

KEYNOTE Real-world implementation: AI in Radiology



JUAN GUTIÉRREZ

ALLIENDE

Medical Lead EMEA Digital
Solution Business, Radiology
Bayer



Real-world implementation: AI in Radiology

Juan Gutiérrez Allende, MD

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Disclosures

- › This talk is sponsored by Bayer AG.
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- › Further information on our product website at www.calantic.com
- › **Adverse events should be reported.** Reporting forms and information can be found at <https://mhra.gov.uk/yellowcard> or search for MHRA Yellow Card in Google Play or Apple App Store. Adverse events should also be reported to Bayer plc. Tel.: 0118 206 3500, Fax.: 0118 206 3703, Email: pvuk@bayer.com



Ever increasing pressure on healthcare is threatening the sustainability of radiology departments and patient care in Europe



GREATER COMPLEXITY

5x

Increase

In the number of images produced per scan¹

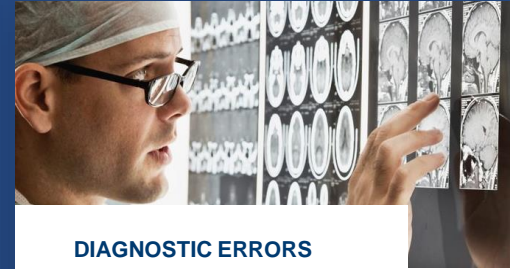


RADIOLOGY DEPARTMENTS PUSHED TO THEIR LIMITS

46%

Radiologists

reporting signs of burn-out²



DIAGNOSTIC ERRORS

~40m

Diagnostic Errors
per year worldwide³

1) McDonald RJ, Schwartz KM, Eckel LJ et al (2015) "The Effects of Changes in utilisation and Technological Advancements of Cross-Sectional Imaging on Radiologist Workload", Academic Radiology, Volume 22, Issue 9, Pages 1191-1198

2) Medscape Radiologist Lifestyle, Happiness & Burnout Report (2020). URL <https://www.medscape.com/slideshow/2020-lifestyle-radiologist-6012479> [Accessed 03-02-2023]

3) Itri JN, Tappouri RR, McEachern RO et al (2018) "Fundamentals of Diagnostic Error in Imaging", Radiographic, Volume 38, Issue 6, 1845-1865



Europe has a looming radiology capacity challenge

- › Demographic transformation is increasing the pressure on healthcare systems.
- › Stagnating number of trained radiologists available:
 - › The Royal College of Radiologists projected a shortfall of 39% by 2026 ¹.

1) 2021 Clinical radiology census report (2021) https://www.rcr.ac.uk/sites/default/files/clinical_radiology_census_report_2021.pdf [Accessed 02/05/2023].



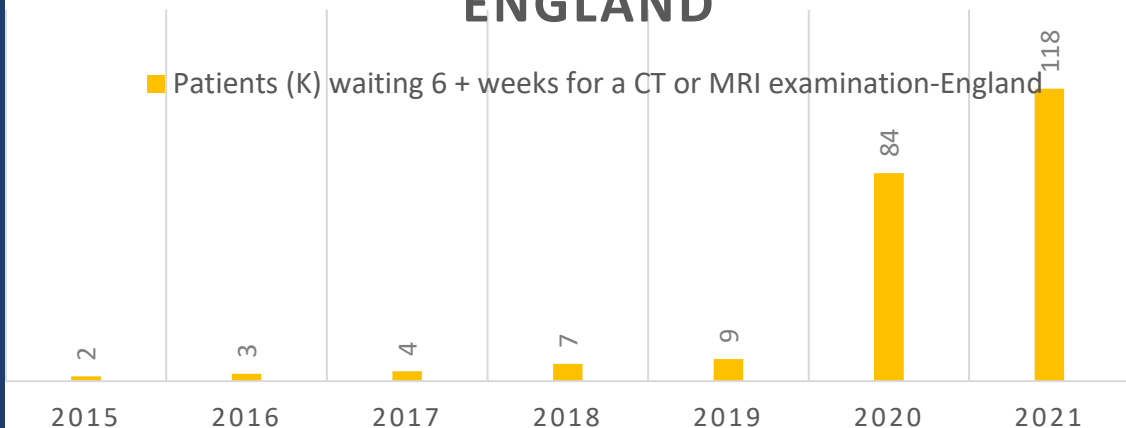


Royal College of Radiologists

UK Workforce Census **2021 report**

PATIENTS WAITING 6 + WEEKS FOR A CT OR MRI EXAMINATION- ENGLAND

■ Patients (K) waiting 6 + weeks for a CT or MRI examination-England



* Graph based on the information obtained in references ^{1,2}

1. https://www.rcr.ac.uk/system/files/publication/field_publication_files/clinical-radiology-uk-workforce-census-2020-report.pdf [Accessed 02/05/2023].

2. https://www.rcr.ac.uk/sites/default/files/clinical_radiology_census_report_2021.pdf [Accessed 02/05/2023].

representing
just over

25%

of all those
awaiting imaging²



Artificial Intelligence holds the potential to help address some of these challenges, and thereby...



Address operational inefficiencies¹,



optimise patient journeys²,



potentially improve patient outcomes³.

