

# Promoting Decision-Making Autonomy Through Reflection

Simon WS Fischer

FAccTRec

14-10-2024



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## Voorspelling voor patiënt i

Responder (ODI  $\leq$  22)



Non-Responder (ODI  $\geq$  41)



### Disclaimer

De informatie in dit scherm is bedoeld als indicatie voor triage. De onderliggende predictiemodellen zijn gebaseerd op PROMs data van een historisch cohort.

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# Automation Bias in Mammography: The Impact of Artificial Intelligence BI-RADS Suggestions on Reader Performance

Thomas Dratsch, MD\* • Xue Chen, MD\* • Mohammad Rezazade Mebrizi, PhD • Roman Kloeckner, MD •  
Aline Mähringer-Kunz, MD • Michael Püsken, MD • Bettina Baeßler, MD • Stephanie Sauer, MD •  
David Maintz, MD • Daniel Pinto dos Santos, MD

nature  
medicine

LETTERS

<https://doi.org/10.1038/s41591-020-0942-0>



## Human-computer collaboration for skin cancer recognition

Philipp Tschandl<sup>1,17</sup>, Christoph Rinner<sup>2,17</sup>, Zoe Apalla<sup>3</sup>, Giuseppe Argenziano<sup>4</sup>, Noel Codella<sup>5</sup>,  
Allan Halpern<sup>6</sup>, Monika Janda<sup>7</sup>, Aimilios Lallas<sup>3</sup>, Caterina Longo<sup>8,9</sup>, Josep Malvehy<sup>10,11</sup>, John Paoli<sup>12,13</sup>,  
Susana Puig<sup>10,11</sup>, Cliff Rosendahl<sup>14</sup>, H. Peter Soyer<sup>15</sup>, Iris Zalaudek<sup>16</sup> and Harald Kittler<sup>1</sup>✉

## Intelligent decision support in medical triage: are people robust to biased advice?

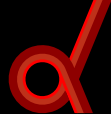
Journal of  
Public Health

Birgit van der Stigchel<sup>1</sup>, Karel van den Bosch<sup>1</sup>, Jurriaan van Diggelen<sup>1</sup>, Pim Haselager<sup>2</sup>

<sup>1</sup>TNO, Human Machine Teaming, Soesterberg, NL, The Netherlands

<sup>2</sup>Donders Centre for Neuroscience, Nijmegen, Gelderland, NL, The Netherlands

Address correspondence to van der Stigchel Birgit, E-mail: [birgit.vanderstigchel@tno.nl](mailto:birgit.vanderstigchel@tno.nl)



# Automation Bias in Mammography: The Impact of Artificial Intelligence BI-RADS Suggestions on Reader Performance

Thomas Dratsch, MD\* • X  
Aline Mähringer-Kunz, MD  
David Maintz, MD • Dan

From the Institute of Diagnostic and Interventional Radiology, University of Tübingen, Germany (T.D., X.C., M.P., D.M., D.B.); and the Institute of Radiology, University of Groningen, Netherlands (M.R.M.); Institute of Int

SSRN

## Generative AI Can Harm Learning

Hamsa Bastani,<sup>1\*</sup> Osbert Bastani,<sup>2\*</sup> Alp Sungu,<sup>1\*†</sup>  
Haosen Ge,<sup>3</sup> Özge Kabakcı,<sup>4</sup> Rei Mariman

<sup>1</sup>Operations, Information and Decisions, University of Pennsylvania

<sup>2</sup>Computer and Information Science, University of Pennsylvania

<sup>3</sup>Wharton AI & Analytics, University of Pennsylvania

<sup>4</sup>Budapest British International School

Intelligent decision support in medical triage: are people  
robust to biased advice?

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<sup>1</sup>TNO, Human Machine Teaming, Soesterberg, NL, The Netherlands

<sup>2</sup>Donders Centre for Neuroscience, Nijmegen, Gelderland, NL, The Netherlands

Address correspondence to van der Stigchel Birgit, E-mail: birgit.vanderstigchel@tno.nl



## Research Question

How to calibrate reliance on machine recommendations?



