

HEADLINER

Patient digital twins for personalised medicine



Dr Darren Gates

Clinical Innovation Consultant

Alder Hey Innovation Service

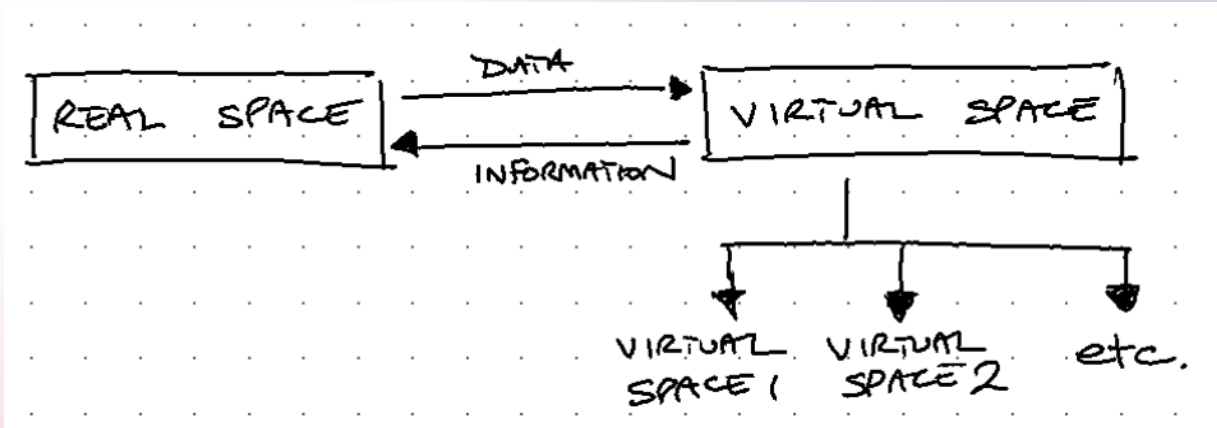
Consultant Paediatric Intensivist

Alder Hey Children's Hospital

Patient digital twins for personalised medicine

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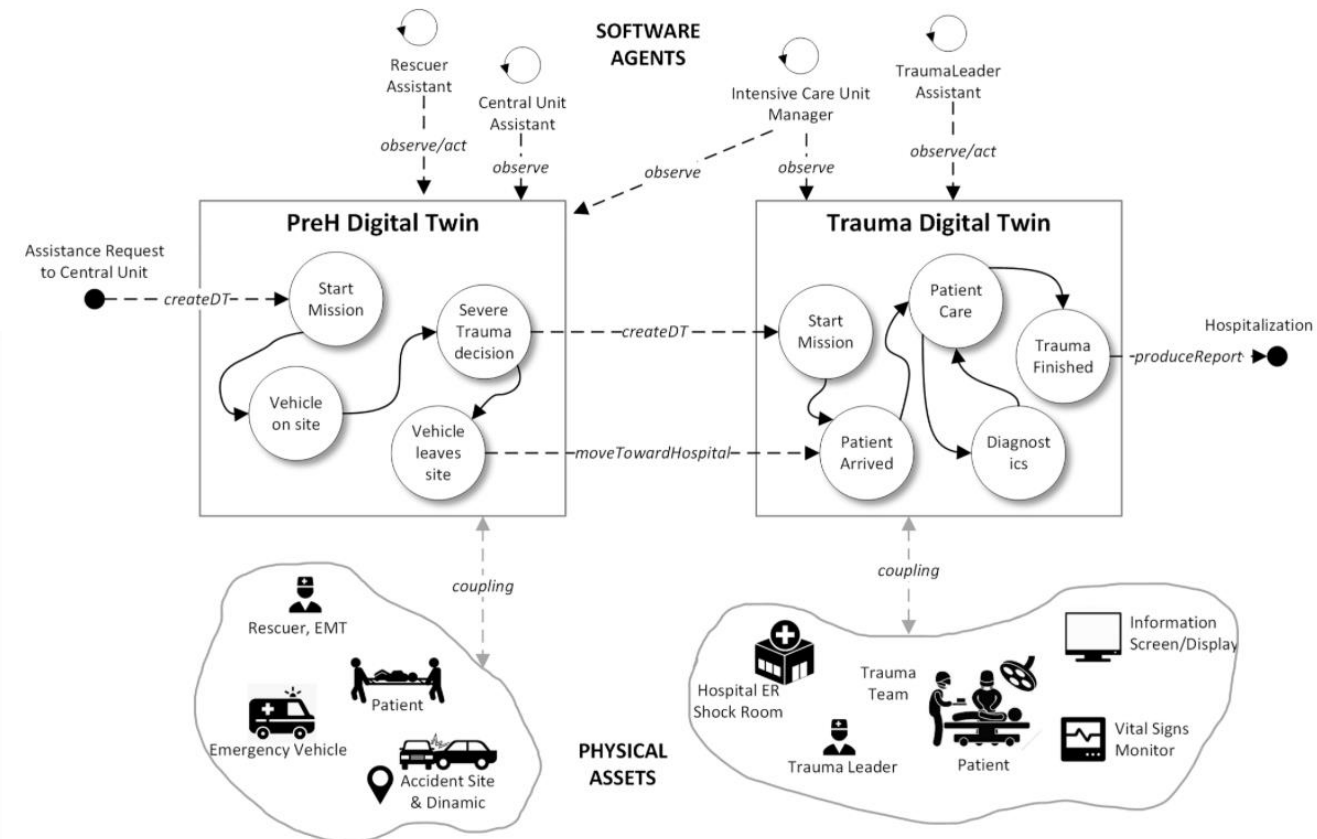
