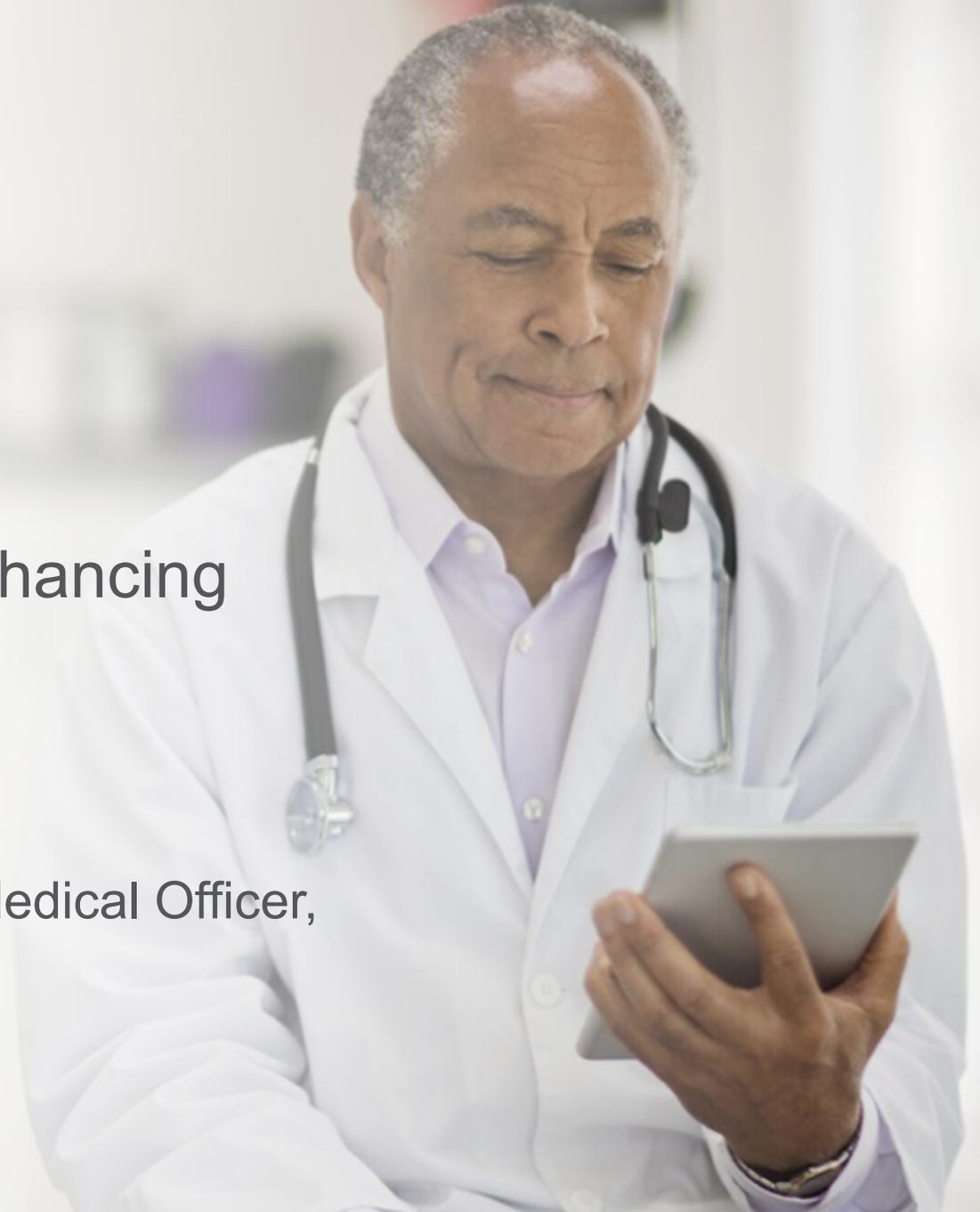


# Case in point: AI & diagnostic imaging

Role of artificial intelligence in enhancing clinical quality and efficiency

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Senior Vice President and Deputy Chief Medical Officer,  
Clinical Systems, UHG Medical Affairs



# Disclosures

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## Financial Disclosures:

- None

# Diagnostic imaging – what is a radiologist?

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Radiologists are medical doctors that specialize in diagnosing and treating injuries and diseases using medical imaging (radiology) procedures (exams/tests) such as X-rays, computed tomography (CT), magnetic resonance imaging (MRI), nuclear medicine, positron emission tomography (PET) and ultrasound.