## **EU AI ACT Article 14 Human Oversight**

“remain aware of the possible tendency of automatically relying or over-relying on the output”

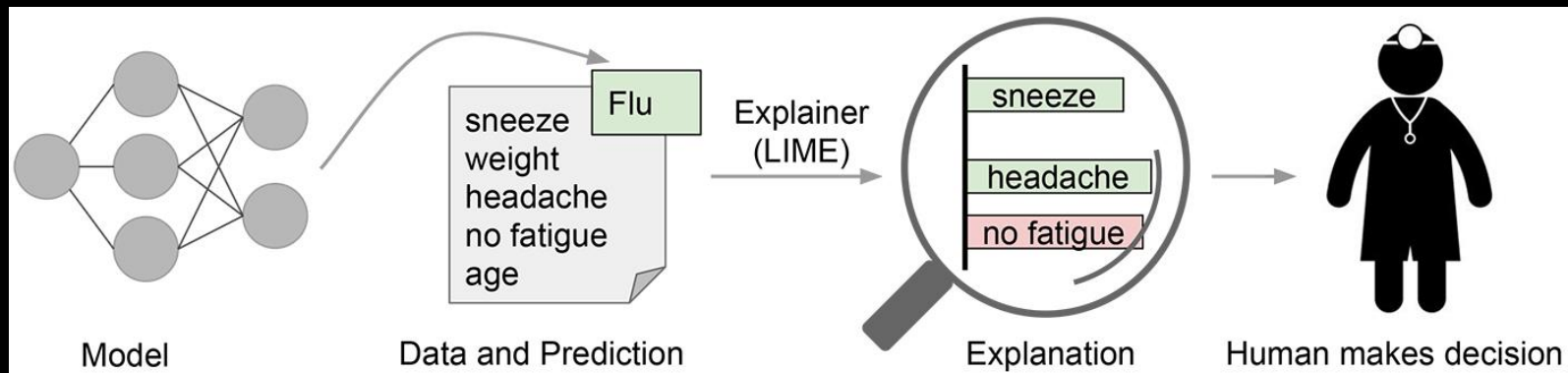
## **EU HLEG Trustworthy AI**

First requirement: human agency and oversight

“Users should be able to make informed autonomous decisions regarding AI systems.”



# Explainable AI





# Moral Decision Making in Human-Agent Teams: Human Control and the Role of Explanations



Jasper van der Waa<sup>1,2\*</sup>, Sabine Verdult<sup>3</sup>, Karel van den Bosch<sup>3</sup>, Jurriaan van Diggelen<sup>1</sup>, Tjalling Haije<sup>1</sup>, Birgit van der Stigchel<sup>1,4</sup> and Ioana Cocu<sup>1</sup>

<sup>1</sup>Perceptual and Cognitive Systems, TNO, Soesterberg, Netherlands, <sup>2</sup>Interactive Intelligence, Technical University Delft, Delft, Netherlands, <sup>3</sup>Training and Performance Innovations, TNO, Soesterberg, Netherlands, <sup>4</sup>Artificial Intelligence, Radboud University, Nijmegen, Nijmegen, Netherlands

## ARTICLE

## Open Access

Translational  
Psychiatry

## How machine-learning recommendations influence clinician treatment selections: the example of antidepressant selection

Maia Jacobs<sup>1</sup>, Melanie F. Pradier<sup>1</sup>, Thomas H. McCoy Jr.<sup>2,3</sup>, Roy H. Perlis<sup>2,3</sup>, Finale Doshi-Velez<sup>1</sup> and Krzysztof Z. Gajos<sup>1</sup>

