

Quantum device measurement and tuning using machine learning

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Machine learning:

M. Osborne

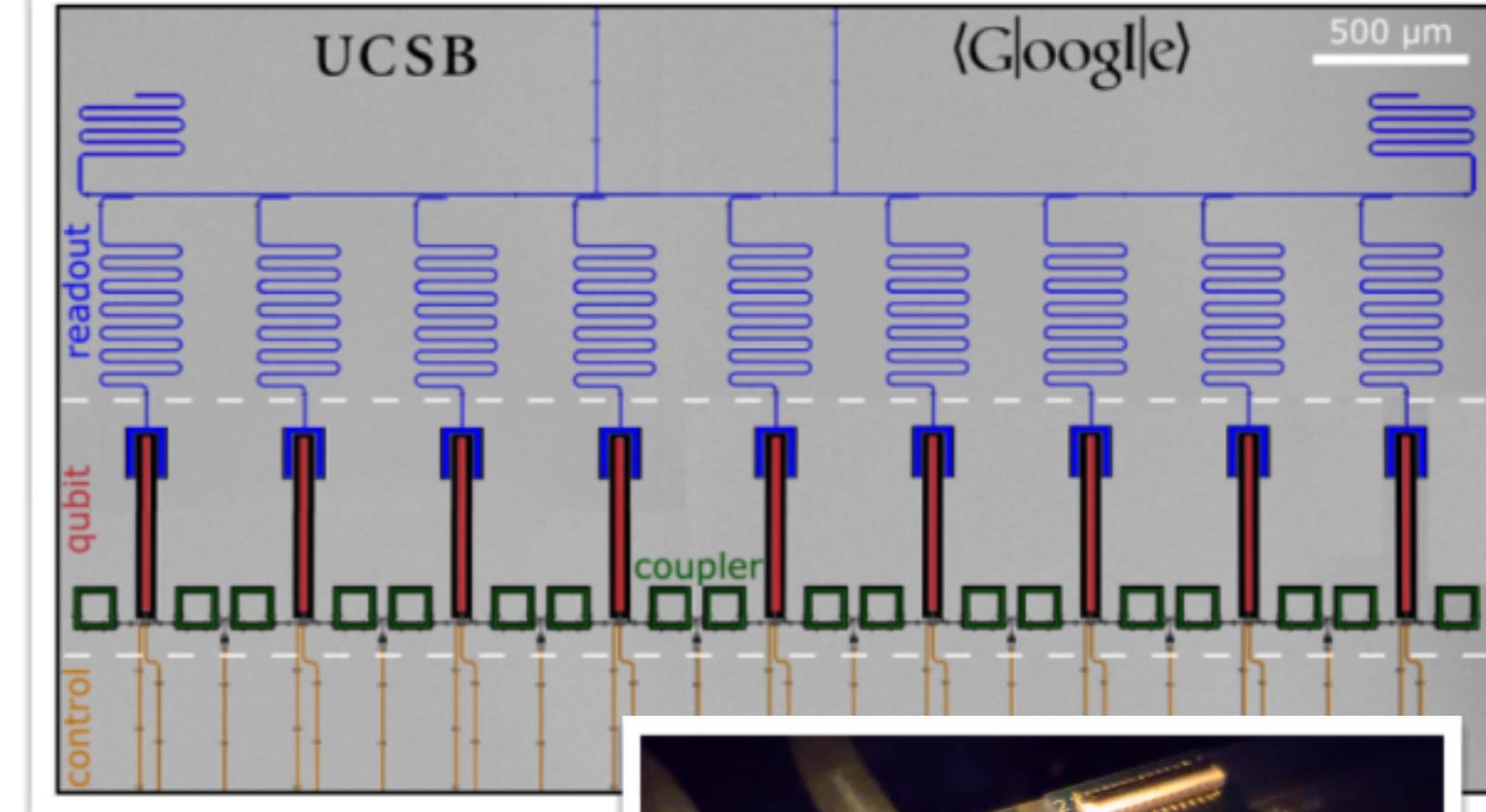