# X-Ray lightboxes

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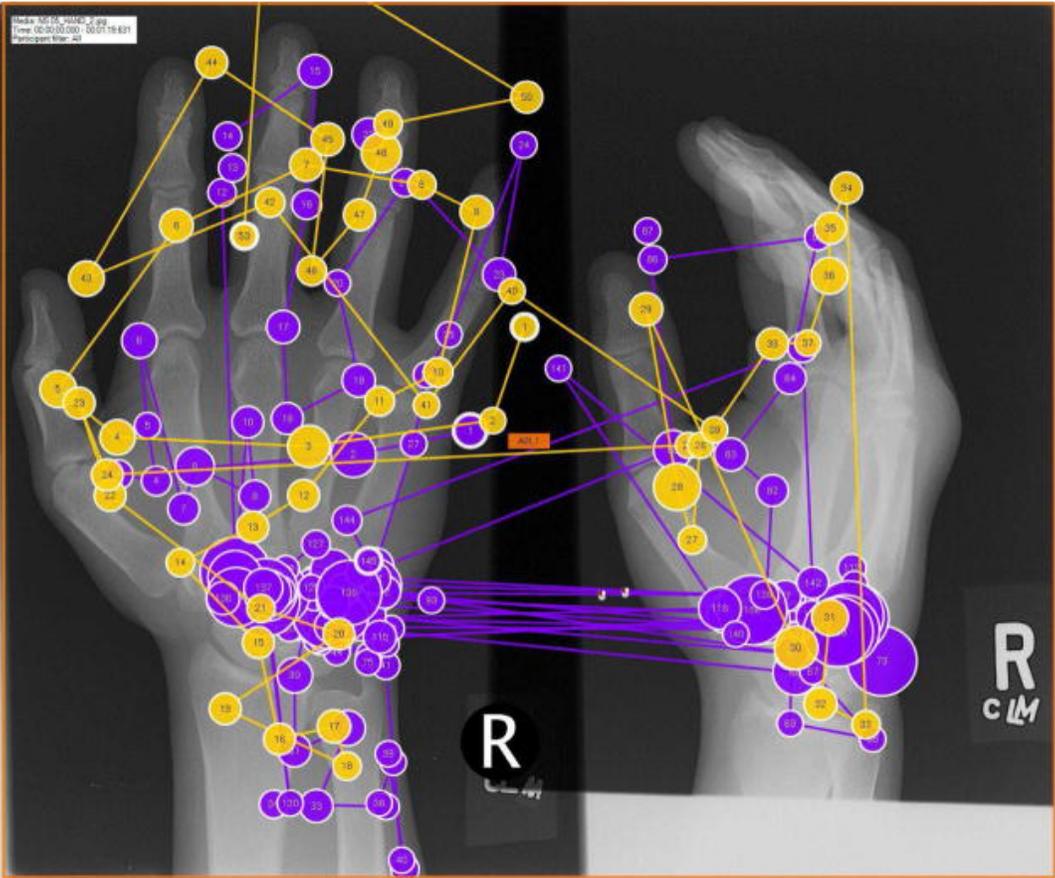
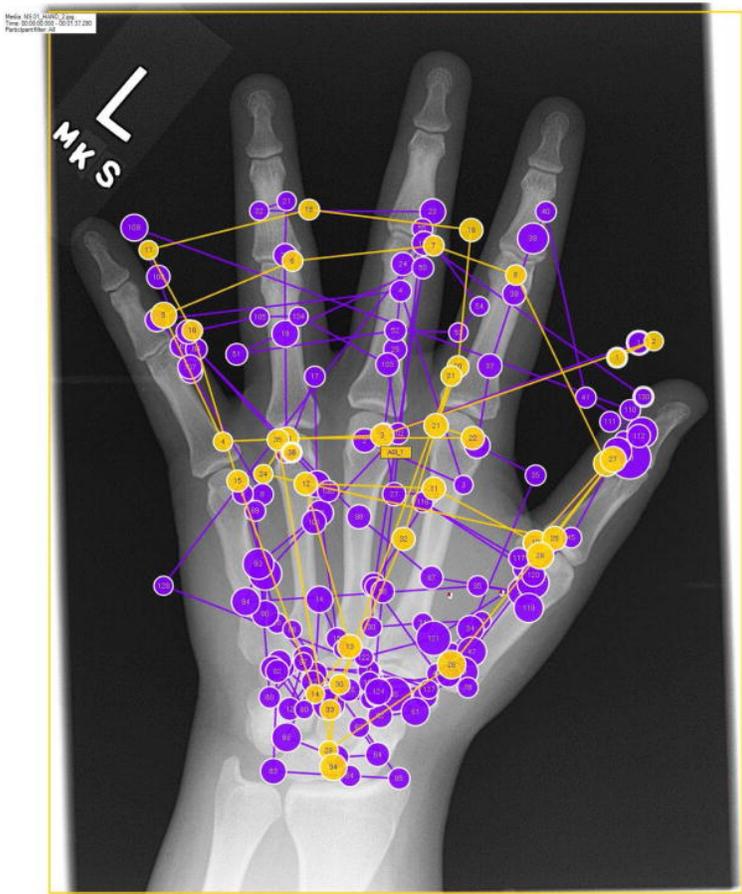


# Digital workflows – PACS (picture archiving and communication system) workstation

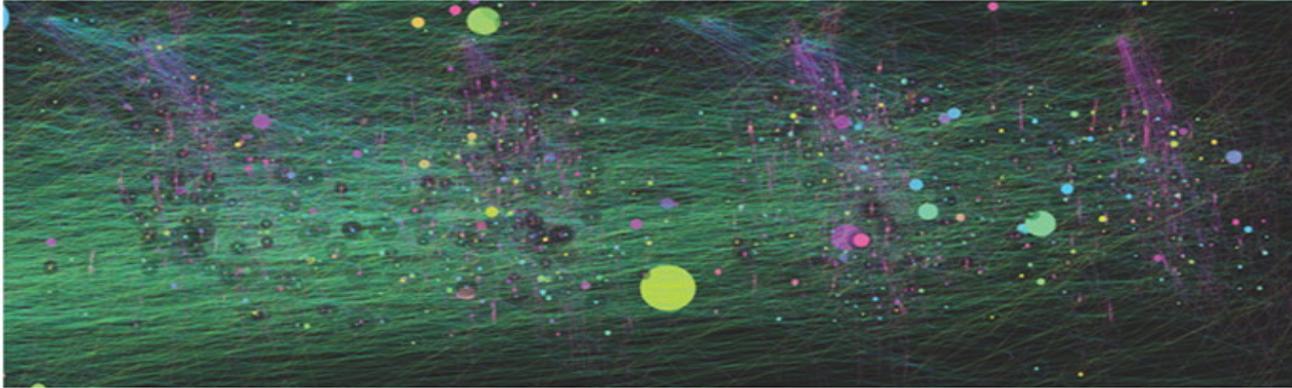
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# Visual search fatigue and variability



