# Assessment of the performance of a deep learning system at identifying breast cancer on screening mammograms using de-identified historic data.

Submission date	Recruitment status No longer recruiting Overall study status	<ul><li>Prospectively registered</li></ul>		
06/03/2019		☐ Protocol		
Registration date		Statistical analysis plan		
20/03/2019	Completed	[X] Results		
Last Edited	Condition category	[] Individual participant data		
07/04/2025	Cancer			

#### Plain English summary of protocol

Current plain English summary as of 25/05/2021:

Background and study aims:

Breast cancer is a leading cause of cancer-related mortality among women worldwide, accounting for approximately 600,000 deaths annually.

There is a need for rigorous large-scale studies to assess the performance of AI for mammography in double reading. This should be done on diverse cohorts of women across multiple screening sites and programmes, and on unenriched data representative of a true screening population.

The aim of this study is to evaluate the ability of a novel AI system to act as a reliable independent reader in a double reading workflow, as well as demonstrating its standalone performance compared to the historical results.

#### Who can participate?

Being a retrospective study, no participants are directly involved in the study, and there will be no effect or change to any participant's care. The study will evaluate the AI system based on its analysis of historical, de-identified cases from study sites where outcomes data (e.g. biopsy, histopathology results, follow-up information) is also collected.

What does the study involve?

Eligible cases will be presented to the AI system for analysis.

What are the possible benefits and risks of participating? No benefits or risks of participating are anticipated.

Where is the study run from? Selected study sites in the UK and Hungary

When is the study starting and how long is it expected to run for? From September 2018 to January 2021

Who is funding the study?

- 1. Innovate UK (UK)
- 2. Kheiron Medical Technologies (UK)

Who is the main contact? Dr. Annie Ng annie@kheironmed.com

Previous plain English summary:

Background and study aims

Breast cancer is one of the most frequently occurring cancer types in women worldwide. Breast screening is considered to be the world-wide gold standard for early detection and control of breast cancer. Mammography reading for breast screening is known to be a laboriously repetitive and meticulous task, and many sites struggle to meet required performance targets (NHS, EU), Radiologists currently have no effective practical support tools for reading mammography images; however, with the application of leading-edge deep learning techniques, the sponsor has developed software for the accurate analysis of mammograms to support the diagnosis of breast cancer.

This study aims to calibrate and validate the software's performance on retrospective (historic) data from NHS trusts and mammography units. By doing this study, we will learn how effective and generalisable the software can be in supporting radiologists in breast screening in the UK.

#### Who can participate?

Being a retrospective study, no patients will be directly involved in the study, and there will be no effect or change to any patient's care. The study will evaluate the software based on its analysis of validated de-identified historical cases from investigational sites where the outcomes (i.e. biopsy results, normal follow-up) are already known.

What does the study involve?

Historic data from NHS trusts and mammography units will be fed into the software to test functionality and performance.

What are the possible benefits and risks of participating? Not applicable

Where is the study run from? Kheiron Medical Technologies, London

When is the study starting and how long is it expected to run for? September 2018 to October 2020 (updated 24/02/2021, previously: July 2020)

Who is funding the study?

- 1. Innovate UK
- 2. Kheiron Medical Technologies

Who is the main contact? Dr Annie Ng annie@kheironmed.com

## **Contact information**

#### Type(s)

Scientific

#### Contact name

Dr Annie Ng

#### Contact details

Kheiron Medical Technologies London United Kingdom EC1V 9BG +44 (0)7379467701 annie@kheironmed.com

#### Type(s)

Scientific

#### Contact name

Dr Nisha Sharma

#### Contact details

Leeds Teaching Hospital NHS Trust Leeds United Kingdom LS9 7TF 0113 243 3144 nisha.sharma2@nhs.net

## Additional identifiers

#### Clinical Trials Information System (CTIS)

Nil known

#### ClinicalTrials.gov (NCT)

Nil known

#### Protocol serial number

AUX-07-2018-KMT

# Study information

#### Scientific Title

A retrospective multi-centre clinical investigation of a novel medical technology solution in the assessment of mammography images

#### Study objectives

#### Current study hypothesis as of 25/05/2021:

The purpose of the study is to evaluate the performance of a novel AI system in detecting breast cancer. The study aims to evaluate the AI system's ability to act as a reliable independent reader in a double reading workflow, as well as demonstrating its standalone performance compared to the historical results.

