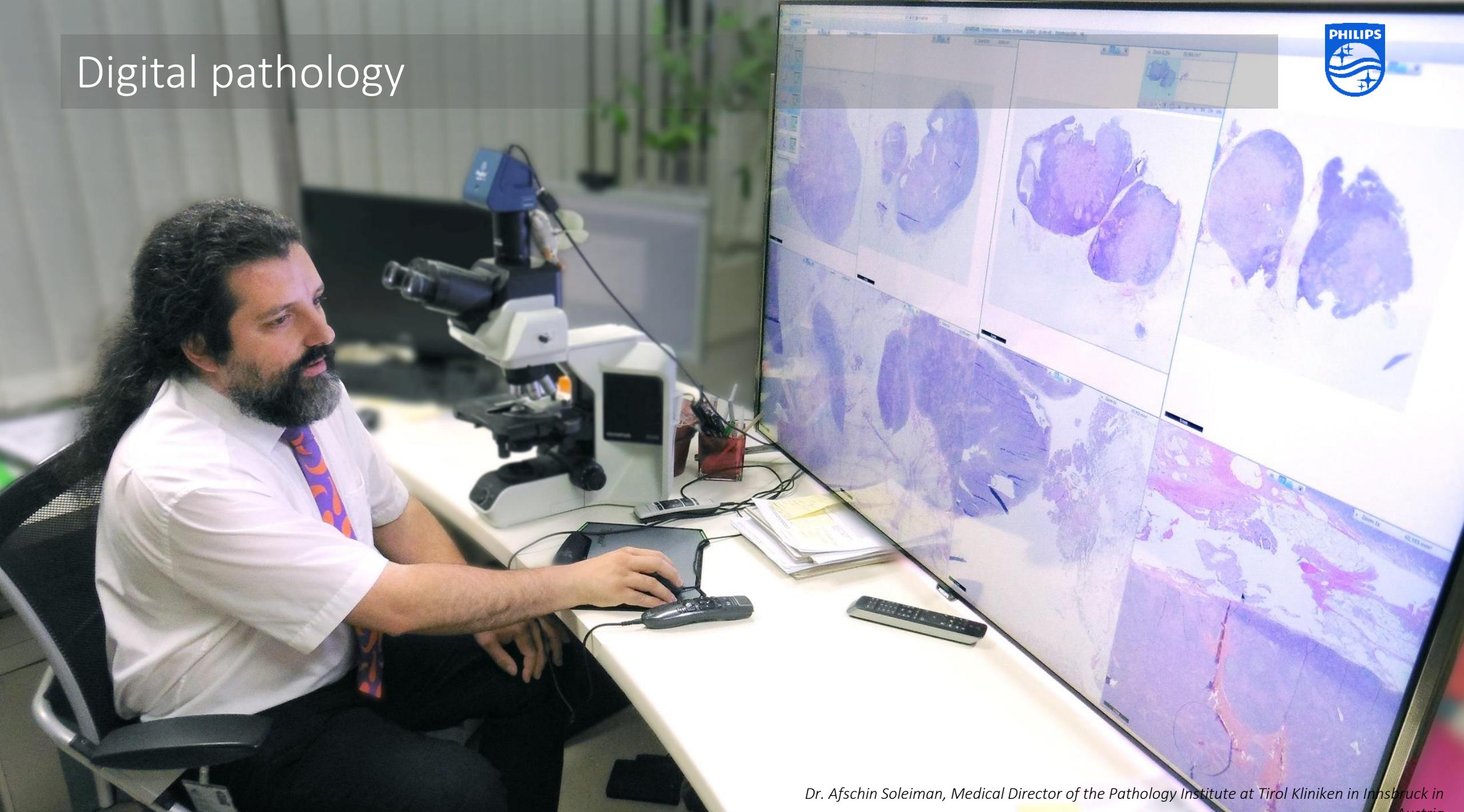
⌚ 16 September 2018

Share



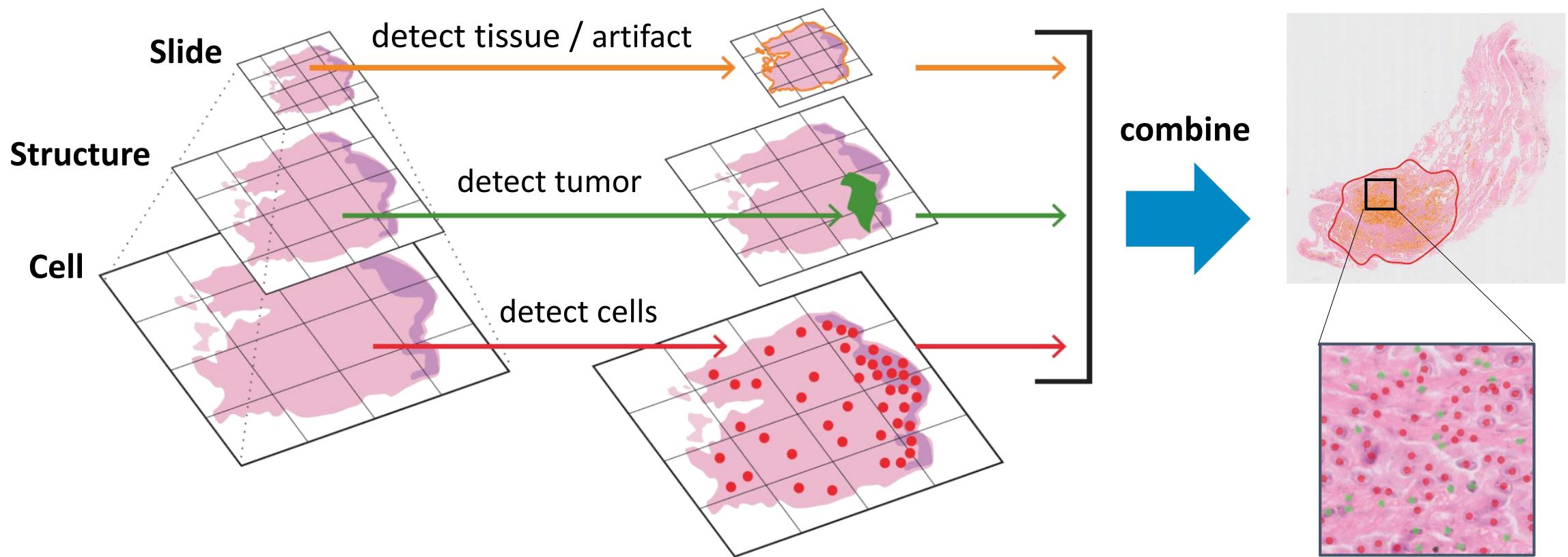
Patients are facing delays in diagnosis because of severe shortages among pathology staff, according to a report seen by the BBC.