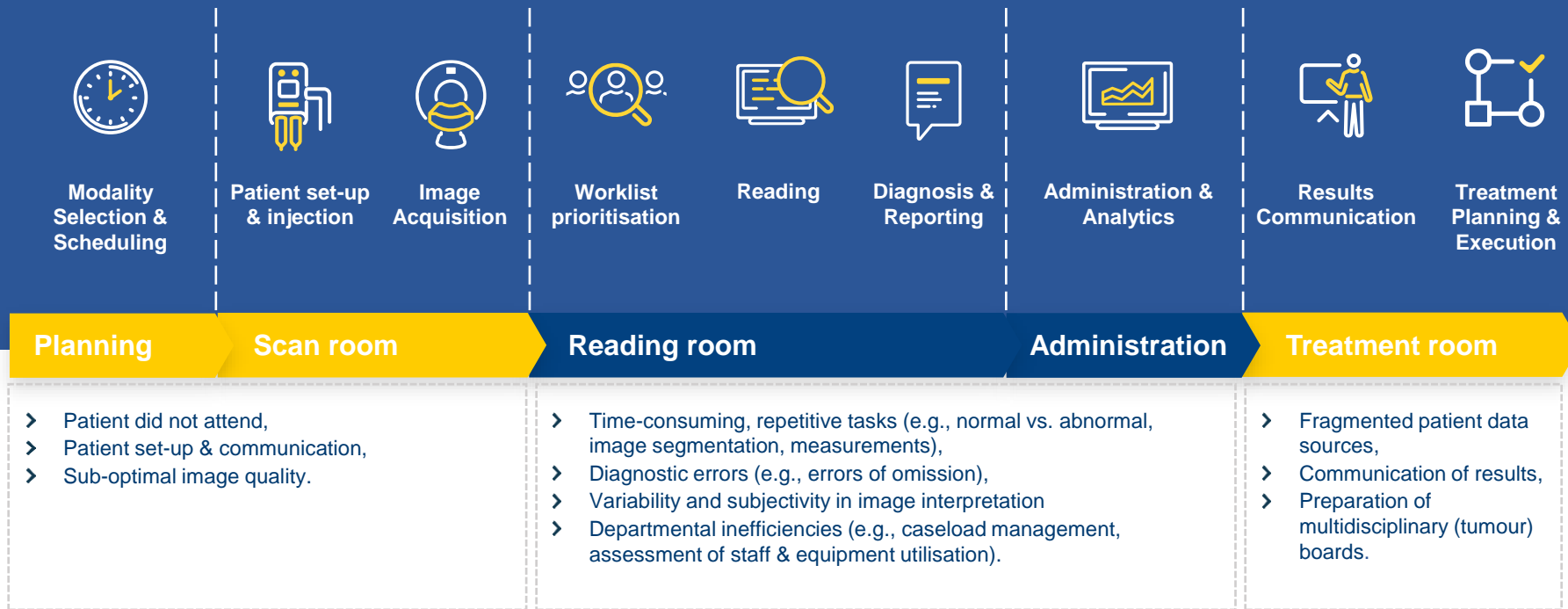
1) Ranschaert E, Topff L, Plianykh O, (2021) "Optimization of Radiology Workflow with Artificial Intelligence" Radiologic Clinics of North America, Volume 59, Issue 6, 955-966

2) Blezek DJ, Olson-Williams L, Missert A et al (2021) "AI integration in the Clinical Workflow" Journal of Digital Imaging, Volume 34, Issue 1, 1435-1446

3) Wichmann JL, Willeminck MJ, De Cecco CN (2020) "Artificial Intelligence and Machine Learning in Radiology: Current State and Considerations for Routine Clinical Implementation" Investigate Radiology, Volume 55, Issue 9, 619-627



Despite technology advancements, inefficiencies along the overall radiology workflow persist



Exponential rise in available AI technologies

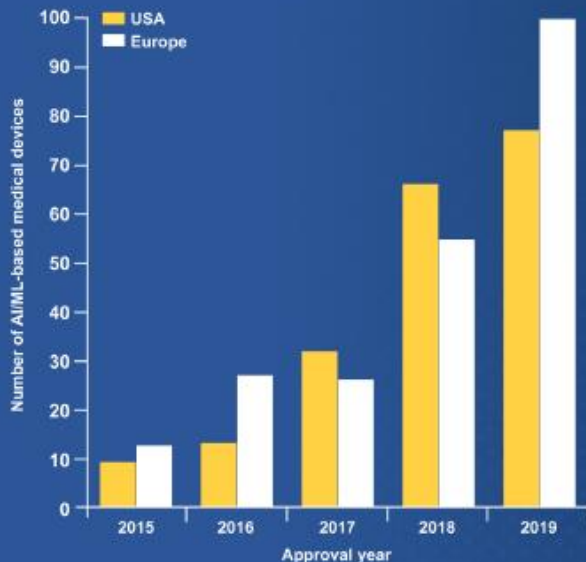


Figure 2. Number of approved (USA) and CE-marked (Europe) AI/ML-based medical devices between 2015 and 2019

The CE-mark year is considered the approval year for devices in Europe. AI/ML-artificial intelligence and machine learning
CE-Conformité Européenne.