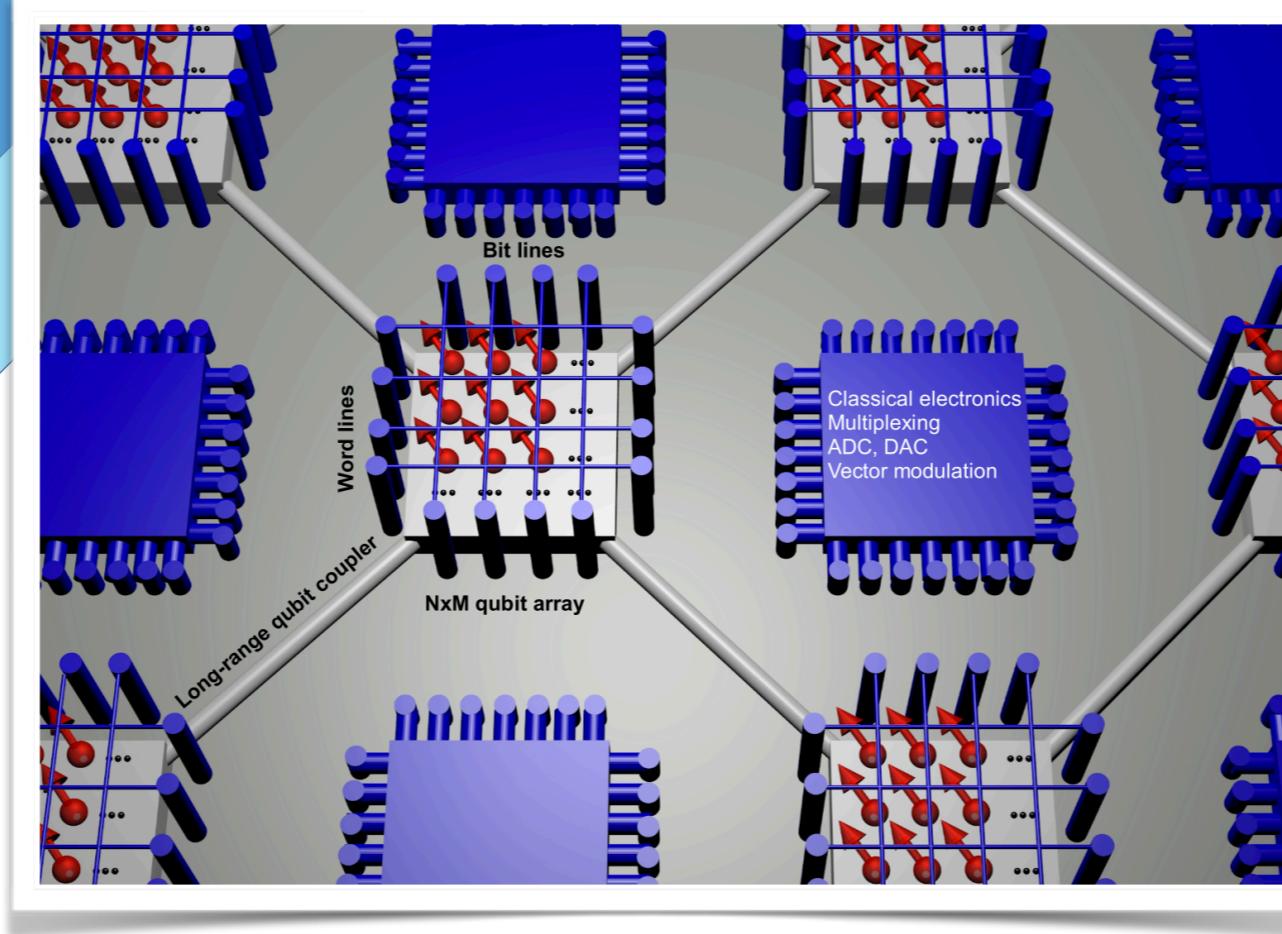
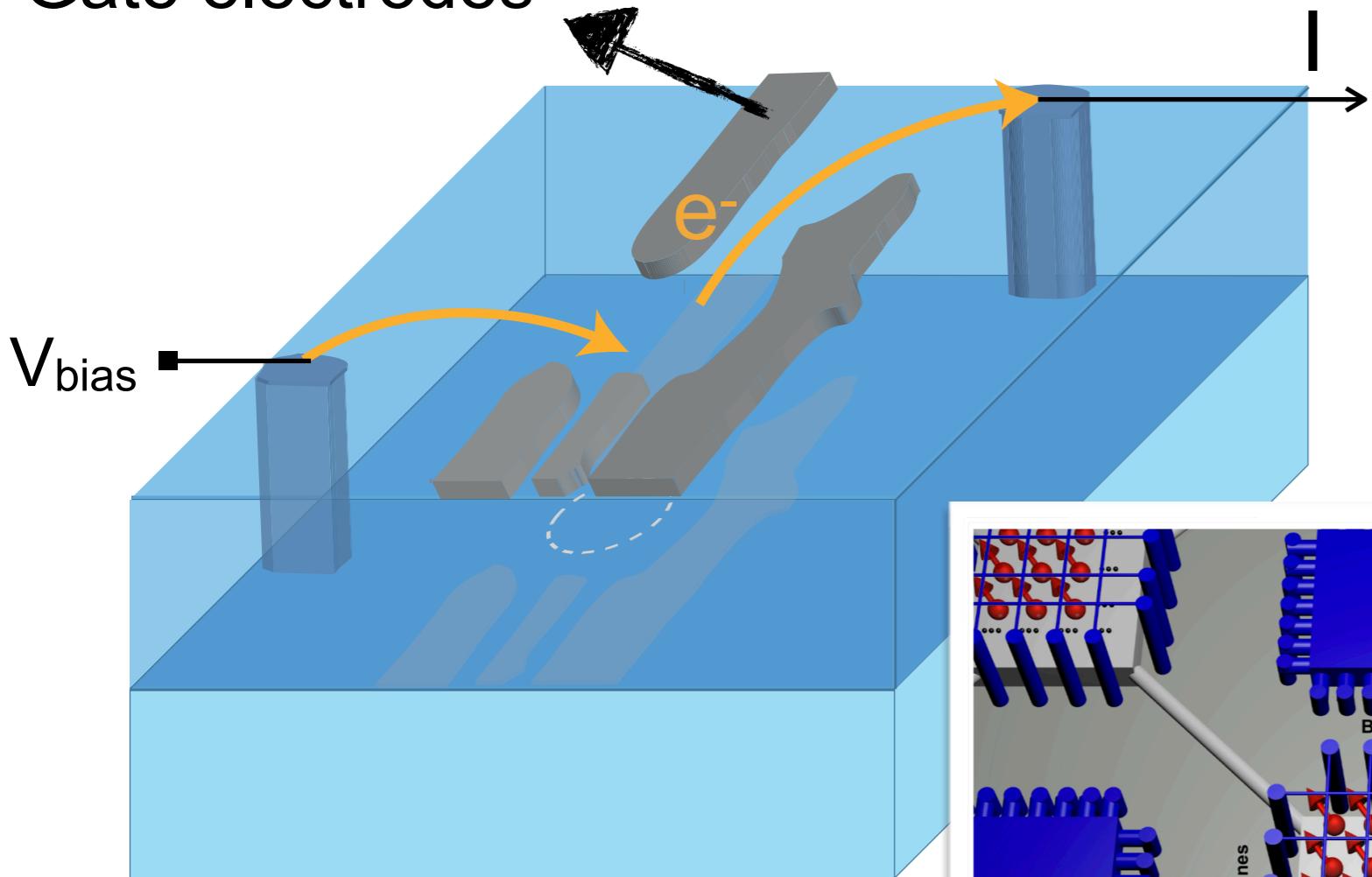
H. Moon