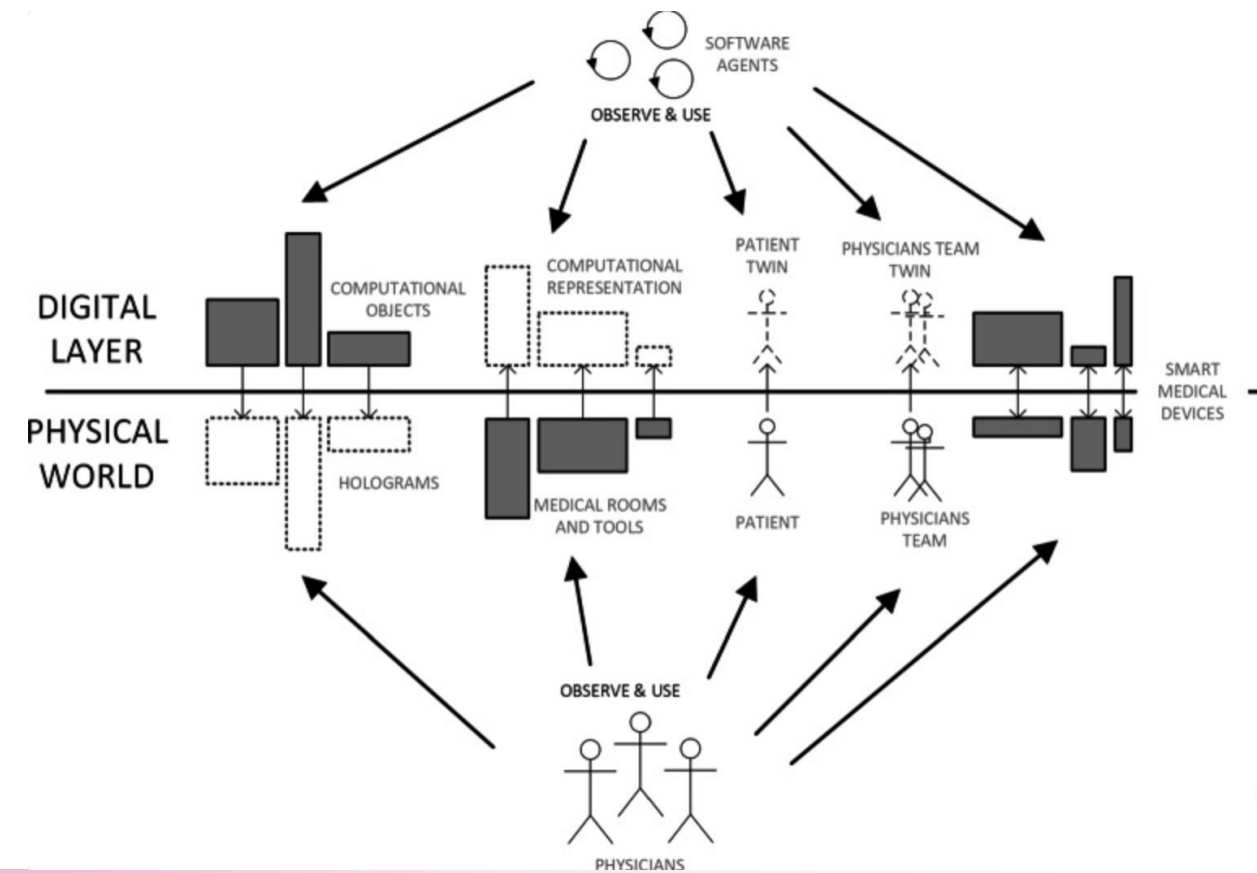
Consultant Paediatric Intensivist
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- close monitoring of time-varying physical asset
- precursors = virtual and simulated models
- wide application across industries
 - anomaly detection
 - predictive maintenance
 - early intervention
 - optimisation
 - ‘what-if’ simulation