## Does the Whole Exceed its Parts? The Effect of AI Explanations on Complementary Team Performance



Gagan Bansal\*  
bansalg@cs.washington.edu  
University of Washington

Tongshuang Wu\*  
wtshuang@cs.washington.edu  
University of Washington

Joyce Zhou<sup>†</sup>  
jyzhou15@cs.washington.edu  
University of Washington

Raymond Fok<sup>†</sup>  
rayfok@cs.washington.edu  
University of Washington

Besmira Nushi  
besmira.nushi@microsoft.com  
Microsoft Research

Ece Kamar  
eckamar@microsoft.com  
Microsoft Research

Marco Tulio Ribeiro  
marcotcr@microsoft.com

Daniel S. Weld  
weld@cs.washington.edu

# To Trust or to Think: Cognitive Forcing Functions Can Reduce Overreliance on AI in AI-assisted Decision-making

ZANA BUÇINCA, Harvard University, USA

MAJA BARBARA MALAYA, Lodz University of Technology, Poland

KRZYSZTOF Z. GAJOS, Harvard University, USA



## Explainable AI is Dead, Long Live Explainable AI!

Hypothesis-driven Decision Support using Evaluative AI

Tim Miller

tmiller@unimelb.edu.au

The University of Melbourne  
Melbourne, VIC, Australia



## Let Me Think! Investigating the Effect of Explanations Feeding Doubts About the AI Advice



Federico Cabitza<sup>1,2(✉)</sup>, Andrea Campagner<sup>2</sup>, Lorenzo Famiglini<sup>1</sup>,  
Chiara Natali<sup>1</sup>, Valerio Caccavella<sup>3</sup>, and Enrico Gallazzi<sup>3</sup>

## Don't Just Tell Me, Ask Me: AI Systems that Intelligently Frame Explanations as Questions Improve Human Logical Discernment Accuracy over Causal AI explanations

Valdemar Danry

MIT Media Lab, Massachusetts Institute of Technology  
Cambridge, Massachusetts, United States  
vdanry@media.mit.edu

Yaoli Mao

Columbia University  
New York City, New York, United States  
ym2429@tc.columbia.edu

Pat Pataranutaporn

MIT Media Lab, Massachusetts Institute of Technology  
Cambridge, Massachusetts, United States  
patpat@media.mit.edu

Pattie Maes

MIT Media Lab, Massachusetts Institute of Technology  
Cambridge, Massachusetts, United States  
pattie@media.mit.edu







ARTICLE

## Reflection Machines: Supporting Effective Human Oversight Over Medical Decision Support Systems

Pim Haselager<sup>1\*</sup>, Hanna Schraffenberger<sup>2</sup>, Serge Thill<sup>1</sup>, Simon Fischer<sup>1</sup> , Pablo Lanillos<sup>1</sup>,  
Sebastiaan van de Groes<sup>3</sup> and Miranda van Hooff<sup>3,4</sup>