V. Nguyen

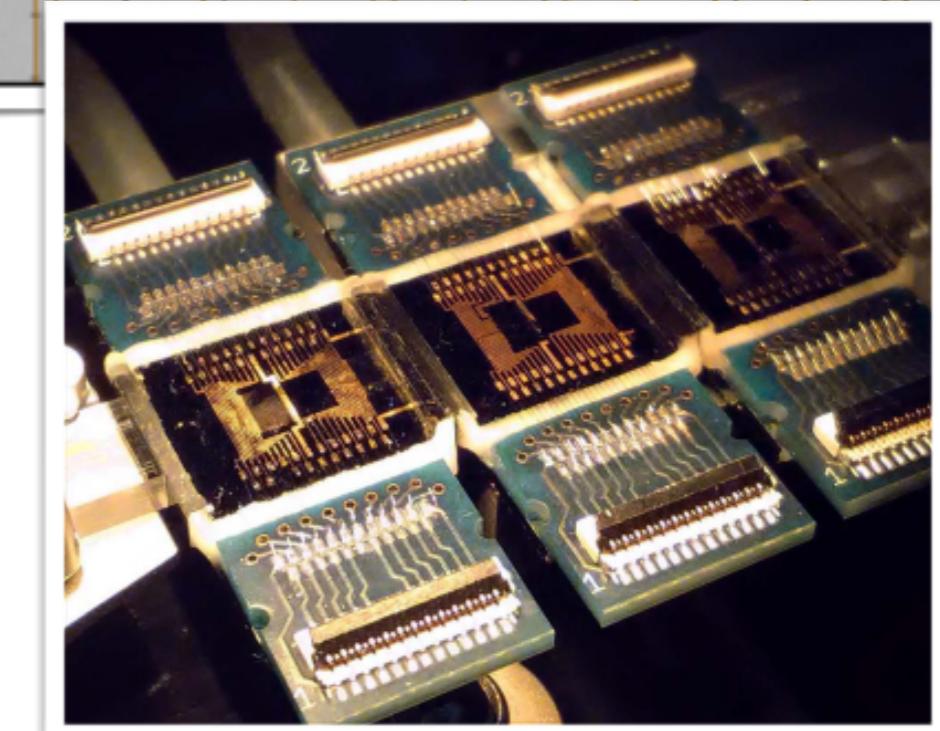


Quantum devices

Gate electrodes

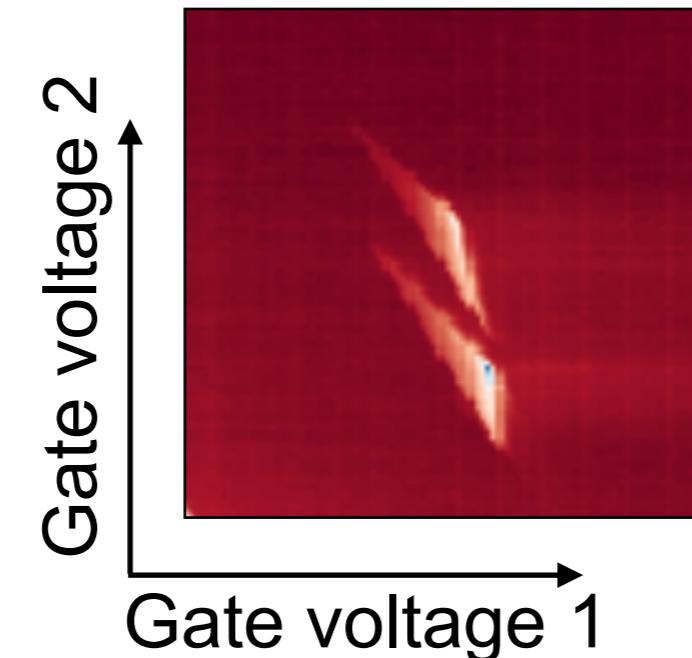
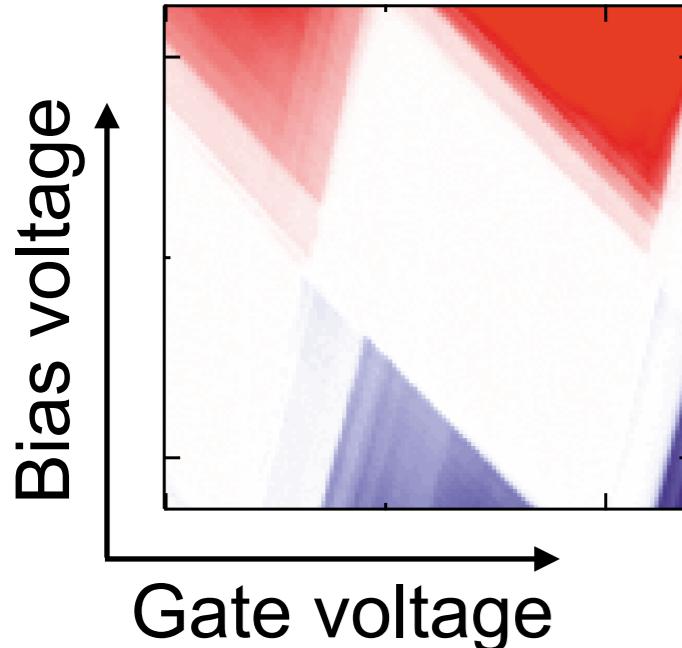