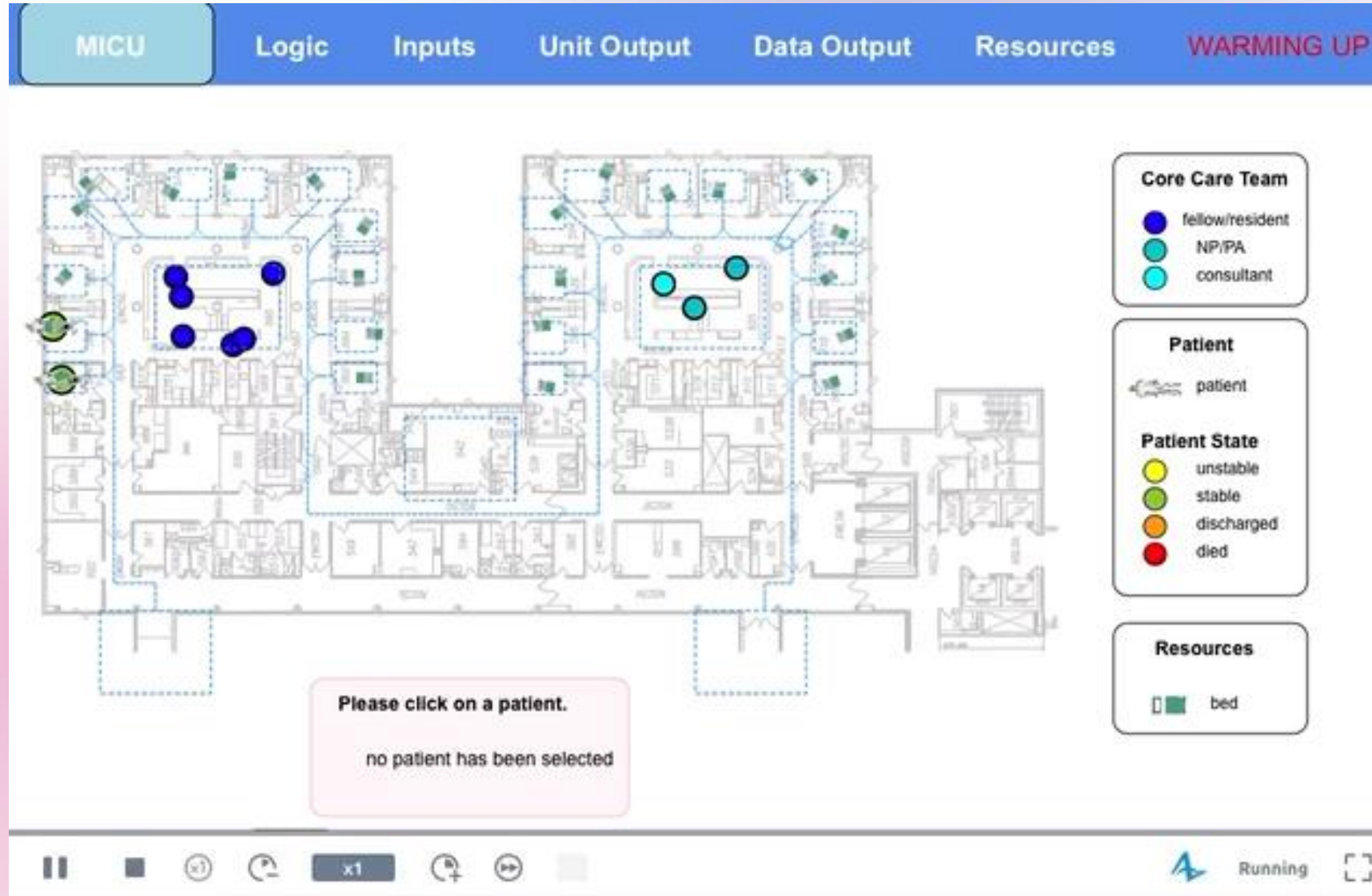
‘a digital twin is a virtual representation of real-world entities and processes, synchronised at a specified frequency and fidelity’