- Certified AI technologies are rising exponentially¹
- Now **over 200** AI applications with CE certification for Radiology²
- Recent estimates predict a more than 10-fold growth in the market for artificial intelligence (AI) in medical imaging over the next decade³

1) Muehlemaier U, Daniore P & Vokinger K. (2021). Approval of artificial intelligence and machine learning-based medical devices in the USA and Europe (2015–20): a comparative analysis. The Lancet Digital Health. 3. 10.1016/S2589-7500(20)30292-2.

2) Available online: <https://grand-challenge.org/ai/radiology/> [Accessed 23/08/2022]

3) Available online: <https://www.globenewswire.com/news-release/2020/02/26/1990679/0/en/Artificial-Intelligence-in-Medical-Imaging-Market-Report-2019-CAGR-of-36-89-By-Offering-Technology-Deployment-Type-Application-Leading-Players-BenevolentAI-OrCam-Babylon-Freenome-l.html> [Accessed 26/04/2023]



Funding of AI

- › Total investment in AI companies between 2014 and 2019 → **1.17 billion USD** ⁽¹⁾
- › Between 2019 and 2020, private investment in AI companies increase by **9,3%** ⁽²⁾
- › By 2030, investment in medical images AI base solutions is expected to exceed

...3 billion USD ⁽³⁾

1. Alexander A, Jiang A, Ferreira C, Zurkiya D. An Intelligent Future for Medical Imaging: A Market Outlook on Artificial Intelligence for Medical Imaging. J Am Coll Radiol. 2020 Jan;17(1 Pt B):165-170. doi: 10.1016/j.jacr.2019.07.019. PMID: 31918875.
2. Artificial Intelligence Index Report 2021 https://aiindex.stanford.edu/wp-content/uploads/2021/11/2021-AI-Index-Report_Master.pdf [Accessed 02/05/2023]
3. Tsao, D. N. (2020). AI in medical diagnostics 2020- 2030: Image recognition, players, clinical applications, forecasts: IDTechEx. <https://www.idtechex.com/en/researchreport/ai-in-medical-diagnostics-2020-2030-imagerecognition-players-clinical-applications-forecasts/766> [Accessed 02/05/2023].

IDTechEx Research

Expect
\$3.36 bn by

2031

for AI image
recognition in
medical
diagnostics



Deployment of algorithms is not commensurate with their Development

Why ¹

- › The deployment is being hindered by **several complex and interrelated issues** lowering the likelihood of AI-based solutions being adopted ²
- › There is a **lack of trust** in AI-based solutions by key stakeholders such as regulators, healthcare professionals and patients ^{2, 3}

1. Leiner T, Bennink E & Mol C et al. (2021). Bringing AI to the clinic: blueprint for a vendor-neutral AI deployment infrastructure. Insights into Imaging, 12. 10.1186/s13244-020-00931-1.
2. Esmailzadeh P. Use of AI-based tools for healthcare purposes: a survey study from consumers' perspectives. BMC Med Inform Decis Mak. 2020 Jul 22;20(1):170. doi: 10.1186/s12911-020-01191-1. PMID: 32698969; PMCID: PMC7376686
3. Richardson, J. P., Smith, C., Curtis, S., Watson, S., Zhu, X., Barry, B., & Sharp, R. R. (2021). Patient apprehensions about the use of artificial intelligence in healthcare. NPJ Digital Medicine, 4(1), 140. <https://doi.org/10.1038/s41746-021-00509-1>

Prevalence and Attitudes Toward the Use of AI in Clinical Practice:

- › 33,5% → using AI
- › 66,5% → not using AI

AI Performance in Clinical Practice:

- › 94.3% → “inconsistent performance of AI”
- › 5.7% → indicated AI “always works”

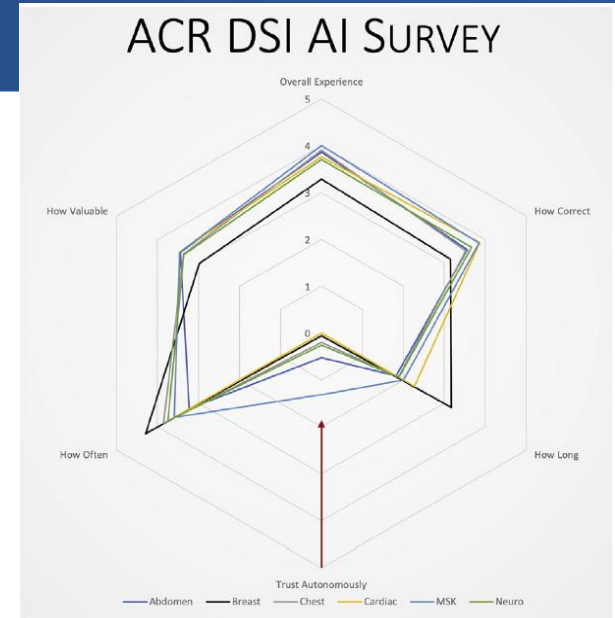


Fig. 3. AI satisfaction. The spider plot indicates an overall positive opinion of AI among respondents. However, few trust AI to perform autonomous interpretations (arrow). AI = artificial intelligence; DSI = Data Science Institute; MSK = musculoskeletal radiology; Neuro = neuroradiology.