Digital pathology



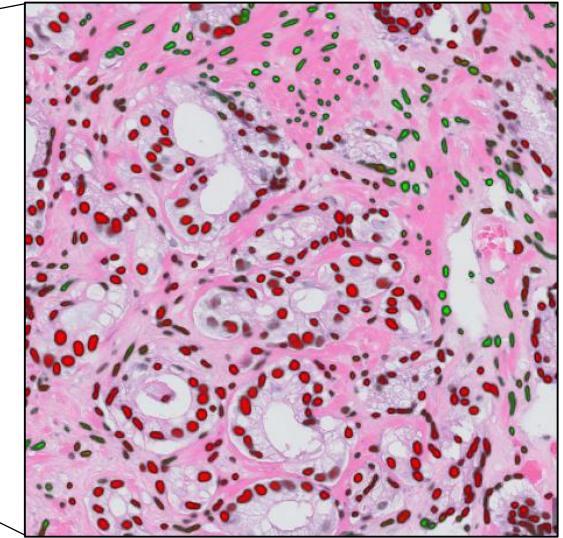
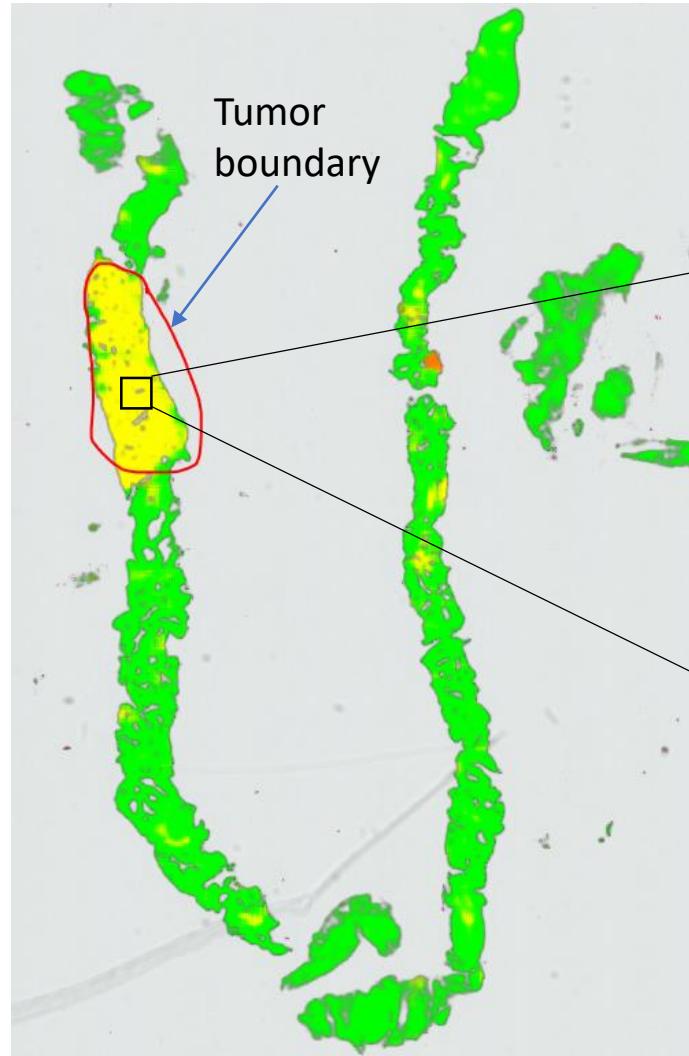
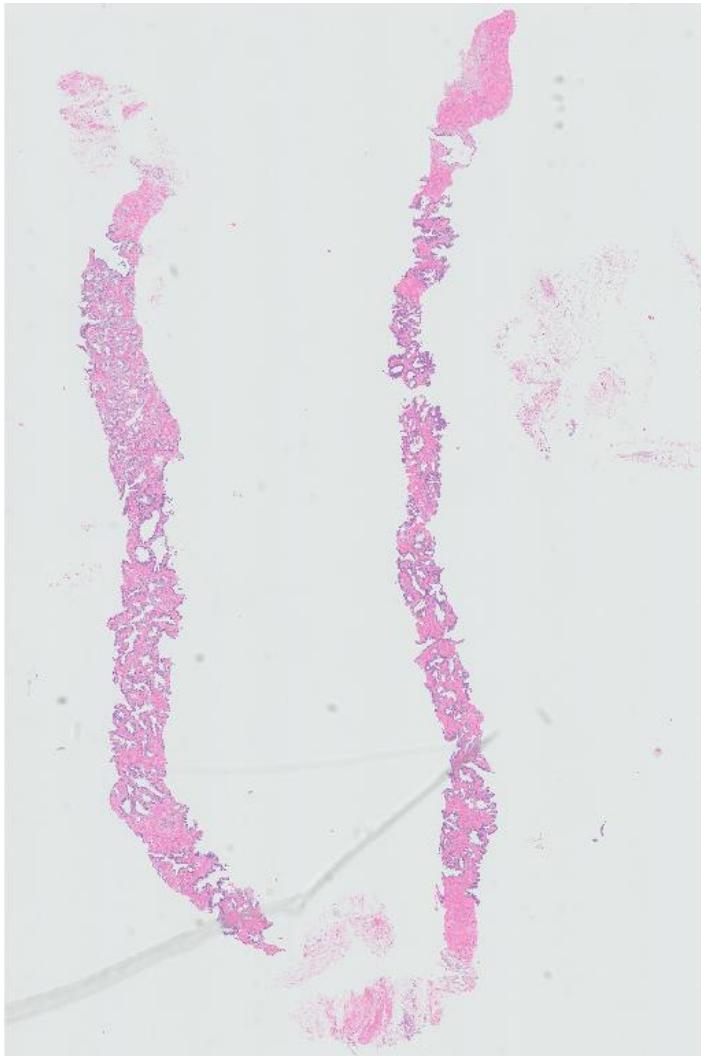
Dr. Afschin Soleiman, Medical Director of the Pathology Institute at Tirol Kliniken in Innsbruck in Austria