data + a model + update



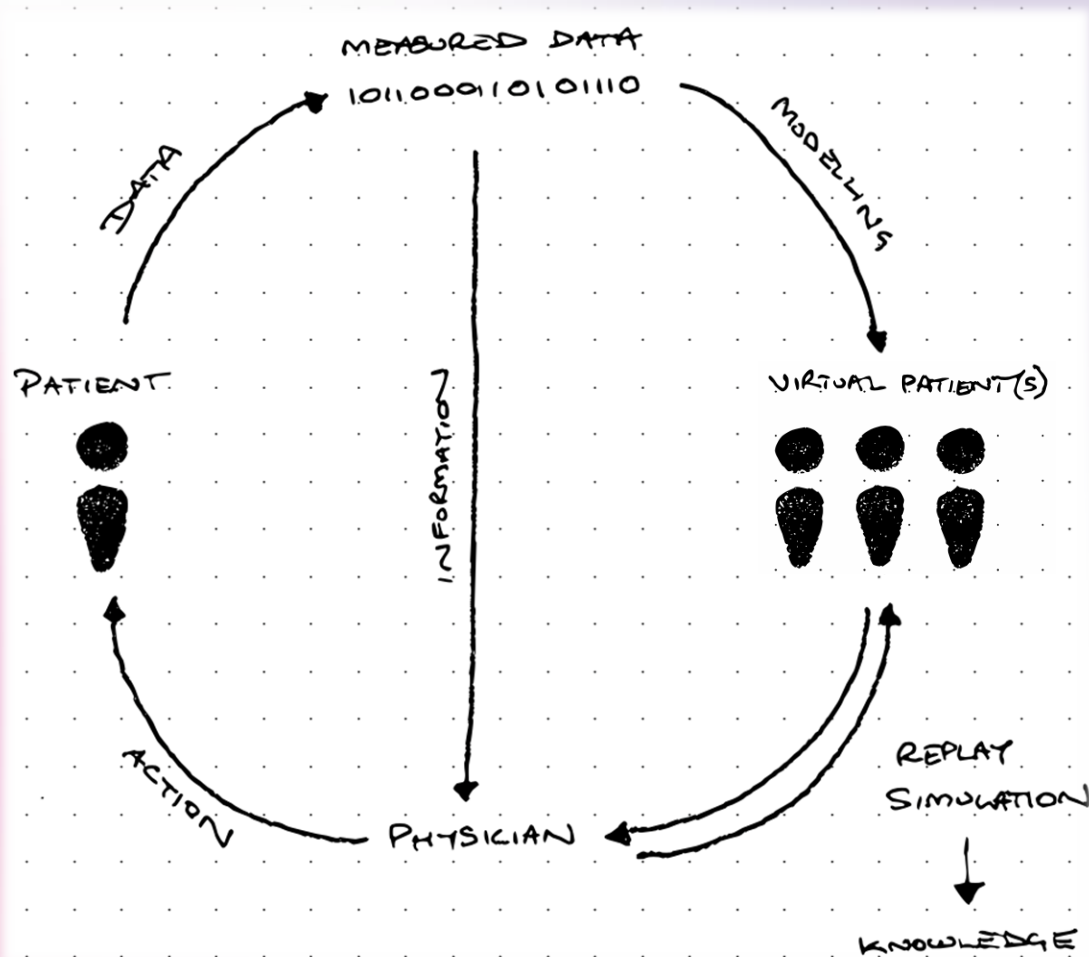
Croatti, A., Gabellini, M., Montagna, S. et al. On the Integration of Agents and Digital Twins in Healthcare. *J Med Syst* 44, 161 (2020). <https://doi.org/10.1007/s10916-020-01623-5>

A conceptual representation of the involved digital twins for the trauma management process



X Zhong et al. A multidisciplinary approach to the development of digital twin models of critical care delivery in intensive care units. *International journal of Production Research*. Dec 2021
MUSC ICU

Patient 'avatars'



- patient state
- patient trajectory
- Risk scores
- Smart alerts
- Alternative diagnosis
- Similar patient correlation

What Should We Remember?



- Confirmation bias
- Semmelweis effect
- Availability heuristic
- Illusory correlation
- Dichotomous thinking
- Anchoring
- Etc.