## Questioning AI: Promoting Decision-Making Autonomy Through Reflection

Simon W.S. Fischer

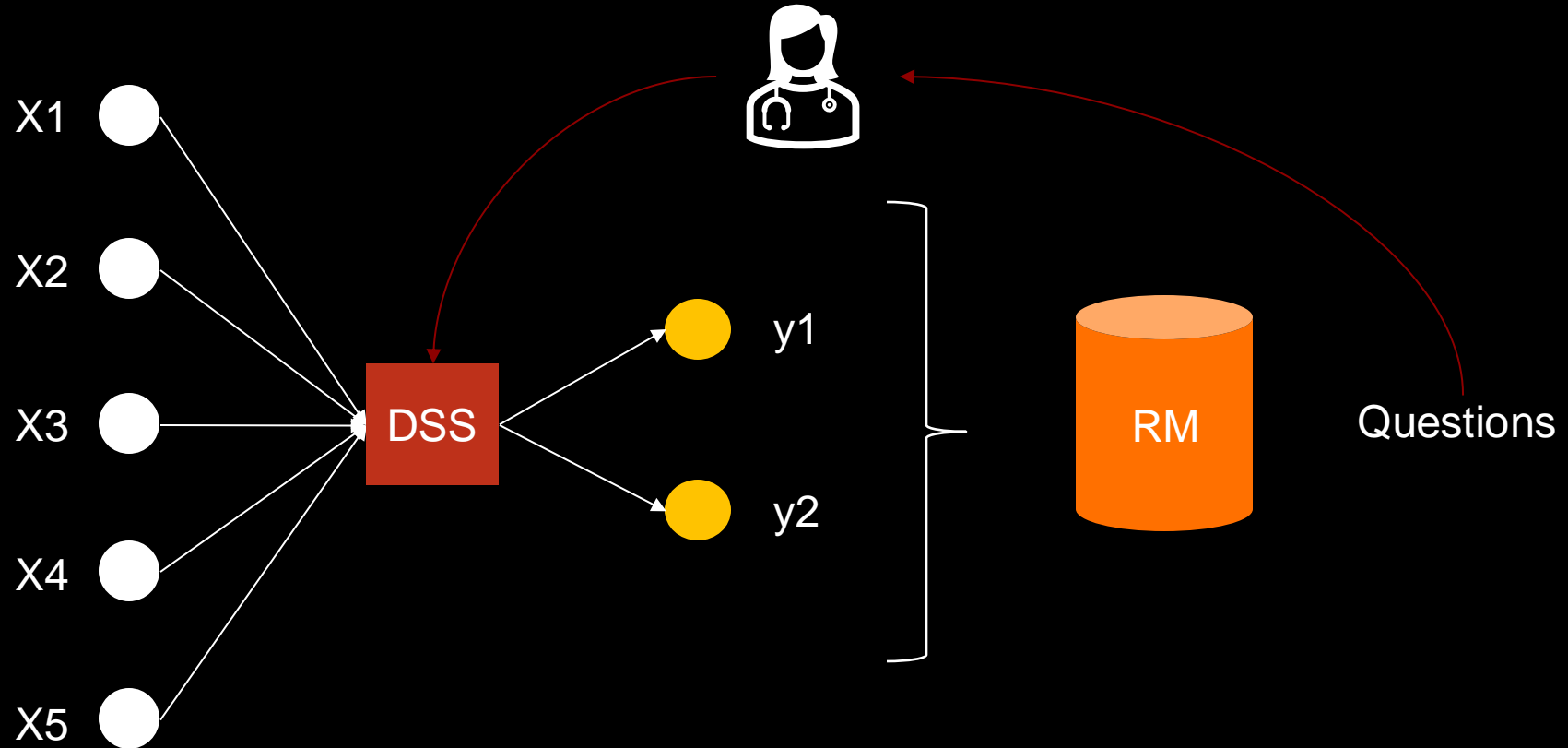
simon.fischer@donders.ru.nl

Donders Institute for Brain, Cognition, and Behaviour  
Nijmegen, Netherlands





## Decision-Support System + Reflection Machine





## Types of Questions

### Causal dependency

- How does outcome  $Y$  follow from data point  $x$
- Why not option  $B$  given  $z$

### Relevance

- Is data point  $x$  relevant to focus on?

### Counterfactual

- Would you recommend the same option if data  $x$  were different?



## Types of Questions – Cont.

### Model up-to-dateness

- Did you consider factor  $x$ , which is not included in the DSS?

### Expertise

- Does the recommendation align with your assumptions? If not, why not?

### Hypothetical Scenarios

- Is it possible to quit smoking? If so, this would affect the outcome by 25%.



## Aim

Elicit certain behaviour through engagement

- Critical reflection
- Proactive care

## Affects

- Decision-autonomy
- Self-efficacy





## Open Considerations

- How often to ask
- Tailor questions to the expertise of decision-maker
- Questions from the patient's perspective
- Process answers



## Hypothesis

Questions raise doubt – where necessary – and stimulate deliberation.

This forward-looking approach calibrates reliance on machine recommendations.

[simon.fischer@donders.ru.nl](mailto:simon.fischer@donders.ru.nl)