Cancer detection system



These slides detail early-stage internal research projects and intermediate output and do not make any claims pertaining to current Philips products.

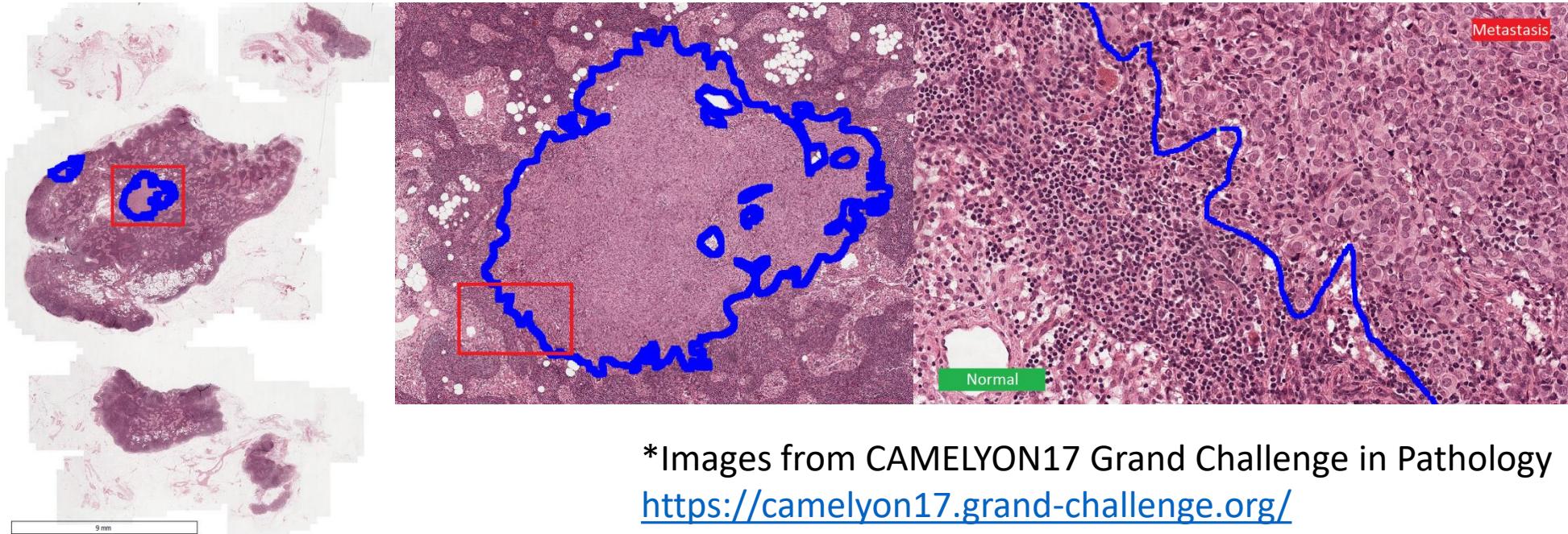
Example – Prostate Cancer



- Gleason 3
- Gleason 4
- Gleason 5
- Non-Tumor

Deep learning and Data

Obtaining expert labels for training deep learning models is difficult, time-consuming, tedious, and costly.