Need To Act Fast

Patient 'avatars'

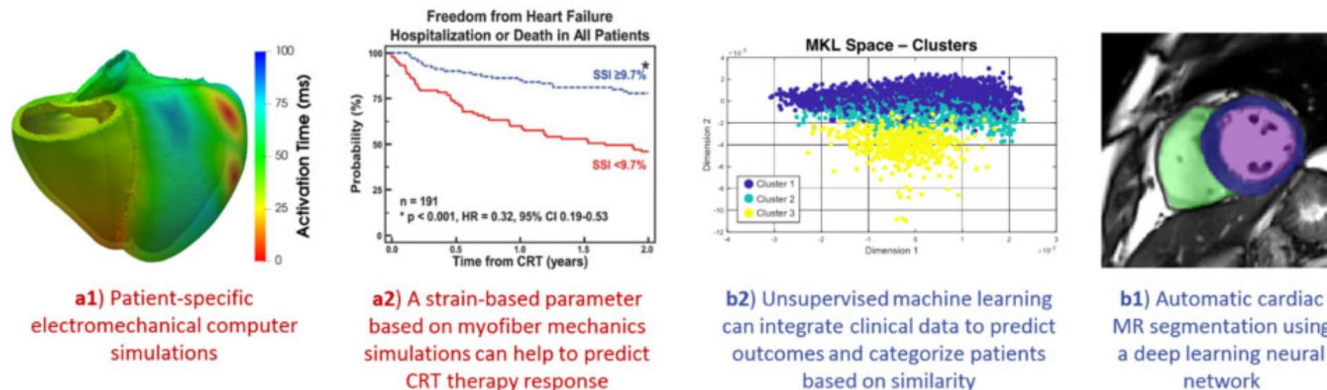
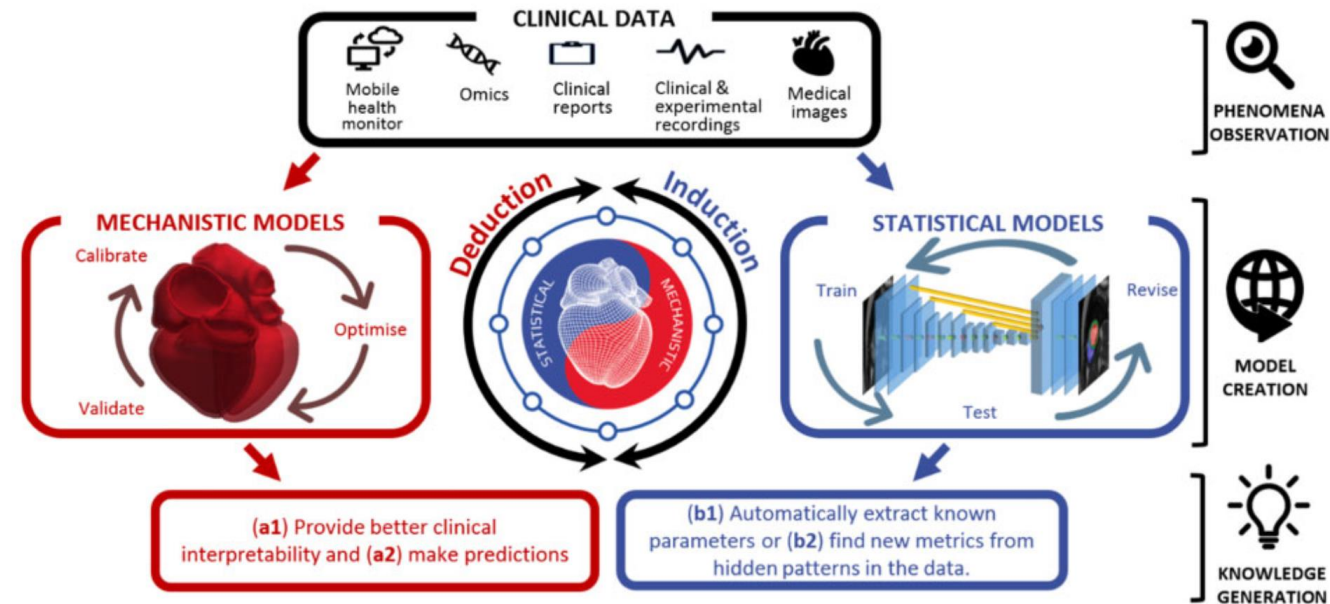
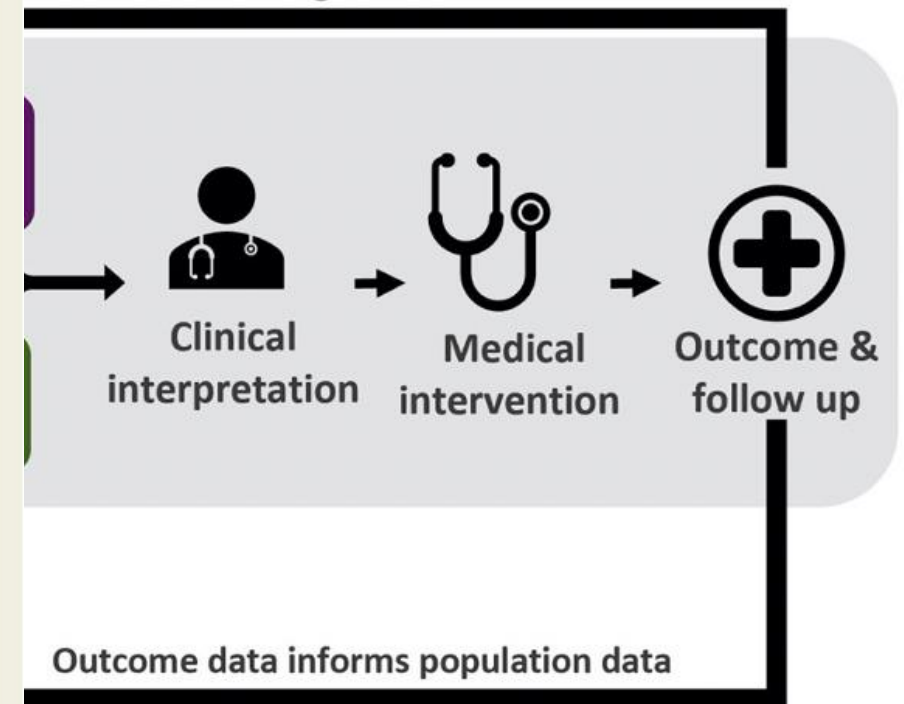