## Radiologist Mouse Movements at a PACS Workstation

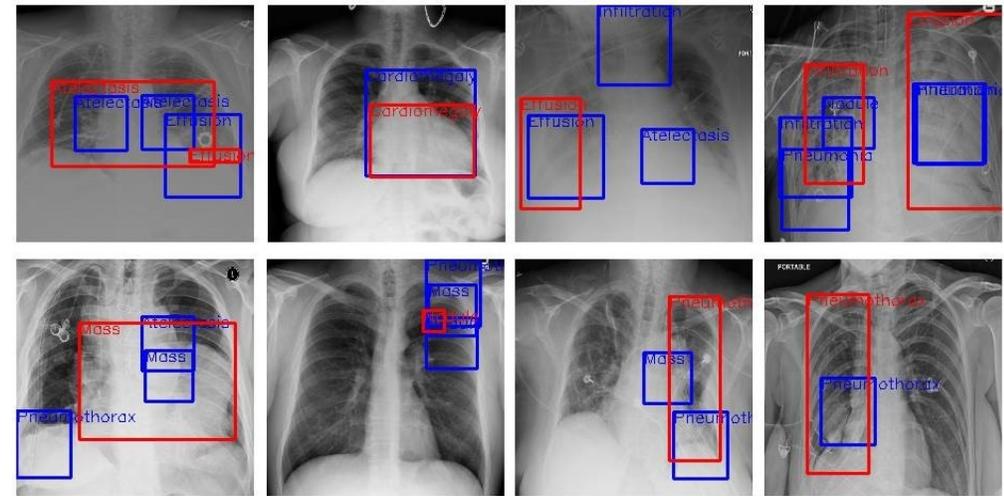
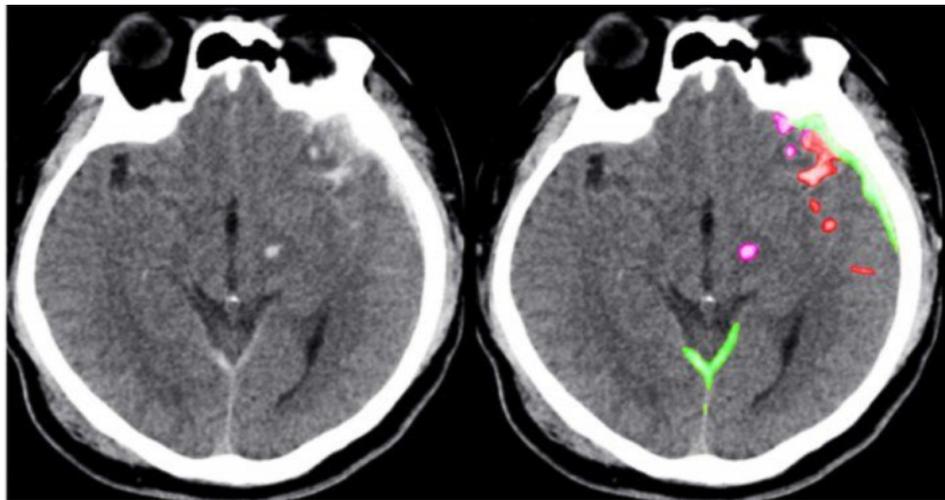
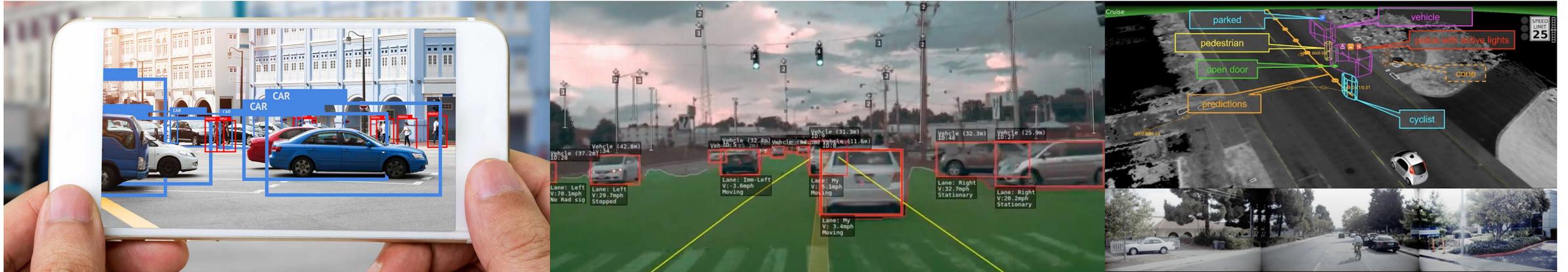


Tracked movements on a PACS workstation with two monitors.

The mouse movements and mouse stops performed by a radiology resident at a PACS workstation were tracked during an 8-hour shift. Line coloration indicates movement orientation (vertical [pink], horizontal [green], and oblique [orange and purple]) and mouse stops (colored circles).

The mouse activity added up to a distance of 2.2 km (1.37 miles) and 10778 keystrokes (23 keystrokes per minute).