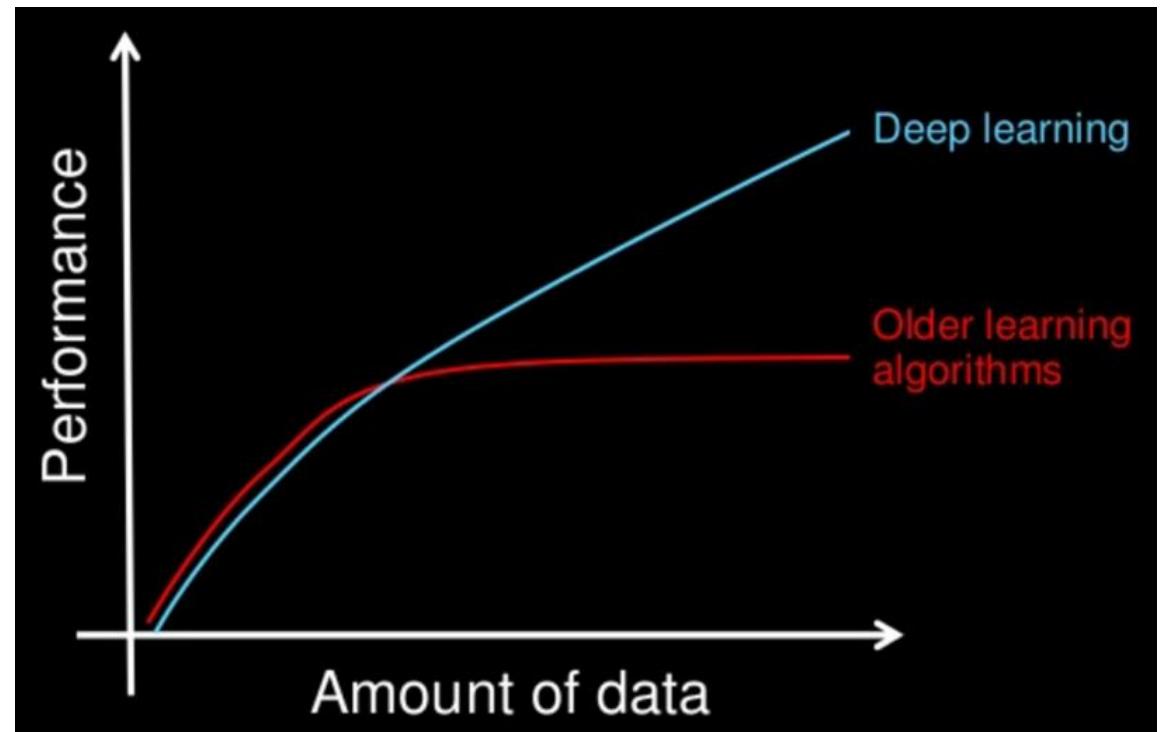


*Images from CAMELYON17 Grand Challenge in Pathology
<https://camelyon17.grand-challenge.org/>
Litjens et al., *GigaScience*, 2018

Deep learning and Data

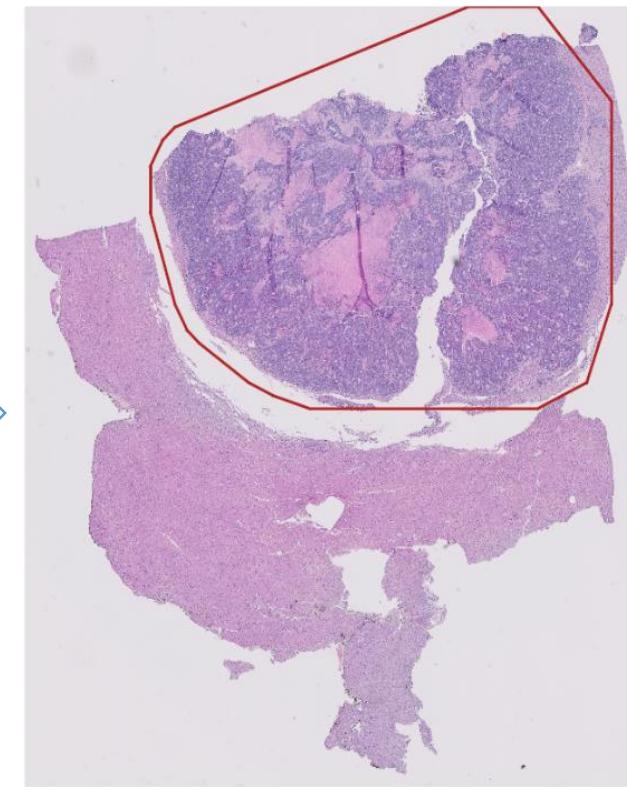
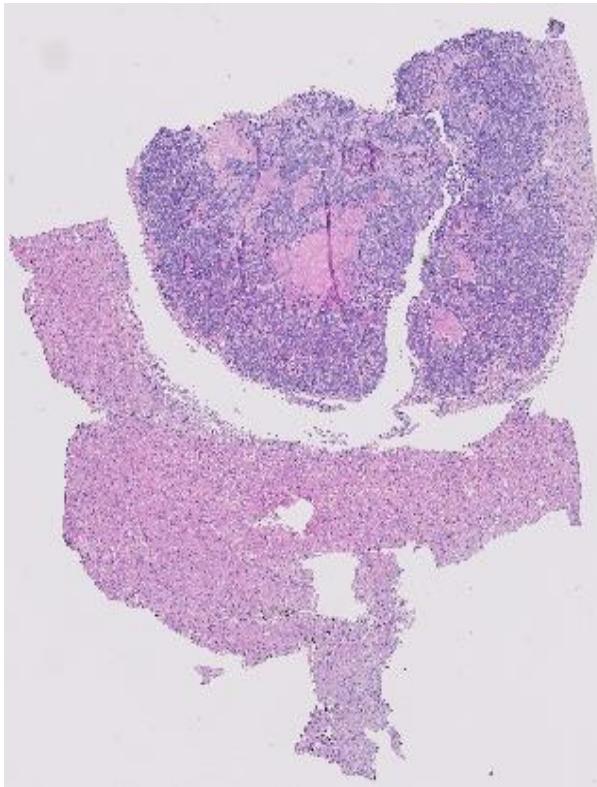
"The analogy to deep learning is that the rocket engine is the deep learning models and the fuel is the huge amounts of data we can feed to these algorithms."