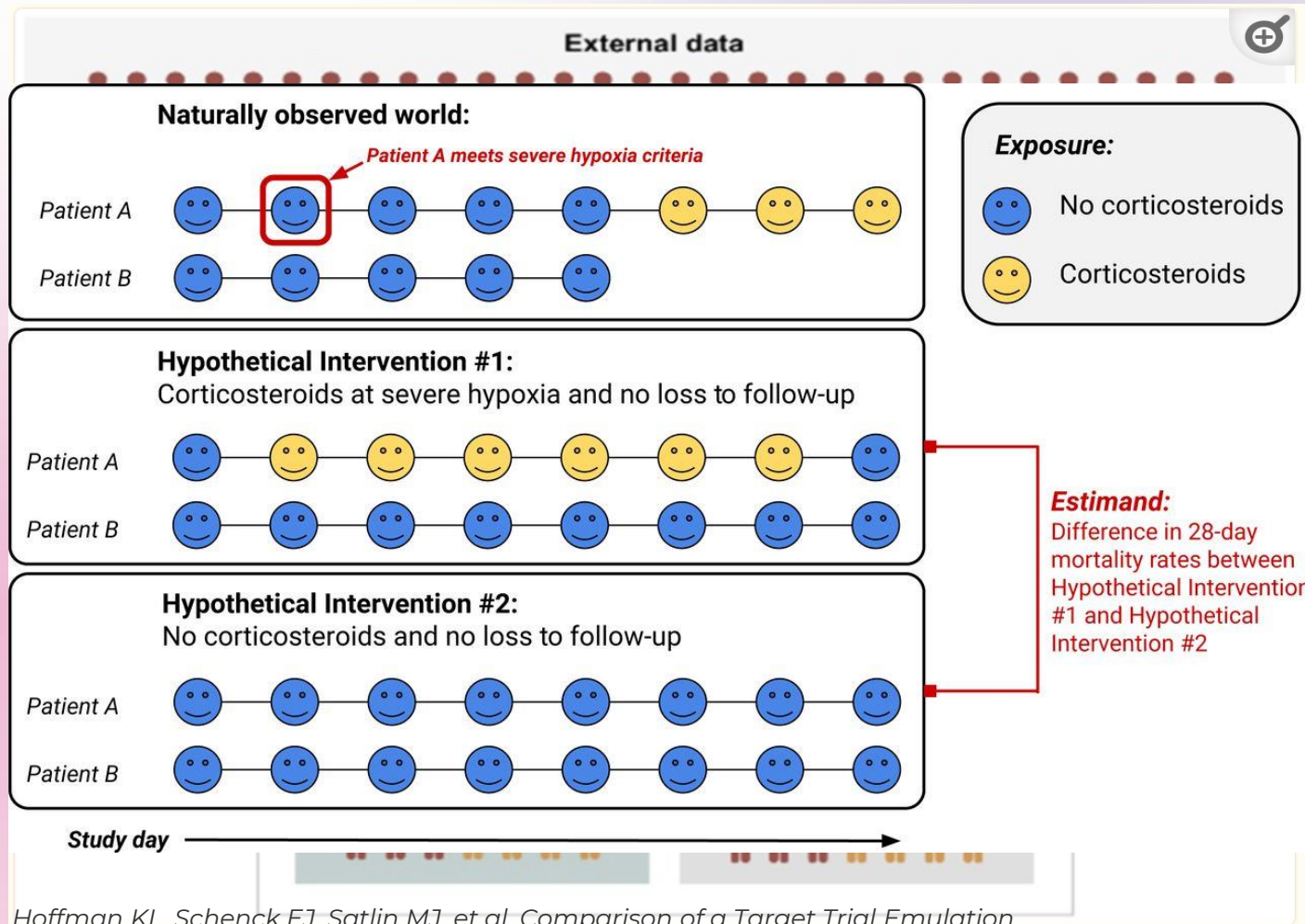
Figure 1 The two pillars of the digital twin, mechanistic and statistical models, illustrating its construction and four examples of use: **a1**,¹⁰ **a2**,¹¹ **b1**,¹² **b2**.¹³