# Computer vision in the real world



# Rapid research and development in medical imaging



"radiology AI" or "radiology machine learning"



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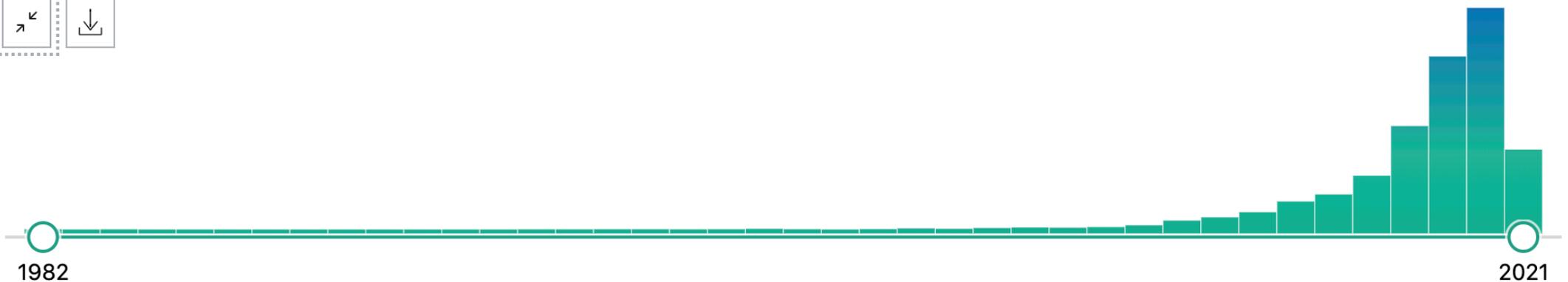
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# Current Applications and Future Impact of Machine Learning in Radiology

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Conflicts of interest are listed at the end of this article.

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Recent advances and future perspectives of machine learning techniques offer promising applications in medical imaging. Machine learning has the potential to improve different steps of the radiology workflow including order scheduling and triage, clinical decision support systems, detection and interpretation of findings, postprocessing and dose estimation, examination quality control, and radiology reporting. In this article, the authors review examples of current applications of machine learning and artificial intelligence techniques in diagnostic radiology. In addition, the future impact and natural extension of these techniques in radiology practice are discussed.

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# Clinical applications of machine learning in radiology

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Order scheduling and patient screening

Automated clinical decision support and examination protocoling

Image acquisition

Automated detection of findings and features

Automated interpretation of findings

Image management, display and archiving (eg, picture archiving and communication systems)

Postprocessing: image segmentation, registration, and quantification

Image quality analytics

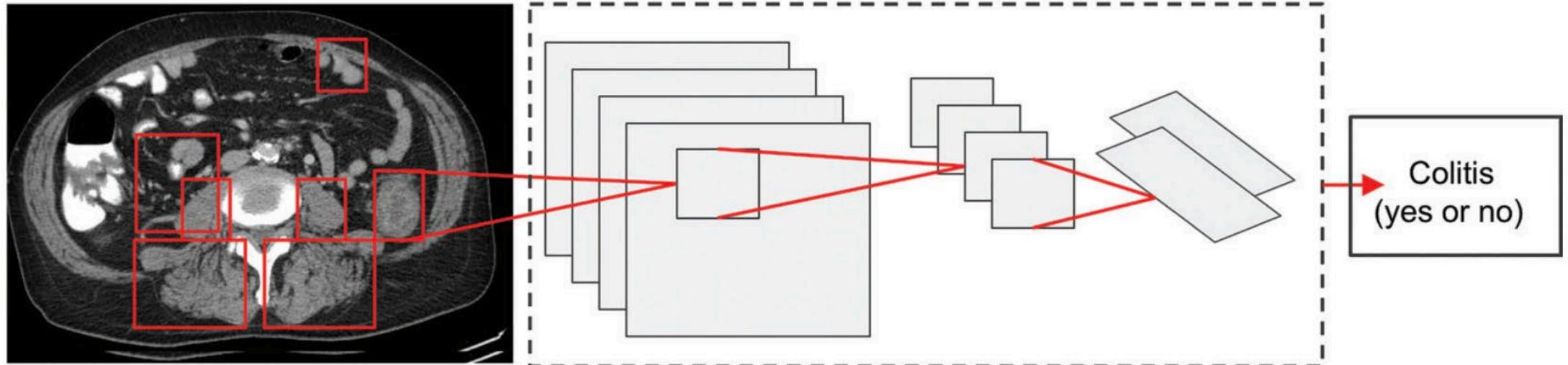
Automated dose estimation

Radiology reporting and analytics

Automated correlation and integration of medical imaging data with other data sources



# Findings detection & classification: colitis on CT



Several region proposals are applied on the input image

A deep CNN extracts features

Classifier

**Example:** Deep convolutional neural network (CNN) system for detection of colitis.

- In the first step, several thousand automated regions are applied on each CT section with an algorithm that finds all possible places where objects can be located (region proposal).
- For each region proposal, feature extraction and computation are performed by implementation of CNN with multiple hidden layers by using pretrained data sets.
- In the last step, classifier algorithm (eg, linear support vector machine) could be used for colitis classification.

# Blind spots: challenging diagnoses and common missed findings

Radiology: Artificial Intelligence

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Original Research 🔒

## Development and Validation of a Convolutional Neural Network for Automated Detection of Scaphoid Fractures on Conventional Radiographs