— Andrew Ng (source: [Wired](#))

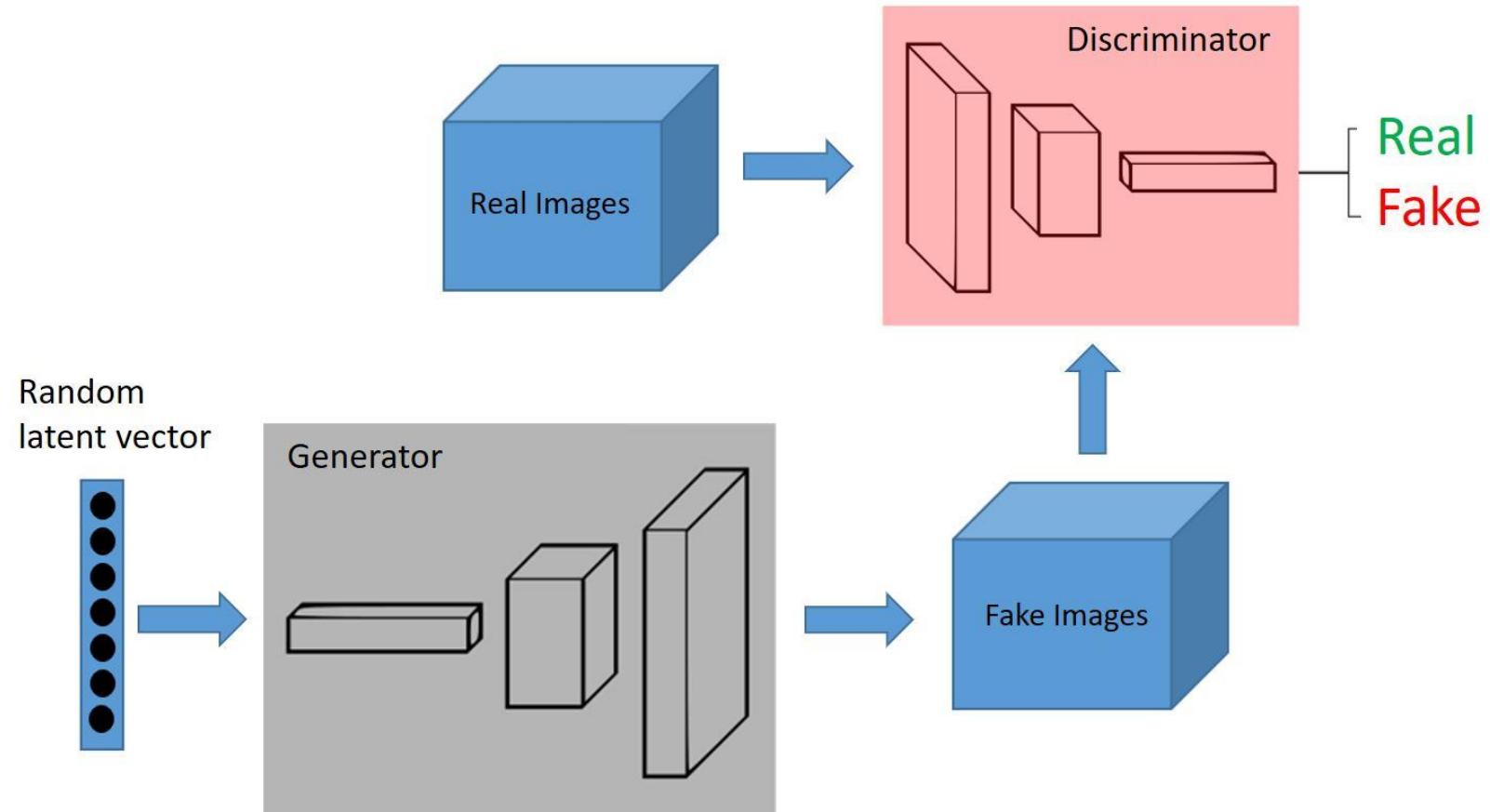


* Slide by Andrew Ng, all rights reserved.

Unsupervised learning



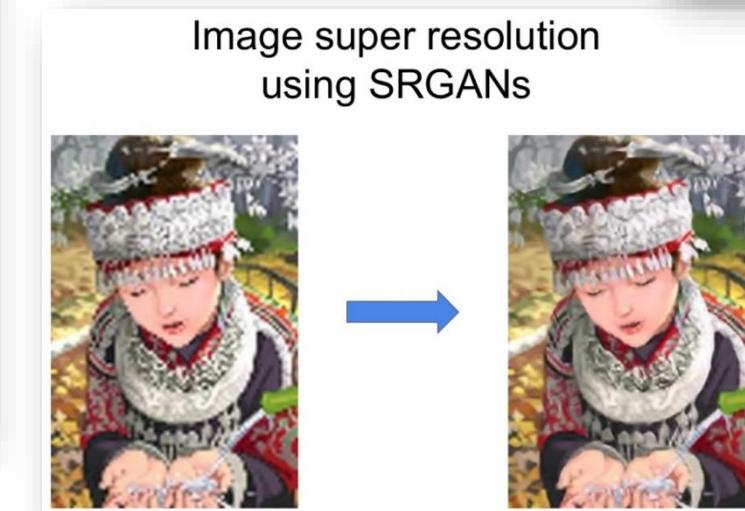
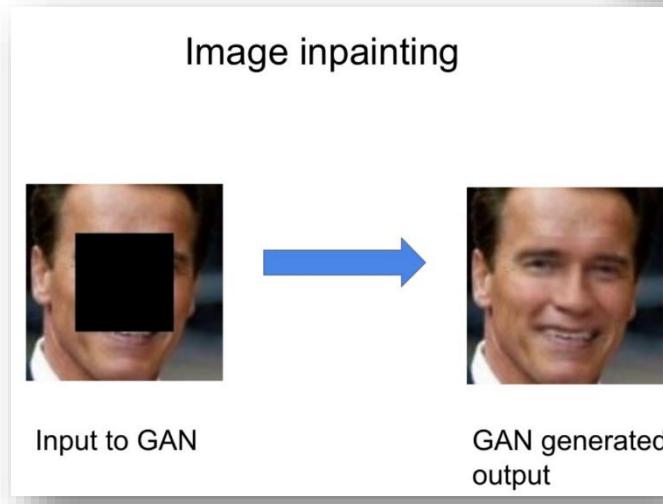
Generative Adversarial Networks (GANs)