Implementation of AI

Generalisability
Clinical use cases
Scientific evidence
Interpretability

Standardization

Regulatory framework
Data protection
Liability

Governance

ROI
Product selection

Economics

End users
Patients

Education

Integrability
Scalability
Resources

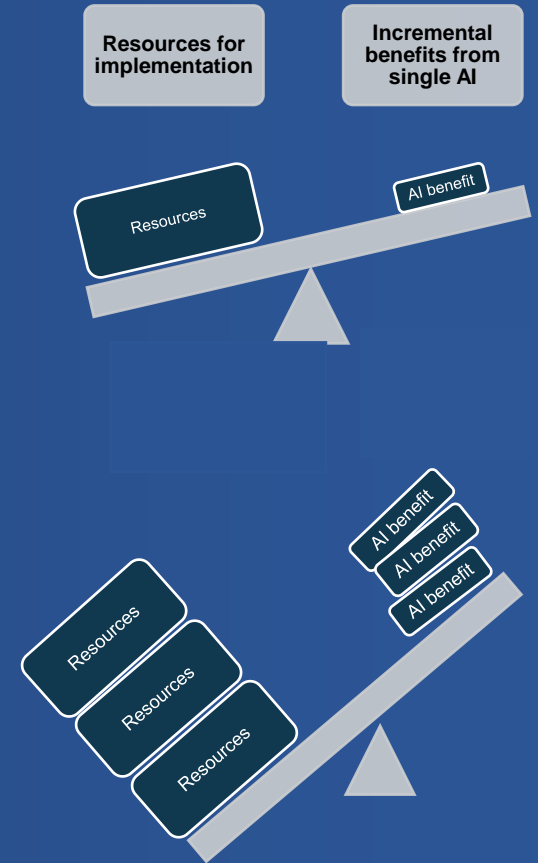
- **Human**
- **Hardware/software**

IT



The scalability challenge

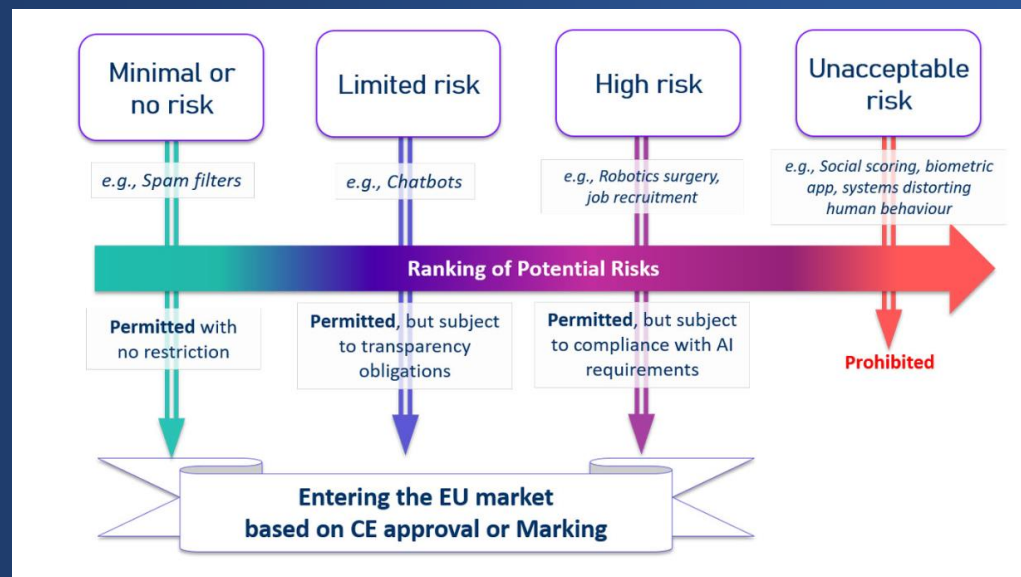
- Adoption is a balance between the incremental benefits of AI and the resources required to **implement** and **maintain** the technology.
- Generally, many AI models have a very specific intended purpose with potentially small incremental benefits.
- Implementation is resource intensive.
- **Scalability strategy** is not routinely considered during implementation.
- Stand-alone point solutions (single AI) implementation are unmanageable¹.





Artificial Intelligence Act proposal

- Strengthening rules around data quality, transparency, human oversight and accountability.
- Address ethical questions and implementation challenges.
- Provide AI developers, deployers and users with clear requirements and obligations and reduce financial burdens for business.
- Strengthen Europe's position as a global hub of excellence in AI from the lab to the market.



A regulated pathway for Artificial Intelligence in Medical Imaging: <https://www.procancer-i.eu/newsletter-2/a-regulated-pathway-for-artificial-intelligence-in-medical-imaging/> [Accessed 02/05/2023]



Software and AI as a Medical Device program (SaMD/AIaMD)

Aims to support the **adoption** of medical devices and AI in the UK market and ensure **responsible innovation**, providing a regulatory framework focused on **patients and public safety**.