#### Previous study hypothesis:

The purpose of the study is to calibrate and validate a deep learning software system that provides breast radiologists with recall decision support in a breast screening setting. The performance of this software in supporting recall decisions in breast screening is validated on retrospective data from multiple sites from a cohort of women who have undergone routine mammographic screening for breast cancer and have sufficient follow-up imaging or biopsy data.

#### Ethics approval required

Old ethics approval format

#### Ethics approval(s)

Current ethics approval as of 25/05/2021:

1. Approved 03/10/2018, HRA and Health and Care Research Wales (HCRW) (Castle Bridge 4, 15-19 Cowbridge Rd E, Cardiff CF11 9AB; 029 2023 0457; hra.approval@nhs.net), Ref: 19/HRA/0376 2. Approved 03/07/2018, ETT--TUKEB Medical Research Council, Scientific and Research Ethics Committee, Hungary (1051 Budapest, Széchenyi István tér 7-8; (+36 1) 795-1197; tukeb@emmi. gov.hu), ref: OGYÉI/46651-4/2020

#### Previous ethics approval:

Approved 03/10/2018, HRA and Health and Care Research Wales (HCRW) (Castle Bridge 4, 15-19 Cowbridge Rd E, Cardiff CF11 9AB; 029 2023 0457; hra.approval@nhs.net), Ref: 19/HRA/0376

#### Study design

Multi-national multi-site retrospective study

#### Primary study design

Observational

#### Study type(s)

Screening

#### Health condition(s) or problem(s) studied

Breast cancer

#### **Interventions**

The intervention is the sponsor's deep learning software, assessed on de-identified randomised retrospective breast screening cases and outcomes. Comparison is made against the control arm of existing reference outcomes within the retrospective dataset where the deep learning software was not in use.

#### Intervention Type

Device

#### Phase

Not Applicable

#### Drug/device/biological/vaccine name(s)

-

#### Primary outcome(s)

Current primary outcome measure as of 25/05/2021:

Standalone sensitivity and specificity performance of the AI system.

Previous primary outcome measure:

Rate of detection of malignancy of the Sponsor's deep learning software measured using patient notes.

#### Key secondary outcome(s))

Current secondary outcome measures as of 25/05/2021:

- 1. Non-inferiority and superiority testing of the AI system as an independent reader in a double reading workflow compared to national guidelines and historical double reading in terms of recall rate, cancer detection rate, sensitivity, specificity, and interval cancer rate.
- 2. Comparing the AI system's standalone performance to the historical first reader.
- 3. The AI system's standalone performance in terms of recall rate, cancer detection rate, interval cancer rate, positive predictive value, arbitration rate, and AUC.

Previous secondary outcome measures:

Secondary aims will assess the software's performance (sensitivity, specificity, percent indeterminate) at varying settings as well as measure its recall rate (percentage of screening mammograms recalled for further assessment). Accuracy is measured in terms of sensitivity (true positive rate), specificity (true negative rate) as compared to a defined Reference Standard, plotted onto Receiver Operator Curves, and an Area Under the Curve (AUC) calculated. Recall rate is the rate of positive reported findings in a given sample.

#### Completion date

31/01/2021

# **Eligibility**

#### Key inclusion criteria

Current participant inclusion criteria as of 25/05/2021:

- 1. Female participants
- 2. 4-view mammography cases (with exactly one of each: MLO-R, MLO-L, CC-R, CC-L of the four standard views) produced by certified digital mammography hardware and taken for screening purposes

Previous participant inclusion criteria:

- 1. Female patients
- 2. Mammography cases for screening purposes, i.e. cases from:
- a) patients involved in the national breast screening program (depending on the jurisdiction includes women of age
- 45-73 who are called for examination via a letter by the national health authorities based on the population database),

and

b) women outside the national breast screening program who decided on their own to participate as per standard of

#### care

- 3. Cases with images in DICOM format
- 4. Cases with images produced by certified digital mammography hardware
- 5. Cases with one set of all of the 4 standard mammography images (i.e. exactly one of each: MLO-R, MLO-L, CC-R,

CC-L) present (no images missing and no extra images)

6. Cases with available historical outcome information as specified below\*:

(Outcome information:

Confirmed positive case: malignancy is confirmed by a decisive biopsy, cytology or histology of the surgical specimen

within 250 days after the time of the image acquisition date.