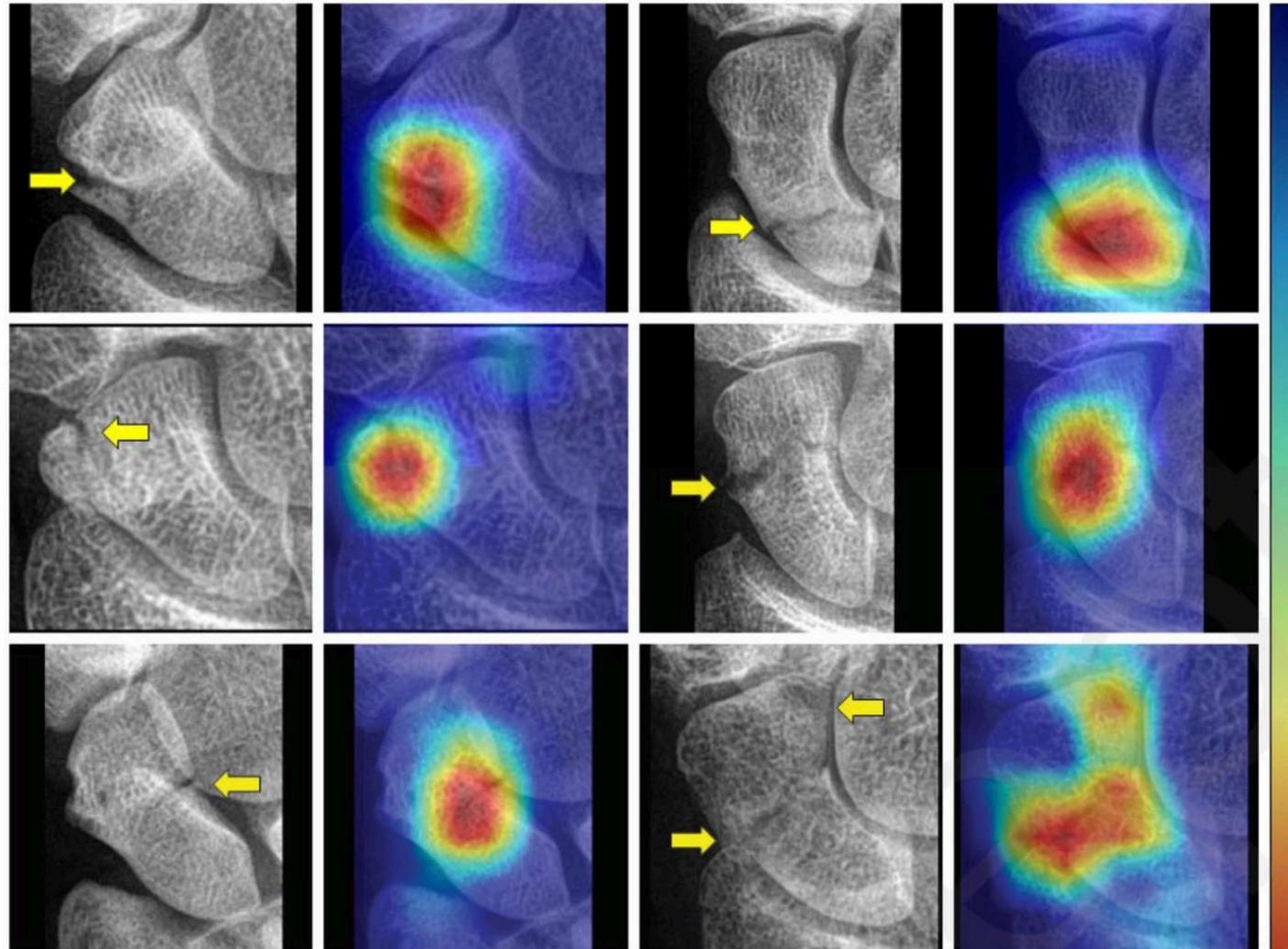
 Nils Hendrix  Ernst Scholten,  Bastiaan Vernhout, Stefan Bruijnen, Bas Maresch,  Mathijn de Jong,  Suzanne Diepstraten,  Stijn Bollen, Steven Schalekamp,  Maarten de Rooij,  Alexander Scholtens,  Ward Hendrix,  Tijs Samson, Lee-Ling Sharon Ong, Eric Postma,  ... [Show all authors](#) ▼

