

# +priokritisk

Early identification of clinical deterioration among hospitalized patients by explainable AI



## BETTER PATIENT CARE BY AI DECISION SUPPORT ?

We have developed an explainable AI model that predicts sepsis and lung failure at early stages of disease, which may reduce morbidity and mortality. Successful implementation and clinical acceptance are needed in the translation to improved patient care.

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Early detection of sepsis utilizing deep learning on electronic health record event sequences

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PubMed ID: 32498999

nature communications

Explains artificial intelligence model to predict acute critical illness from electronic health records

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PubMed ID: 32737308

npj | digital medicine

The Framing of machine learning risk prediction models illustrated by evaluation of sepsis in general wards

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PubMed ID: 34782696



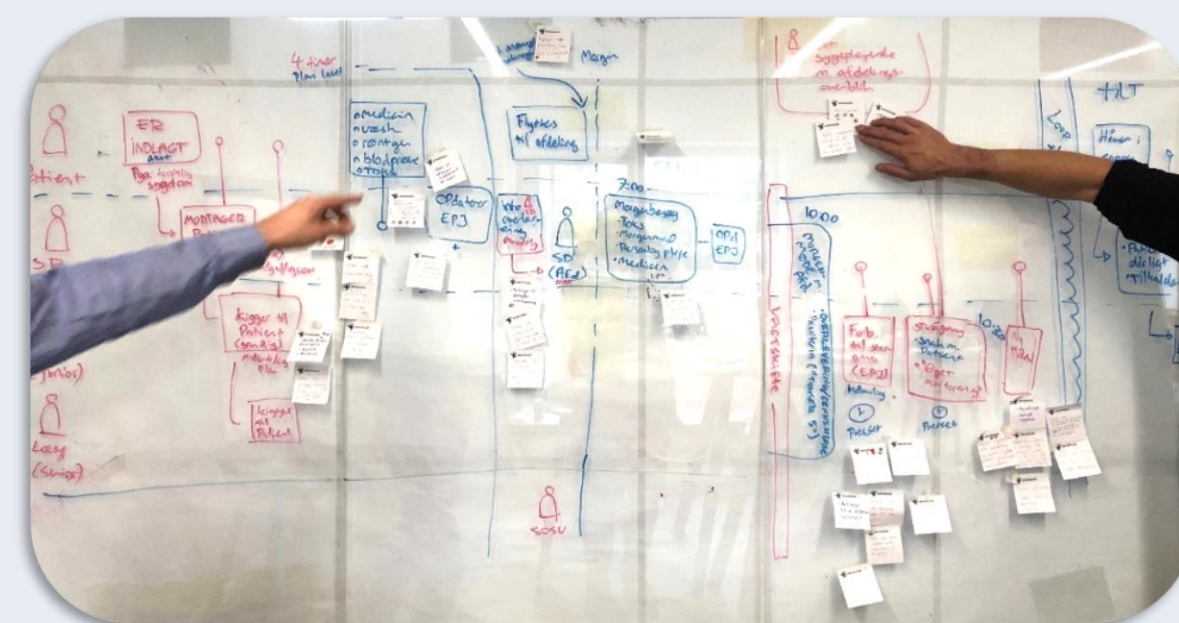
## A HUMAN CENTERED PARTICIPATORY APPROACH

By use of an iterative and interdisciplinary process involving clinicians and the entire development team, we aimed at the best possible adaption of the algorithm and its application to meet bed-side clinical needs. We found that:

- Notifications should be available on a hand-held device.
- Subsequent information should be presented in a tailored application.
- Symbols and texts in the application must be aligned with existing terms and concepts used in the EHR.
- The format of patient-specific AI explanations derived from the model requires careful consideration.

## MULTI-DISCIPLINARY DEVELOPMENT TEAM

Healthcare researchers, anthropologists, registered nurses, medical doctors, data engineers, UX designers.



## PREREQUISITES FOR GOOD CLINICAL FEEDBACK

- Well-prepared development team.
- A shared perception of the clinical setting in which the model is to be used.
- Coffee. A lot.
- Carbohydrates.
- Disinfectants.
- Hands-on sessions.
- Interested clinical staff.
- Support from Head of Dept.

## A THREE-STEP DEVELOPMENT PROCESS TO ENABLE CLINICAL TRANSLATION

A schematic overview of the methods and activities used in the +priokritisk project to prepare for a successful clinical translation.

- Model development and evaluation**
- Framing critical disease
- Determining data sources
- Training the model
- Evaluating by use of AUROC

### Adaptation to a clinical setting by ethnographic methodology

- Where (medical departments)
- How (possible solutions and actions)
- Who (Professions)

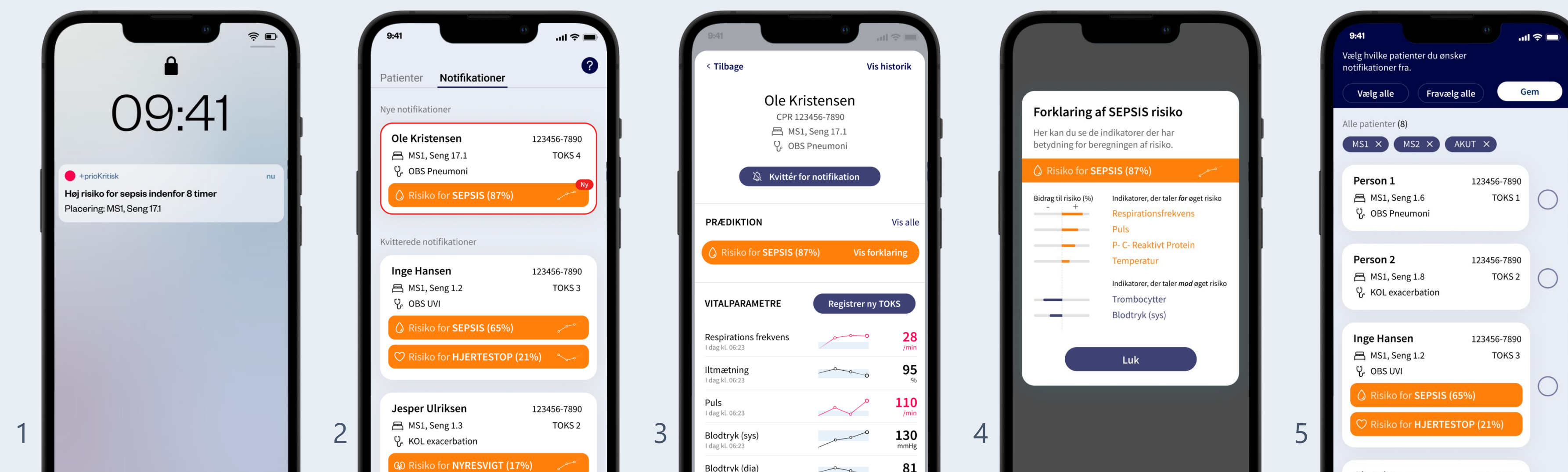
### Application development by design sprint, clinical tests and feedback sessions

- Mapping work flows and patient trajectories
- Sketching the application
- Testing the application
- Considering explainability format
- Adjusting the application

## NEXT STEPS AND PERSPECTIVES

- Establish a dataflow from the EHR to the prediction engine.
- Describe the performance of +priokritisk during a test-phase.
- Re-iterations of the AI model and its application.
- Full-scale implementation in selected departments.
- Clinical translation by quantitative and qualitative research methods.
- Model extension to other disease entities.
- Commercialization.

## USER INTERFACE OF THE TAILORED APPLICATION



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