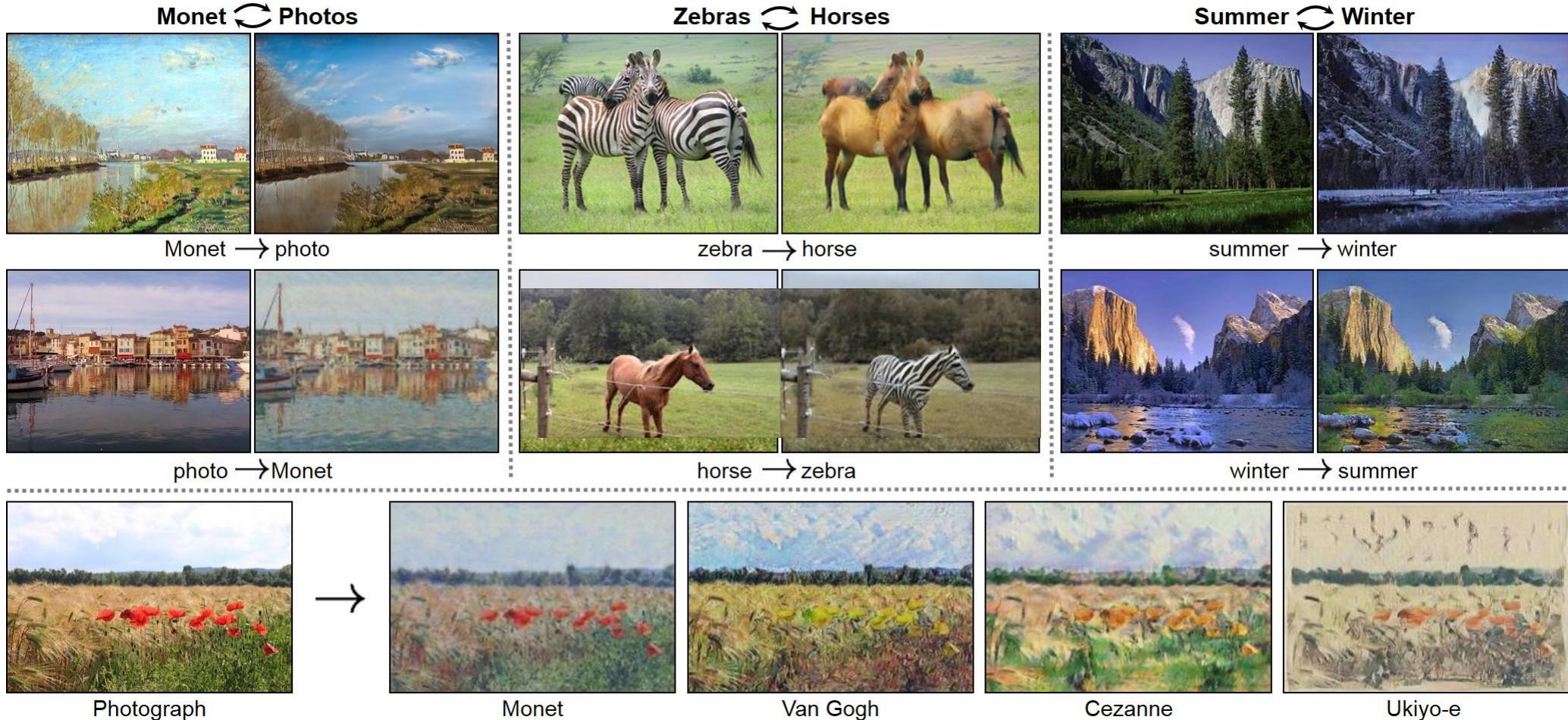
Goodfellow et al., NIPS, 2014

These slides detail early-stage internal research projects and intermediate output and do not make any claims pertaining to current Philips products.