Google

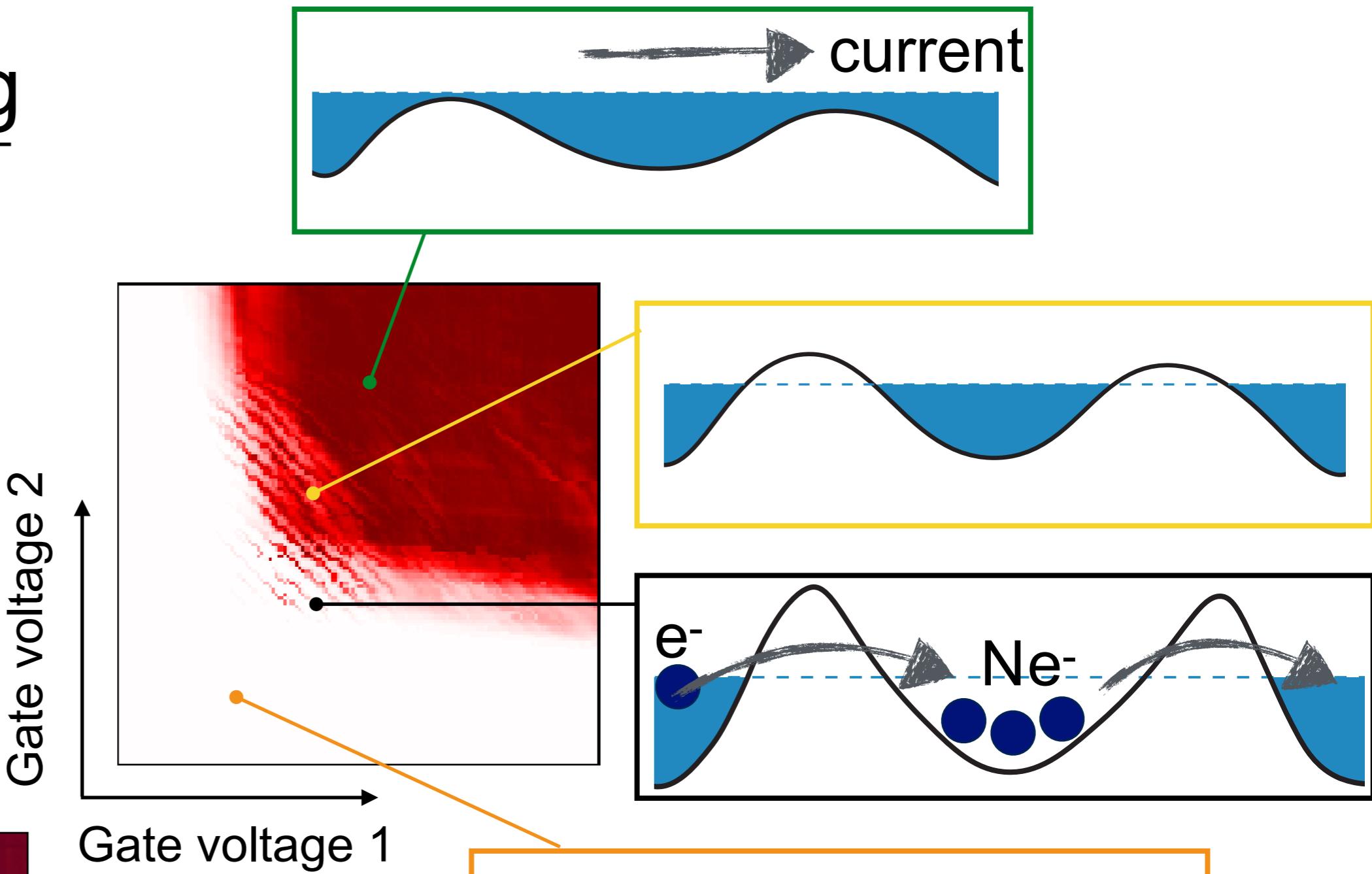


NQIT, Oxford

Measurement and tuning