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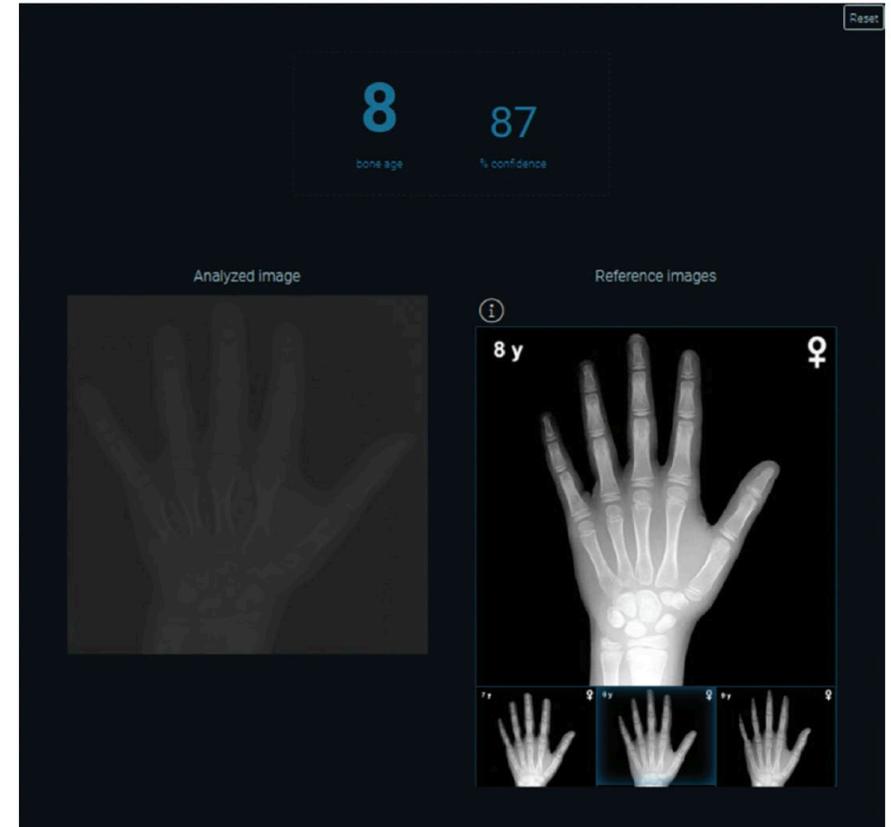
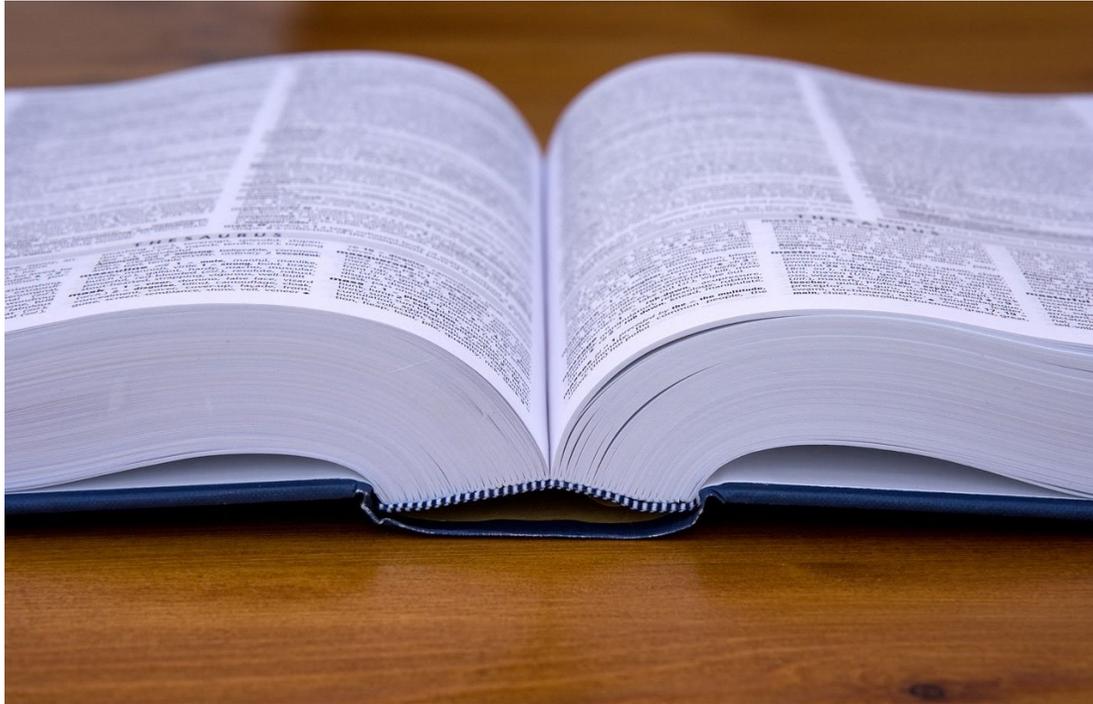
Published Online: Apr 28 2021 | <https://doi.org/10.1148/ryai.2021200260>



# Blind spots: challenging diagnoses and common missed findings



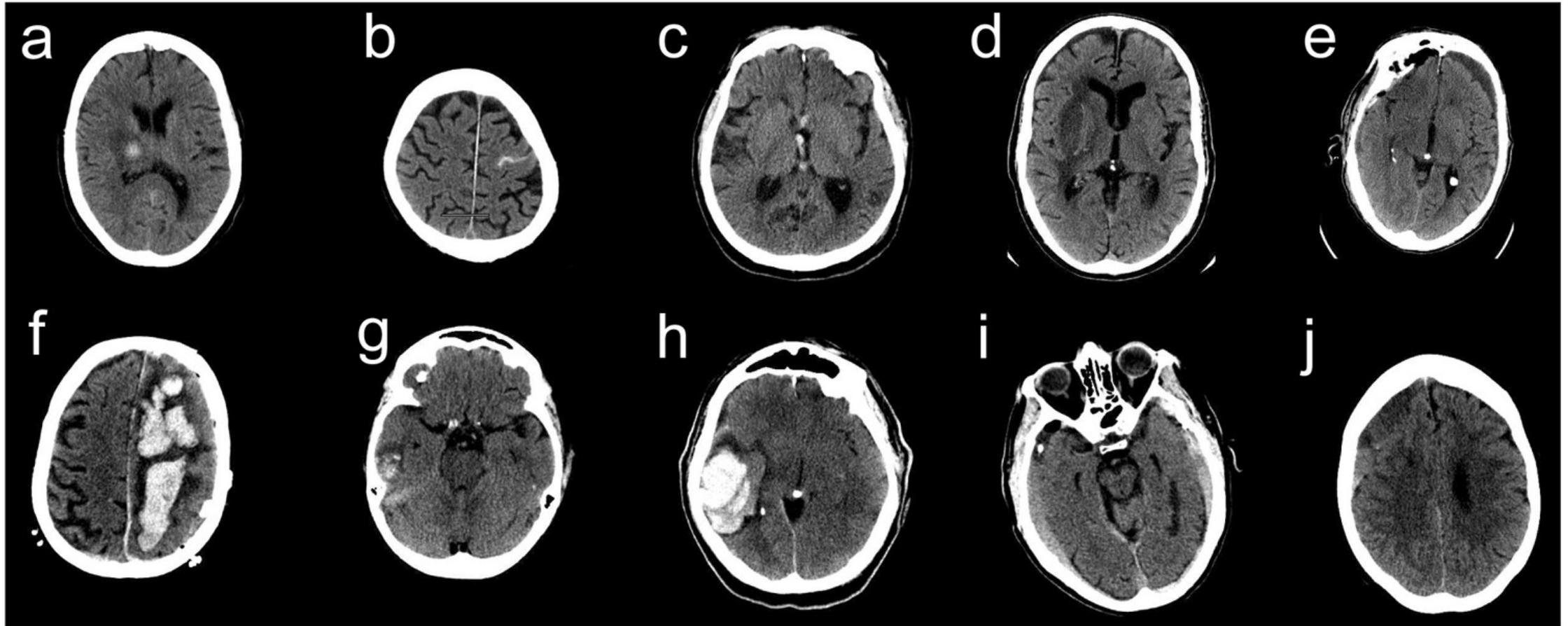
# Automated bone age determination – enhancing accuracy, saving time, and reducing administrative burden



Opportunities exist to automate and help replace more manual workflows, such as use of book-based references.