- › Qualification and intended purpose.
- › Classification based on risk.
- › “airlock process” to generate real-world evidence.
- › Clear Premarket requirements.
- › Stronger Post market surveillance and monitoring.
- › SaMD/AIaMD cybersecurity
- › AI rigor
- › AI interpretability
- › Adaptive AI change management



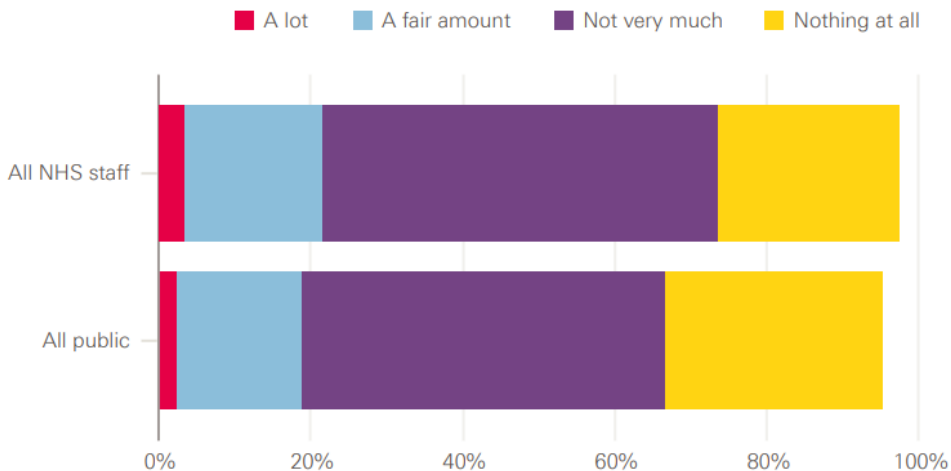
1. MHRA, Software and AI as a Medical Device Change Programme – Roadmap. Oct 2022. Available online: <https://www.gov.uk/government/publications/software-and-ai-as-a-medical-device-change-programme/software-and-ai-as-a-medical-device-change-programme-roadmap#work-packages> [Accessed 02/05/2023]
2. Image: <https://www.rolandberger.com/en/Insights/Publications/Artificial-intelligence-and-regulations-for-machines.html> [Accessed 02/05/2023]

Education for Healthcare Professionals

- Most healthcare workers lack direct experience with AI technologies.
 - A 2020 survey found that three-quarters of respondents knows “**not very much**” or “**nothing**” about AI ¹
- Education in AI is critical in the successful implementation, as it can improve HCPs ^{2,3}:
 - Skills and attitudes toward AI
 - Increased **acceptance** and willingness to use AI in clinical practice

Figure 2: Public and NHS staff familiarity with automation and AI

In general, how much, if anything, have you heard, seen or read about automation and AI in health care (eg in the news, on social media, or from family, friends, colleagues, etc.)?

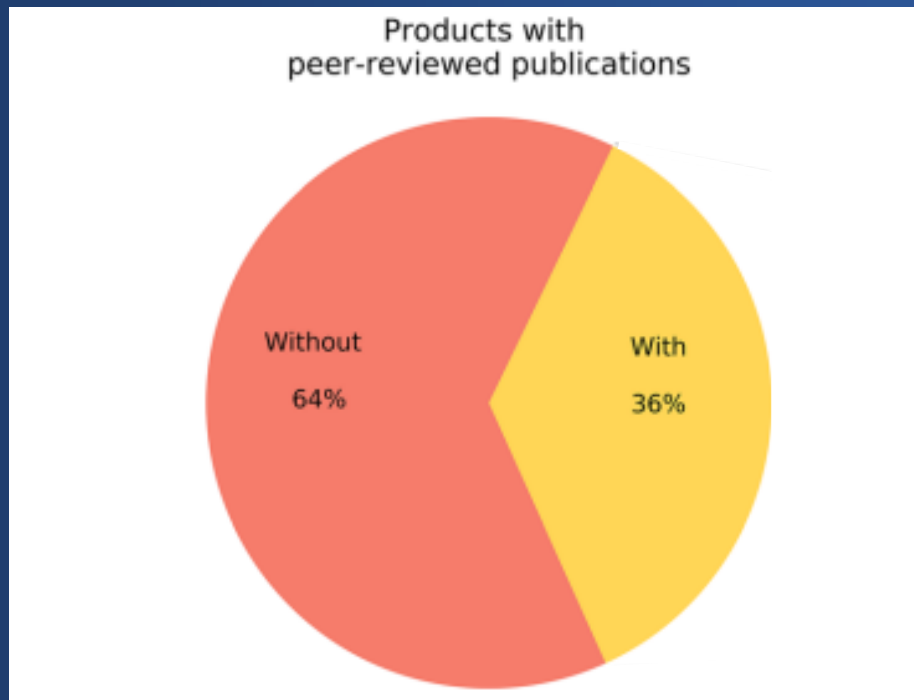


1. Hardie T, Horton T, Willis M, Warburton W. Switched on. How Do We Get the Best out of Automation and AI in Health Care? 2021. doi:10.37829/HF-2021-I03
2. van der Vaart, R., Drossaert, C. H., de Heus, M., Taal, E., & van de Laar, M. A. (2020). Measuring actual eHealth literacy among patients with rheumatic diseases: a qualitative analysis of problems encountered using Health 1.0 and Health 2.0 applications. *Journal of Medical Internet Research*, 22(9), e17568.
3. Topol, E. J. (2019). High-performance medicine: the convergence of human and artificial intelligence. *Nature Medicine*, 25(1), 44-56.