Confirmed negative case: a negative follow-up result is available at least 34 months after the image acquisition date

(with no malignant operation and no malignancy indication in that period.)

\*This inclusion criteria only applies to sensitivity/specificity analysis (not recall rate analysis)

#### Participant type(s)

Healthy volunteer

#### Healthy volunteers allowed

No

#### Age group

Adult

#### Sex

Female

#### Key exclusion criteria

Current participant exclusion criteria as of 25/05/2021:

- 1. Male participants
- 2. Participants from whom any image data is used during training, calibration, or testing for the technology development of the deep learning model
- 3. Non-original, magnified, or spot-compressed images

Previous participant exclusion criteria:

- 1. Male patients
- 2. Images that are non-original images (e.g. post-processed images)
- 3. Magnified images (in the DICOM file the View Modifier Code Sequence (0054, 0222) has either of the values: R-

102D6, "Magnification" or R-102D7, "Spot compression")

- 4. Cases with indication of a breast operation due to malignancy in the past medical history
- 5. Cases dated after a breast cancer confirmed by biopsy, cytology or histology
- 6. All patients of whom any image data was used during training, calibration or testing during the technology

development of the deep learning model.

Note: hormone replacement therapy in the past medical history is not an exclusion criterion.

#### Date of first enrolment

03/10/2018

#### Date of final enrolment

01/09/2019

#### Locations

#### Countries of recruitment

**United Kingdom** 

England

Hungary

#### Study participating centre Leeds Teaching Hospitals NHS Trust

St. James's University Hospital Beckett Street Leeds United Kingdom LS9 7TF

# Study participating centre Nottingham University Hospitals NHS Trust Headquarters

Queens Medical Centre Derby Road Nottingham United Kingdom NG7 2UH

#### Study participating centre United Lincolnshire Hospitals NHS Trust

Lincoln County Hospital Greetwell Road Lincoln United Kingdom LN2 4AX

#### Study participating centre MaMMa Klinika Budapest & Mozgó Emlőszűrő Állomás

Kapás u. 22 Budapest Hungary 1125

#### Study participating centre MaMMa Klinika Szekszárd

Szekszárd Béri Balogh Á. u. 9-13 Budapest Hungary 7100

#### Study participating centre MaMMa Klinika Kecskemét

Kecskemét Zrínyi u 38. Budapest Hungary 6000

#### Study participating centre MaMMa Klinika Szolnok

Szolnok Hősök tere 2-4. Budapest Hungary 5000

# **Sponsor information**

#### Organisation

Kheiron Medical Technologies

#### **ROR**

https://ror.org/01r3ct535

# Funder(s)

#### Funder type

Government

#### **Funder Name**

Innovate UK

#### Alternative Name(s)

UK Research and Innovation Innovate UK, innovateuk

#### **Funding Body Type**

Government organisation

#### **Funding Body Subtype**

National government

#### Location

United Kingdom

#### Funder Name

Kheiron Medical Technologies

#### **Results and Publications**

#### Individual participant data (IPD) sharing plan

Current IPD sharing statement as of 07/06/2021:

The data generated or analysed during the study cannot be shared at this time due to contractual agreements with study sites.

#### Previous IPD sharing statement:

The data sharing plans for the current study are unknown and will be made available at a later date.

#### IPD sharing plan summary

Not expected to be made available

#### **Study outputs**

Output type	Details	Date created	Date added	Peer reviewed?	Patient-facing?
Results article		19/05/2023	22/05/2023	Yes	No
Results article		06/06/2023	07/04/2025	Yes	No
Participant information sheet	Participant information sheet	11/11/2025	11/11/2025	No	Yes