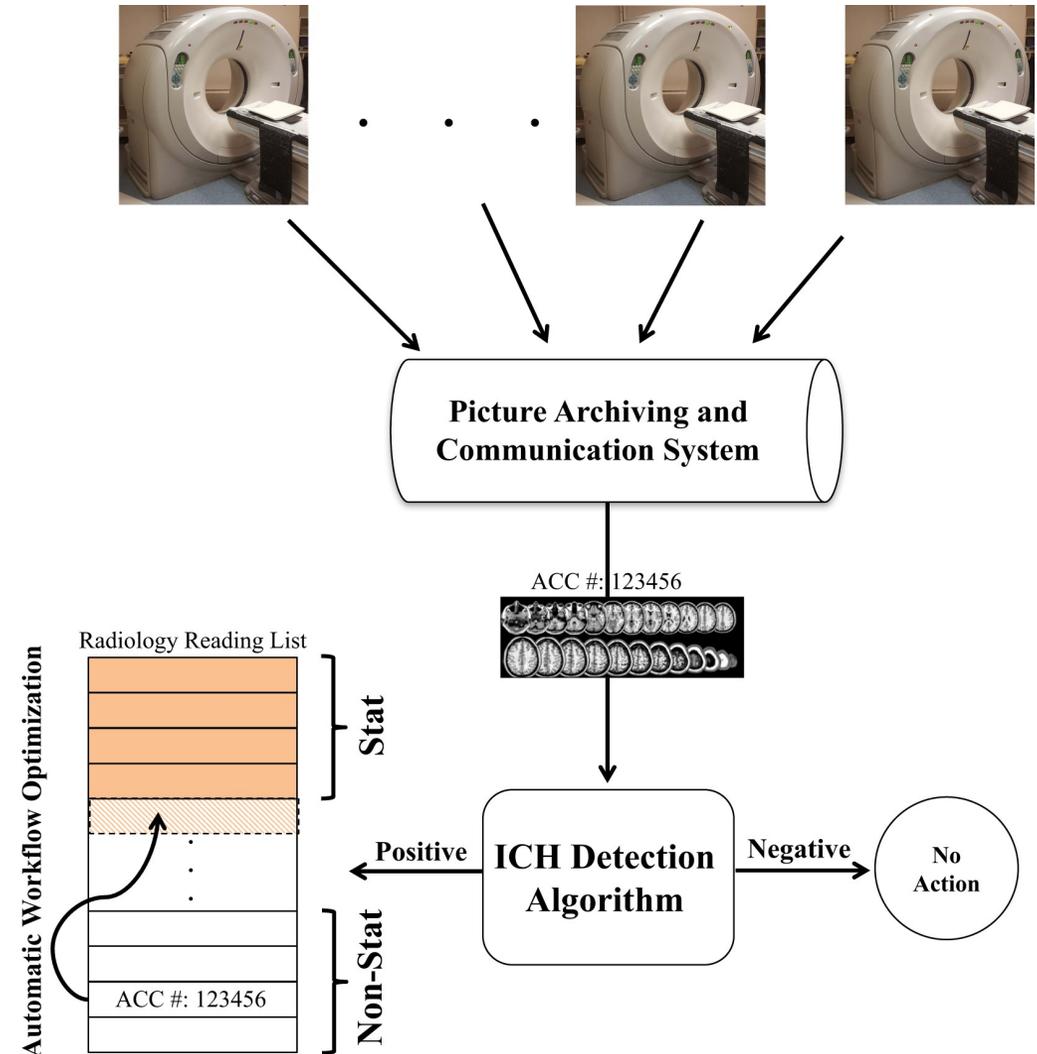
# Positive for intracranial hemorrhage on each case

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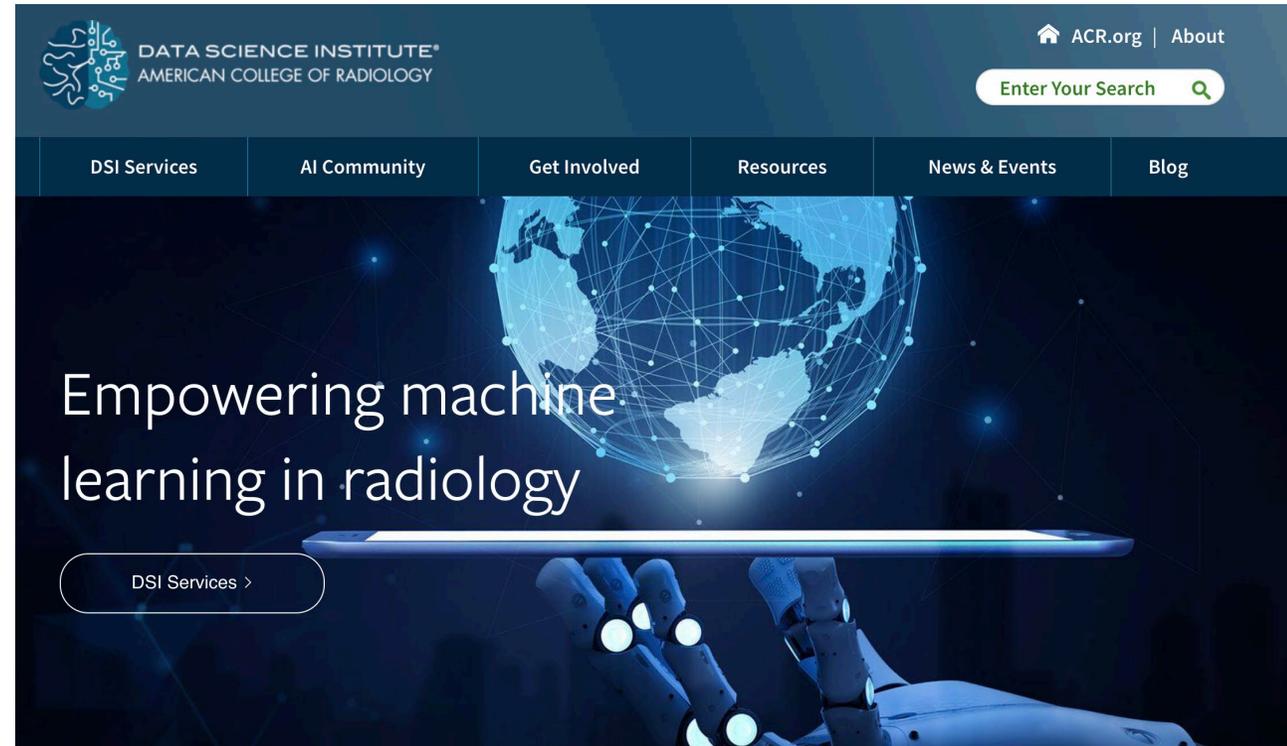
# Workflow optimization and triage

