

Norwegian University of Science and Technology



What is there to learn from introducing AI-based functionality in clinical workflows in Norway?

Arild Faxvaag, M.D.

Professor in medicine (Health informatics)

Faculty of medicine and health sciences, NTNU

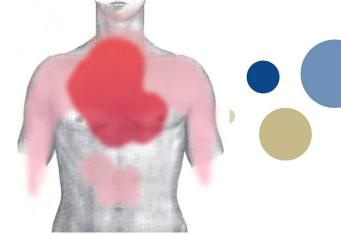
- what are some important clinical workflows?
- what motivates the procurement of commercial products?
 - which workflows are targeted?
 - o what are some of the results?
- what are the ML&AI R&D opportunities?
 - o what is the status of the regulatory work?
 - what are the machine learning infrastructures?
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- what's in the ML&AI R&D pipelines?
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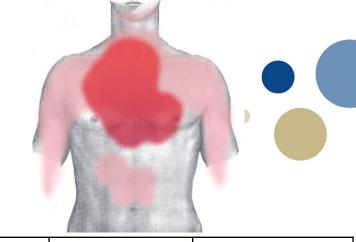
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generic clinical workflow:



Step	collect data to underpin decision	search for applicable knowledge	assess the problem	make decision	execute decision	collect data to assess outcome
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Example	Tell me about the pain in your chest	Can this be a heart attack?	You might have a heart attack	You shall have morphine, oxygen, nitroglycerin, and I will have a helicopter coming over	Here you have a nitroglycerine pill. Put it under your tongue.	How is your chest pain doing now?



Diagnostics (Problemknowledge coupling)

Planning the delivery of knowledgebased care Manual delivery of knowledgebased care

Technology-supported, manual delivery of knowledgebased care

Robotised care

Assessment of outcomes of knowledge-based care



Triage

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triage -- population health

- triage = assessing health problems to decide on which problem to work on next and which problems that will have to wait
- Population health:
 - monitoring the state of disease in patients with chronic disease:
 - heart failure, COPD, asthma
 - monitoring frailty:
 - fall detection
 - monitoring bodily functions
 - wet diaper detection in nursing homes



EHR-system / health information Infrastructure

Triage Diagnostics
(Problem-knowledge coupling)

Planning the delivery of knowledge-based care

Manual delivery of knowledgebased care

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procurement of commercial products

- Software bundled with imaging information systems
 - Radiology: BoneView*
 - Pathology: Digital pathology products
- Software products based on Large Language models (LLMs)
 - speech-to-text services bundled with EHR system or speech recognition products
 - to support documentation practice

motivation:

- Laboratory services:
 - Lack of qualified personnel to take care of an ever-increasing number of tests
- EHR documentation practice:
 - relieving the documentation burden



Radiology:

- BoneView:
 - workflows targeted: Detection of fractures after trauma
 - o results:
 - Patients: Patients cleared of fractures by BoneView don't have to wait until the pictures has been read by a radiologist
 - The radiologist: Better in-basket triage, but still have to work through all the pictures

Digital pathology:

workflows targeted:

- Tumor screening
- Detection of dysplastic cells in PAP Smears (cervical cancer screening program)

• results:

- Services often implemented as part of implementing a digital pathology system (no more samples under an analogue microscope)
- An Al-assisted pathologist does better than a pathologist without Al

LLM-based speech-to-text services

- now in widespread use in primary care
- on its way in hospitals

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the ML&AI R&D agenda:

- Norwegian Research Council: Huge research programmes
- Collaborations in the nordics: Nordic Al
- Collaborations across EU



ML&Al Regulatory work:

- the health authorities are dedicated to make this work in all sectors
 - oil and gas industry
 - defence
 - maritime sector
 - education
 - healthcare
- implementing the EHDS regulations
 - the Al act

infrastructures for machine learning?

- the health registries infrastructure
- EHR corpora
- dawning:
 - health data spaces that can be used across national borders
 - rare diseases
 - disease-specific research registries

funding mechanisms:

- Norwegian research council
 - support for R&D
- Innovasjon Norge
 - support for product development



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Image / Signal analysis in diagnostics	Ultrasound-based assessment of the heart MRI in - cognitive decline - Early detection of stroke Digital pathology - Breast cancer (screening programs) - pap smears - Other cancers Other imaging modalities - skin, - retina Other sound modalities - audible lung sounds
Image analysis in therapy planning	Therapy planning in - Neuro-oncology - radiation therapy - In vitro fertilisation

	Prediction of outcomes - after surgery - in diabetes care Nursing home admission risk
Building large language models with corpora in Norwegian	NorwAl
Application of large language models	Building an emergency call simulator Sepsis: Assessing the outcome of written therapy

advice

the patient

in-hospital

in nursing homes

Continuous monitoring and assessment of the state of

while at home (population health)

Extracting outcome data from the patients EHR

https://soknad.rekportalen.no/#/prosjektbibliotek/prosjektregister2

Applications within Personalised medicine

Decision support in virtualised care

Analyses of a large number of discrete data for decision

support

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end of presentation