Clinical evidence

- High-quality evidence used to determine AI performance contributes to **confidence in** and **implementation**.¹
- Robust evidence of improved human decision-making when using AI systems is still lacking ².
- A review of 100 CE-marked AI products from 54 different vendors ³.
 - 64% no peer-reviewed evidence of its efficacy.
 - 18% had evidence level 3 or higher

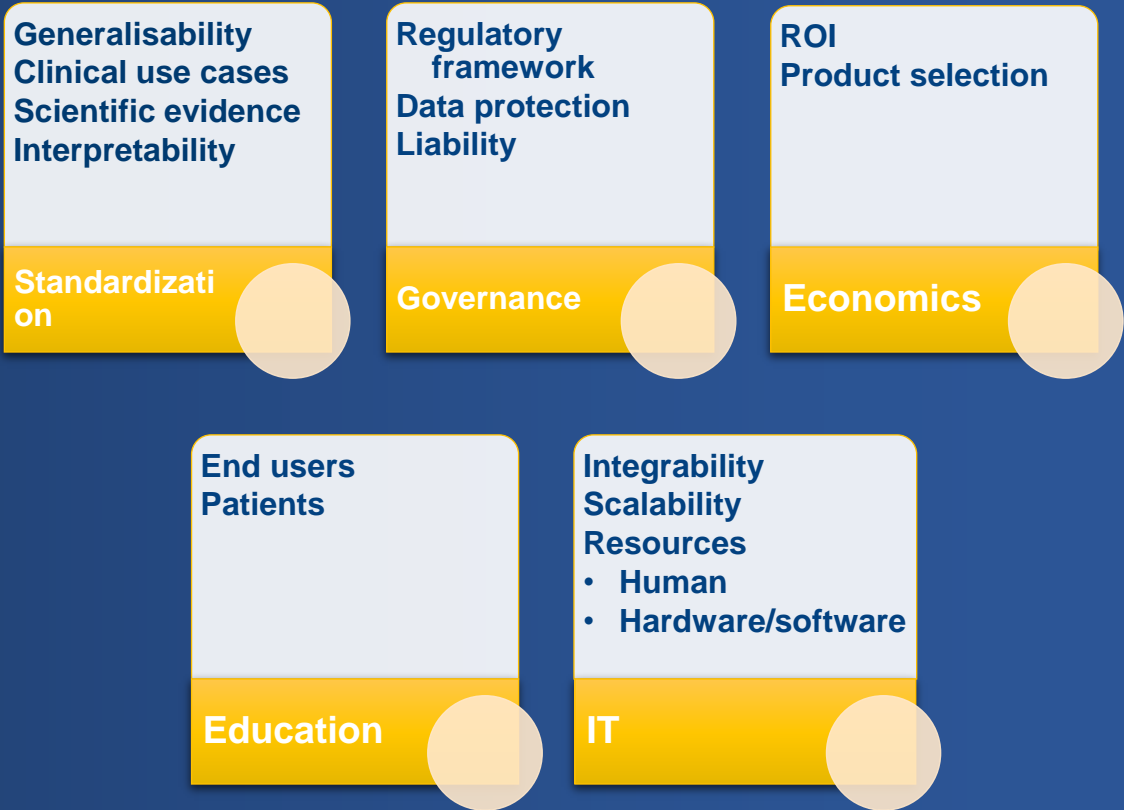


1. [Understanding healthcare workers' confidence in AI](https://digital-transformation.hee.nhs.uk/binaries/content/assets/digital-transformation/dart-ed/understandingconfidenceinai-may22.pdf) <https://digital-transformation.hee.nhs.uk/binaries/content/assets/digital-transformation/dart-ed/understandingconfidenceinai-may22.pdf> [Accessed 03/05/2023]
2. Vasey B, Novak A, Ather S, Ibrahim M, McCulloch P. DECIDE-AI: a new reporting guideline and its relevance to artificial intelligence studies in radiology. Clin Radiol. 2023 Feb;78(2):130-136. doi: 10.1016/j.crad.2022.09.131. PMID: 36639172.
3. Van Leeuwen KG, Schalekamp S, Rutten MJCM, van Ginneken B, de Rooij M. Artificial intelligence in radiology: 100 commercially available products and their scientific evidence. Eur Radiol. 2021 Jun;31(6):3797-3804. doi: 10.1007/s00330-021-07892-z. Epub 2021 Apr 15. PMID: 33856519; PMCID: PMC8128724.



While some will require large-scale actions, others....

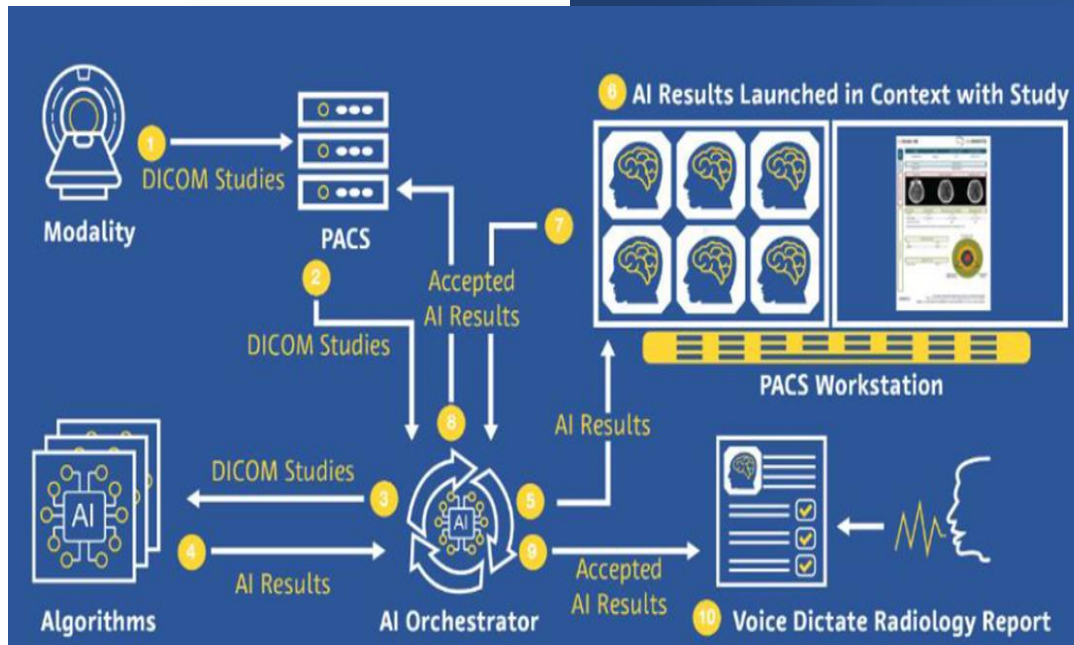
.... can be faced with available tools, such as **platform technology**.