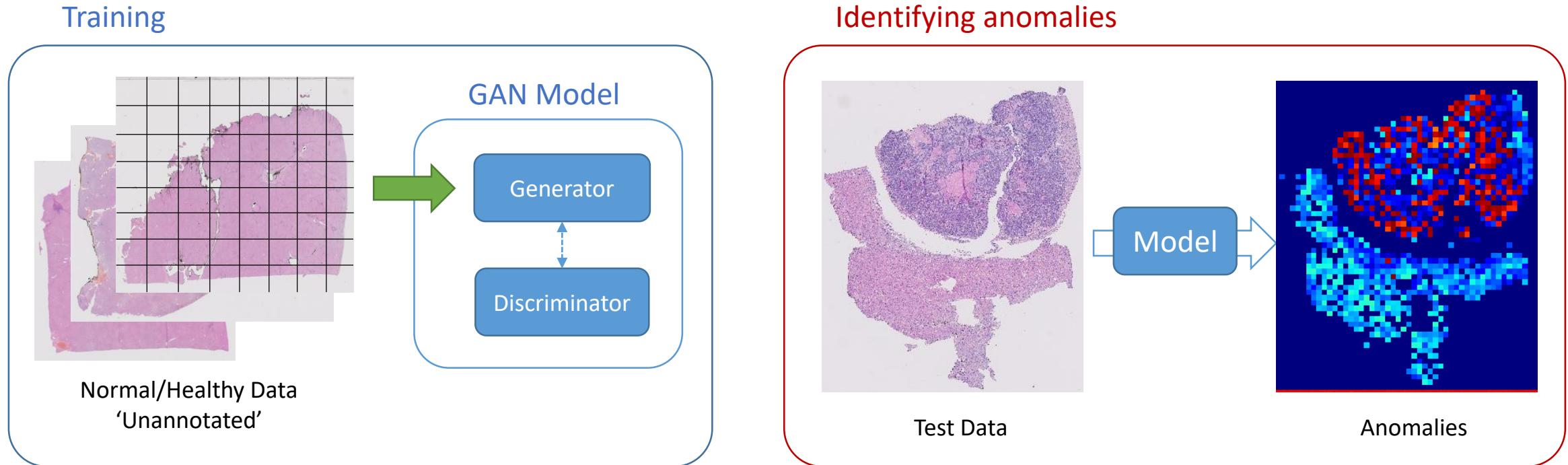
Applications



More applications ...

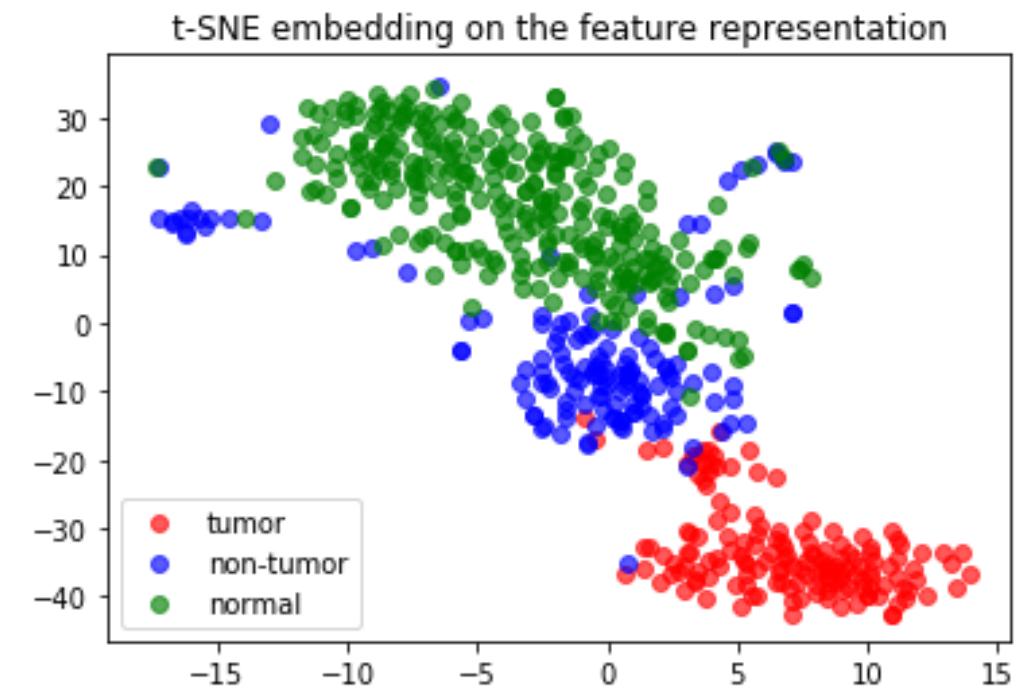
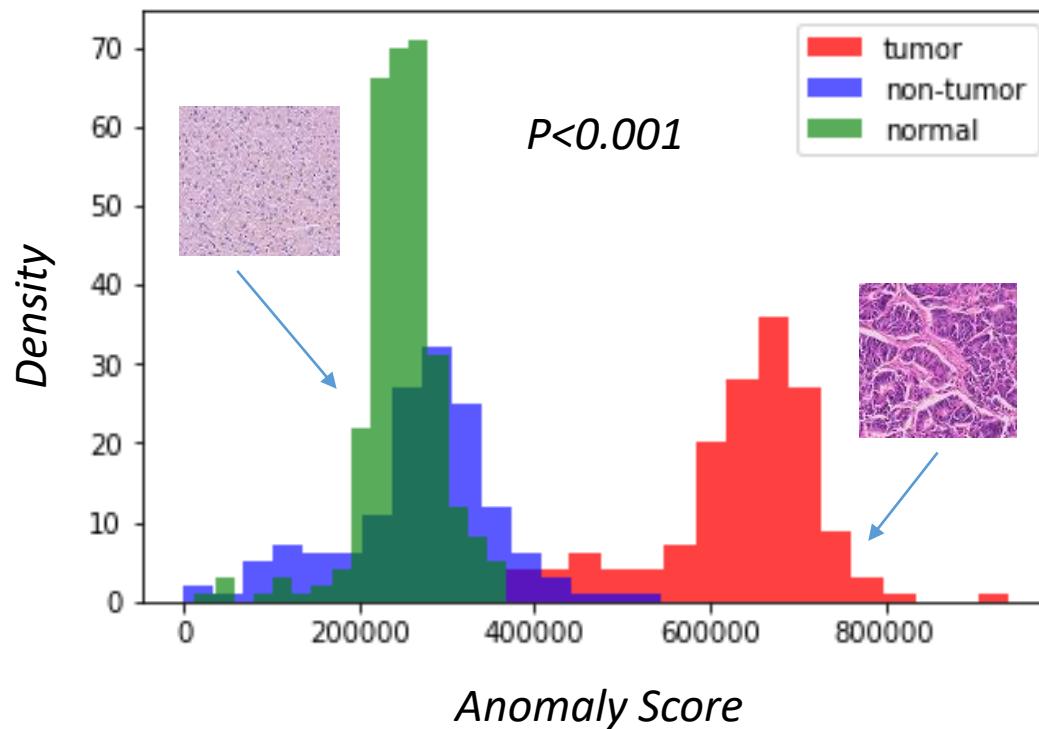