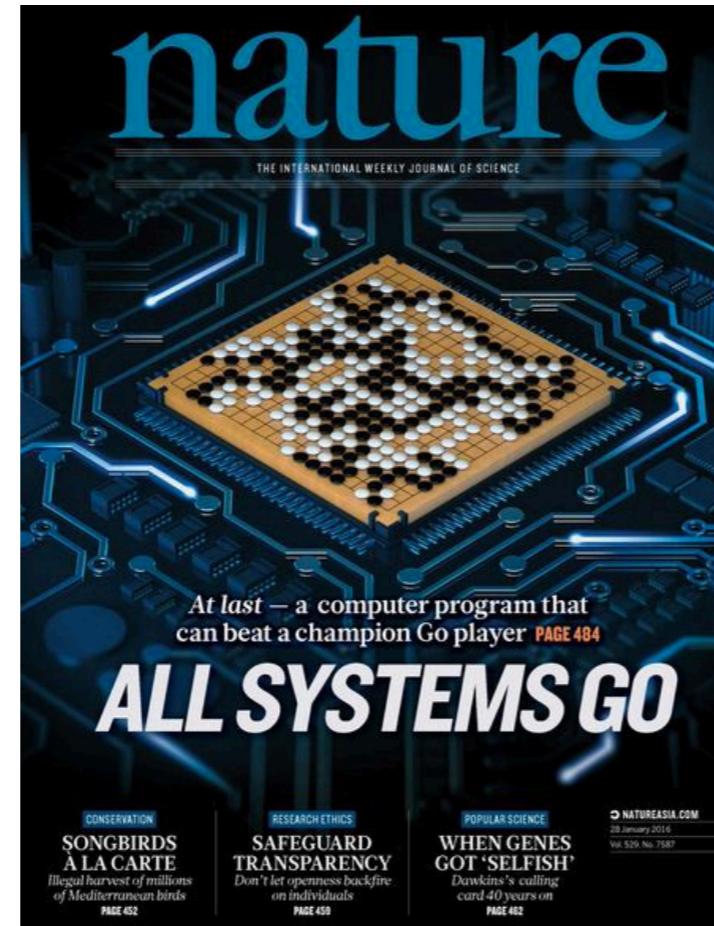
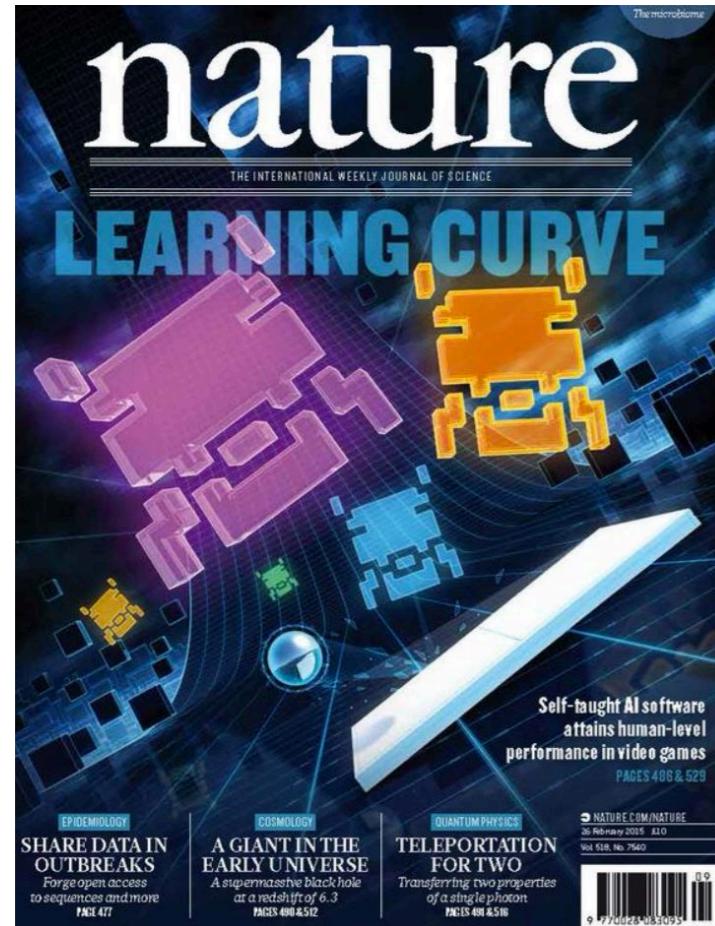