What is Platform technology

- Technology infrastructure integrated into the native IT infrastructure of a radiology department (PACS / RIS).
- Enables the communication of imaging data into the native infrastructure and multiple deployed AI models.
- Provides an interface for user interaction with AI results.





The power of platform technology



One-off integration



Vendor neutral infrastructure with scalable architecture for the future



Local validation of datasets is possible



“Try-before-you-buy” prior to committing to an application



Application-level analytics for quality assurance



The power of platform technology



Generation of Real-World Evidence



Triggered Automation, Cascade workflows¹ and Ensemble of AI models



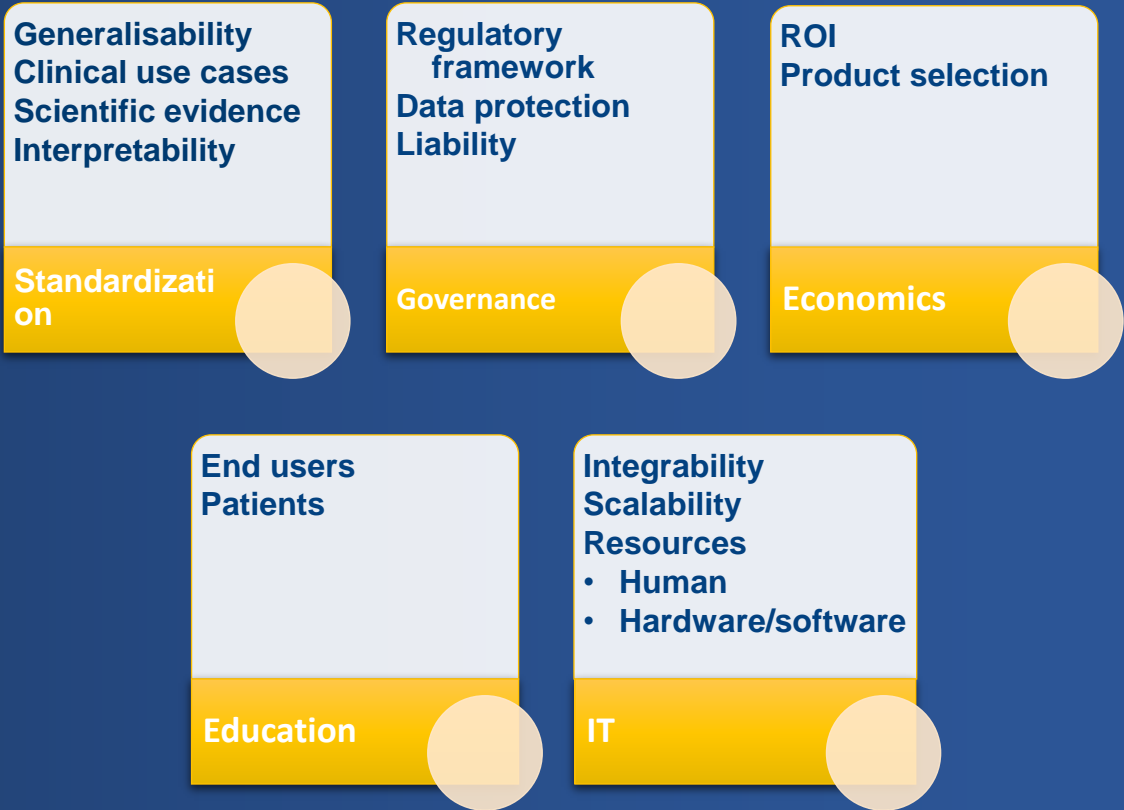
Versioning control¹



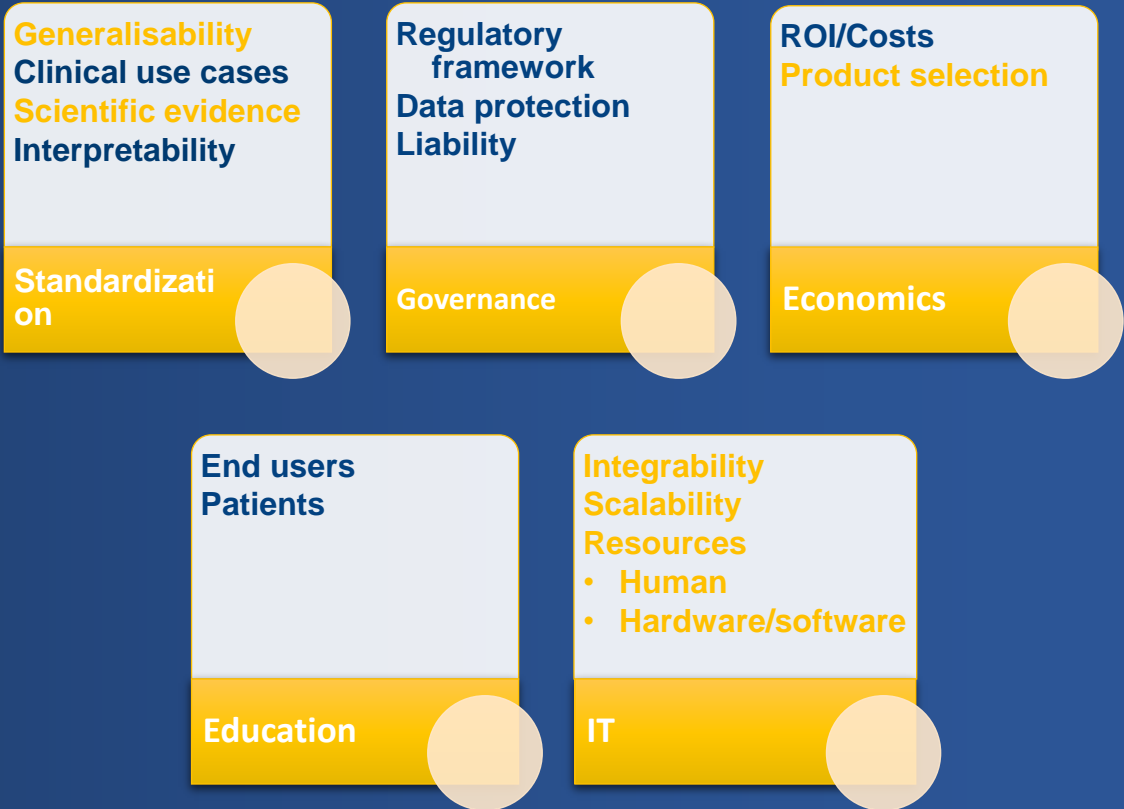
Platform for local departments to leverage their own data with capability of deployment



Implementation of AI



Implementation of AI





AI Culture – Keys to success

- Implementation can support or derail the strategic and clinical advantages of the organizations' AI adoption
- AI implementation as a service rather than just a technology
- Understand, in detail, the landscape in which you are operating in
- Focus on the needs of the customer and the AI users