data refines the digital twin



J. Corral-Acero et al. The digital twin to enable the vision of precision cardiology. EHJ 2020

In-silico / virtual + target trials



Synthetically generated patients: 'hypothetical patients that represent the range of human variables for a particular condition'

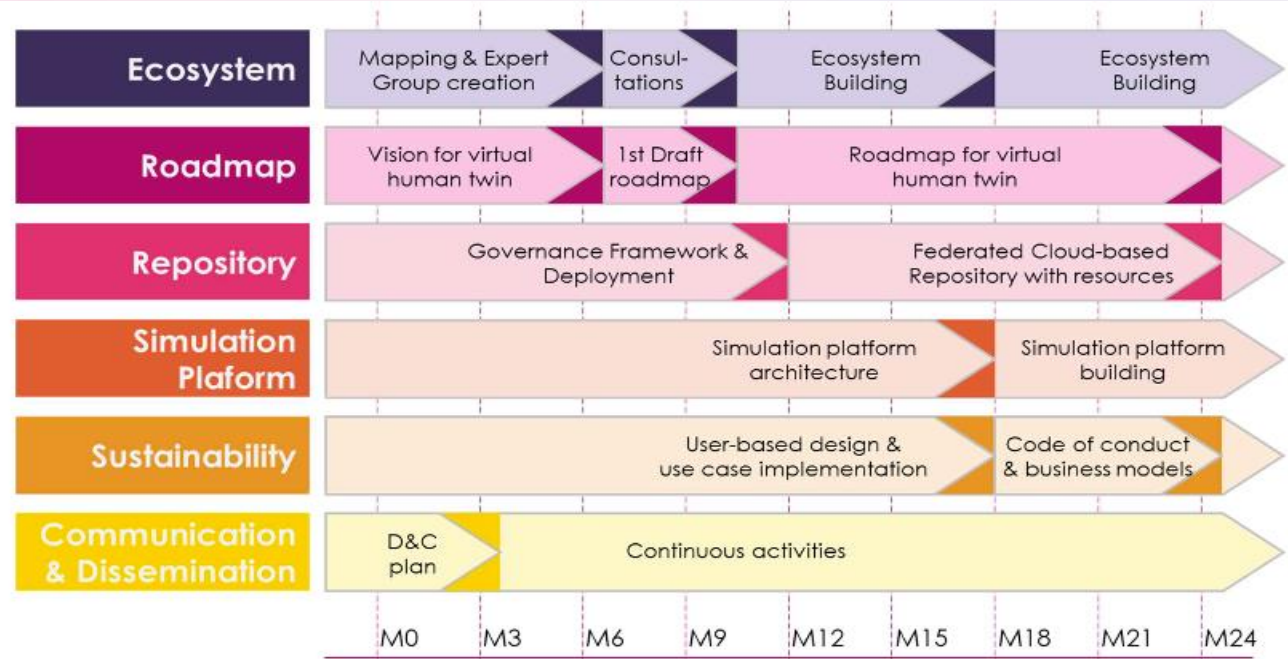
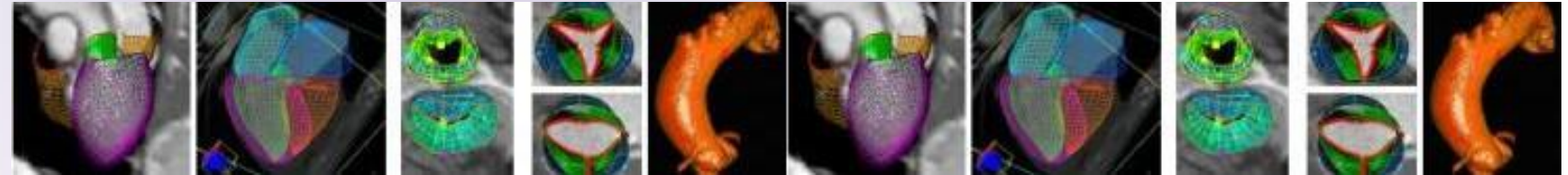