1 qubit (4 gates)
↓
4 $\times 10^{12}$ points
↓
127 years



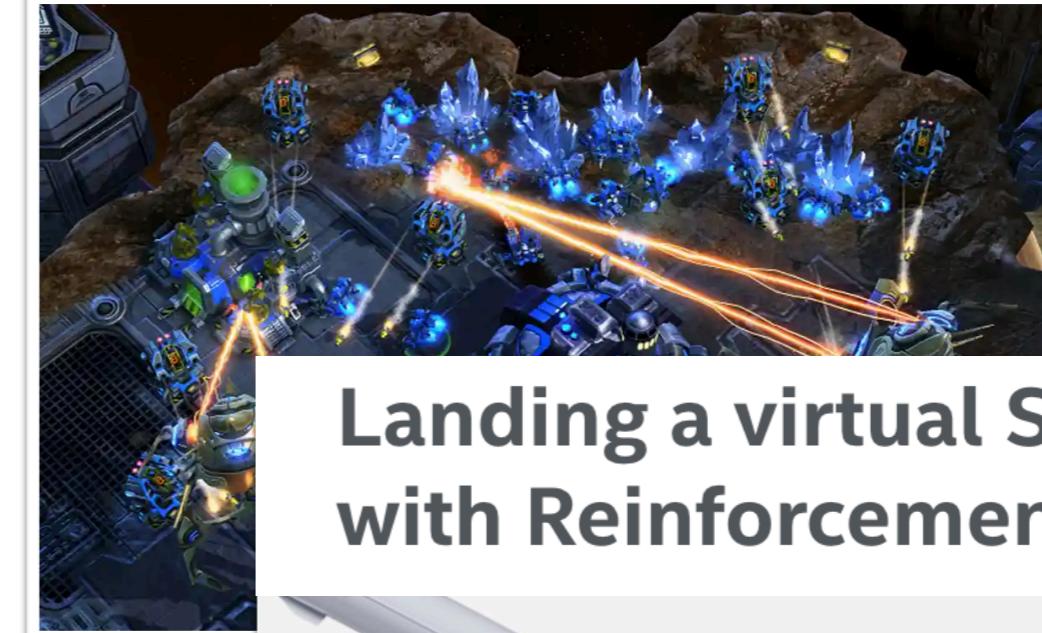
How to automate the measurement
and tuning of quantum devices?