- Key cases identified for radiologists to interpret as priority from the queue.
- Clinical triage via machine learning can improve outcomes and reduce any delay in diagnosis.



## What is the ACR Data Science Institute?

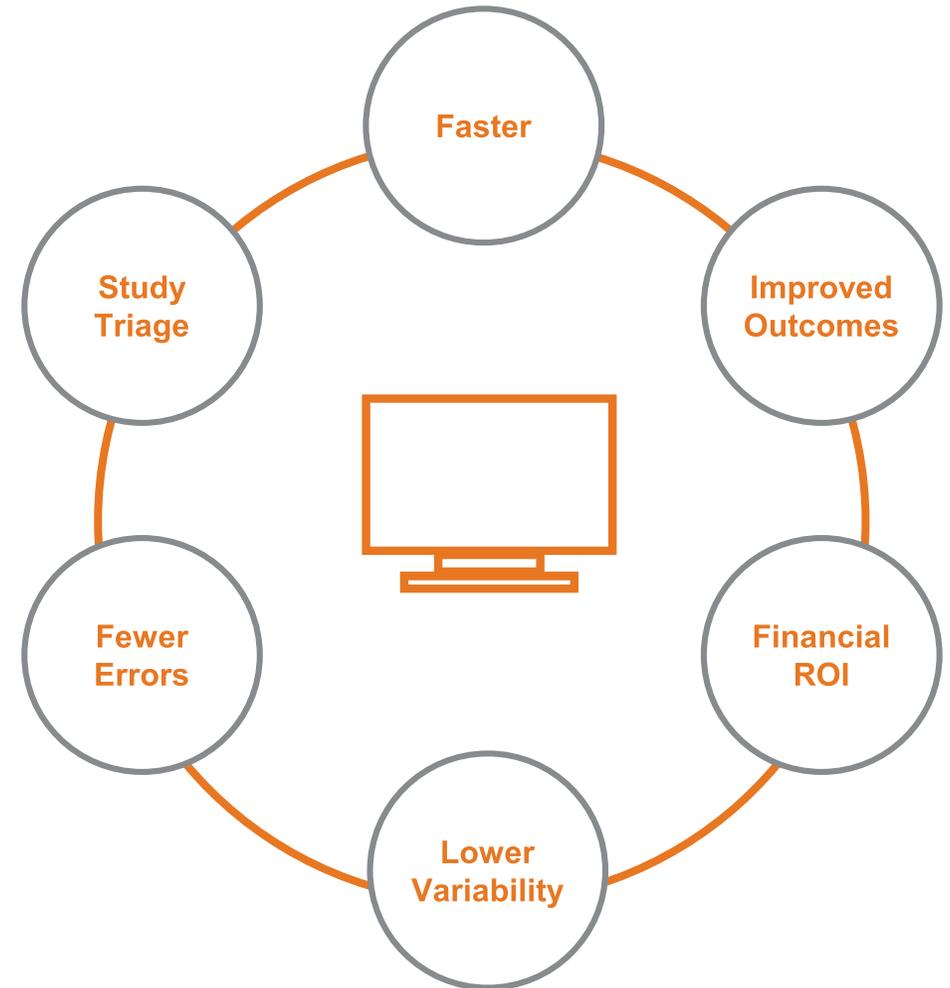
Organization collaborating with radiology professionals, industry leaders, government agencies, patients, and other stakeholders to facilitate the development and implementation of artificial intelligence (AI) applications that will help radiology professionals provide improved medical care.



# Key benefits of AI in enterprise imaging

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Multiple benefits for enterprises with diagnostic imaging workflows ranging from improved clinical outcomes to productivity



# Summary

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- Machine learning has the potential to improve different steps of the radiology workflow including order scheduling and patient screening, clinical decision support systems, detection and interpretation of findings, postprocessing and dose estimation, and radiology reporting.
- Collection of high-quality ground truth data, development of generalizable and diagnostically accurate techniques, and workflow integration are key challenges for the creation and adoption of machine learning models in radiology practice.
- For the foreseeable future, widespread application of machine learning algorithms in diagnostic radiology is not expected to reduce the need for radiologists. Instead, these techniques are expected to improve radiology workflow, increase radiologist productivity, and enhance patient care and satisfaction.