- AI deployment is not all-or-nothing
- Human-in-the-loop AI
- AI adoption is a journey that each stakeholder should enjoy being part of

40% of organizations rate themselves at the three highest levels of AI maturity, from Operational to Transformational.

Gartner AI Maturity Model

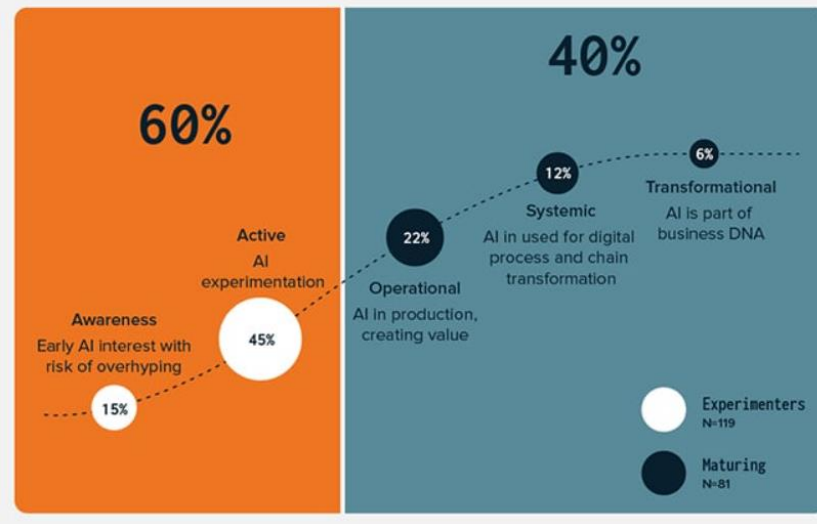


Figure 1: LTX 2022, highlights from our executive survey: The path to AI Maturity. Available Online at <https://www.ltx.ai/blog/highlights-from-our-executive-survey-the-path-to-ai-maturity/> [Accessed 23/08/2022]



Summary

- AI holds the potential to help improve many challenges radiology departments will face in the upcoming years.
- The regulatory landscape is evolving to support and maintain safe and effective implementation.
- Strategy for AI implementation is a key factor for success and must consider scalability.
- There are several key advantages of AI platform deployment compared to single AI application integration.
- Platform technology has the potential to create a sustainable AI ecosystem and help to address the clinical, regulatory, and quality requirements of AI deployment in healthcare.
- The education of the end user will be decisive in adopting the technology.



Thank You

INTELLIGENT HEALTH UK 2023

Breaking down the barriers
between tech and healthcare