Causal inference and counterfactual prediction in machine learning for actionable healthcare

Mattia Prosperi¹, Yi Guo^{2,3}, Matt Sperrin⁴, James S. Koopman⁵, Jae S. Min¹, Xing He², Shannan Rich¹, Mo Wang⁶, Iain E. Buchan⁷ and Jiang Bian^{2,3}

Hoffman KL, Schenck EJ, Satlin MJ, et al. Comparison of a Target Trial Emulation Framework vs Cox Regression to Estimate the Association of Corticosteroids With Mortality in Severe Hypoxia. *JAMA Network Open*. 2020;3(10):e2024425. doi:10.1001/jamanetworkopen.2020.34425. PMID: 32440224; PMCID: PMC7218288.

Organ modelling












<http://www.edith-csa.eu>

Next-generation, personalised, model-based critical care medicine: a state-of-the art review of in silico virtual patient models, methods, and cohorts, and how to validation them

[J. Geoffrey Chase](#) , [Jean-Charles Preiser](#), [Jennifer L. Dickson](#), [Antoine Pironet](#), [Yeong Shiong Chiew](#), [Christopher G. Pretty](#), [Geoffrey M. Shaw](#), [Balazs Benyo](#), [Knut Moeller](#), [Soroush Safaei](#), [Merryn Tawhai](#), [Peter Hunter](#) & [Thomas Desaive](#)

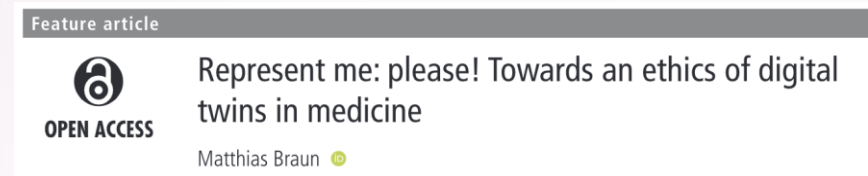
[BioMedical Engineering OnLine](#) 17, Article number: 24 (2018) | [Cite this article](#)

Digital Twins in Critical Care: What, When, How, Where, Why?

[J. Geoffrey Chase](#) * , [Cong Zhou](#) *, [Jennifer L. Knopp](#) *, [Geoffrey M. Shaw](#) ** , [Katharina Näswall](#) *** , [Jennifer H K Wong](#) *** , [Sanna Malinen](#) **** , [Knut Moeller](#) *⁵ , [Balazs Benyo](#) *⁶ , [Yeong Shiong Chiew](#) *⁷ , [Thomas Desaive](#) *⁸ 

Current challenges

- defining frequency / fidelity / complexity
- optimizing data streams / signal processing / unstructured data
- better mechanistic and statistical model integration
- potential coordinated models
- integration to workflow / trustworthiness / risk
- regulatory / legal
- privacy / ethics



Thank you

darren.gates@alderhey.nhs.uk

"it is a misapprehension to think that we can only begin to pick facts out of the mass of material, instead of the mass of facts all the facts"

- Sherlock Holmes