Anomaly Detection using GANs

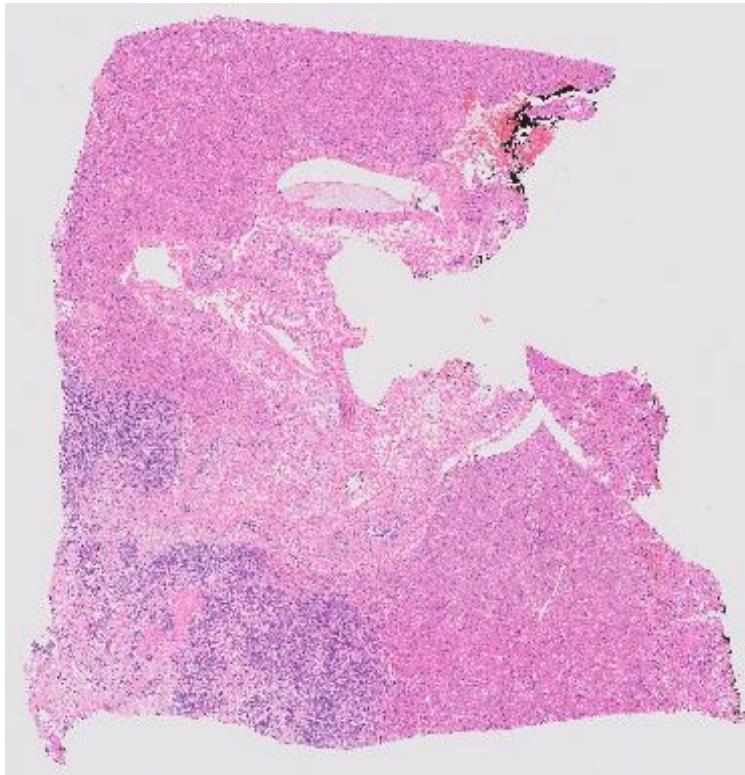


Serag et al., 2019

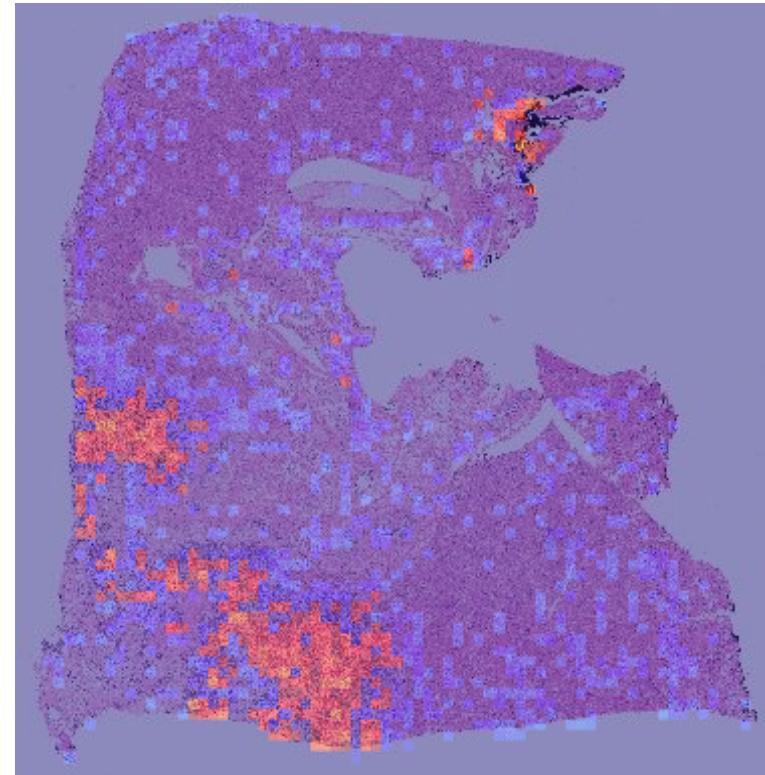
Distribution of anomaly scores



Whole slide processing



Slide



Slide with overlaid anomaly heat map

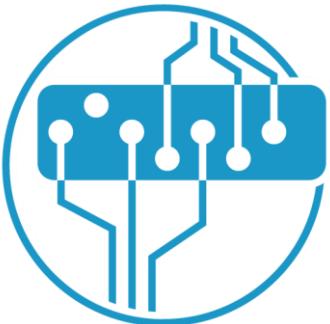
Challenges Ahead



Doctors not to fear AI
Doctors understand AI



Patients to trust AI



Ethics
Privacy
FDA Approval



Scalability of models (more data, acceptable runtime)
Easy ways to train models

Precision Diagnostics
(radiology, pathology, genomics)

Conclusions

- AI is getting increasingly sophisticated at doing what humans do, but more efficiently, more quickly and at a lower cost.
- The potential for AI in healthcare is vast. Ultimate benefits are improved health and lives saved.
- It would be necessary to address concerns over the privacy and protection of sensitive health data.
- The complexity of human biology and the need for further technological development also mean than some of the more advanced applications may take time to reach their potential and gain acceptance from patients, healthcare providers and regulators.



Today



Artificial Narrow
Intelligence

Less than Human
intelligence

2040



Artificial General
Intelligence

Equal to Human
intelligence

2060



Artificial Super
Intelligence

Far Greater than
Human intelligence