The AI revolution



StarCraft II: DeepMind unveils latest game its AI plans to conquer

The AI research firm is teaming up with gaming company Blizzard to take on the real-time strategy game



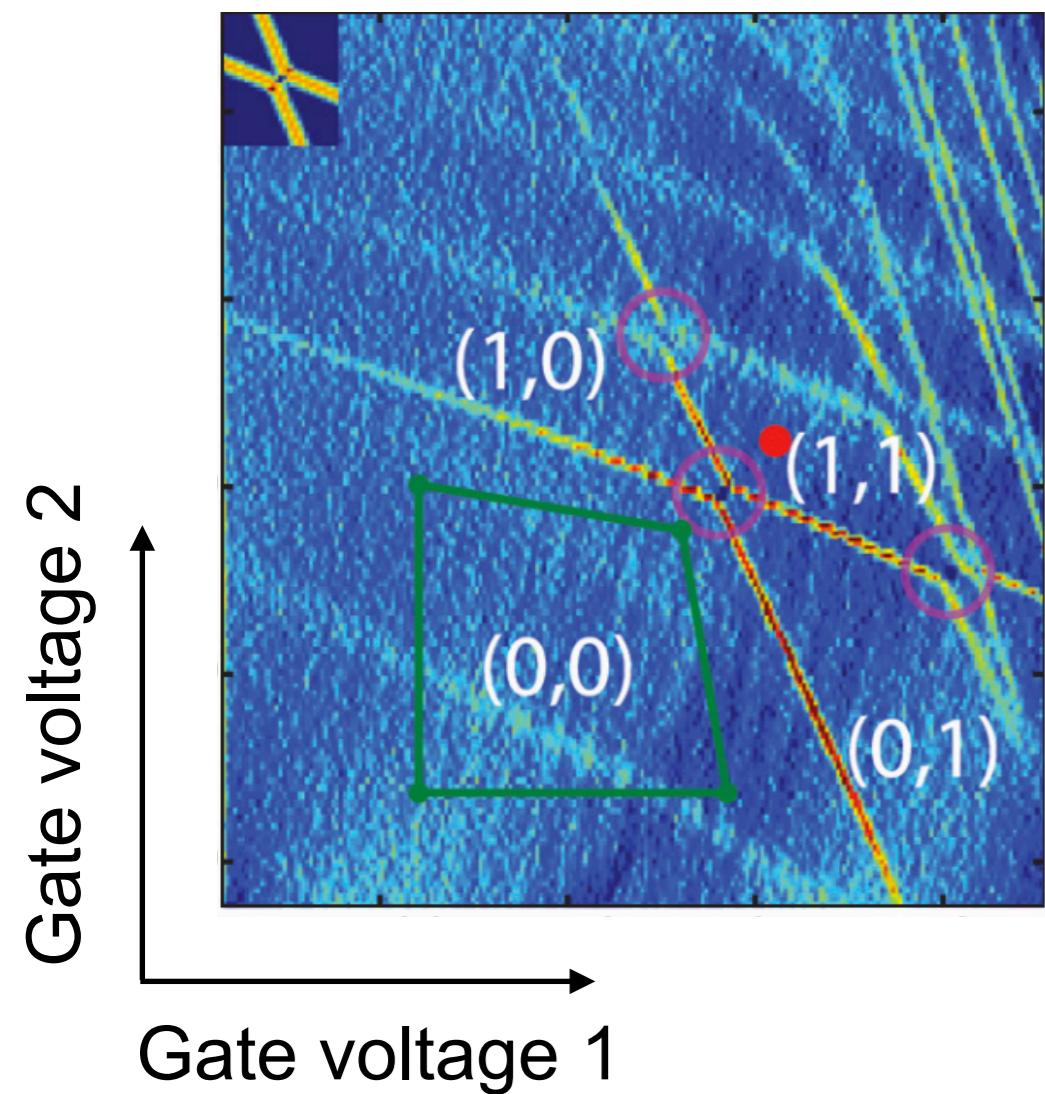
Landing a virtual SpaceX rocket with Reinforcement Learning

Big data
Massive computer power
Powerful algorithms

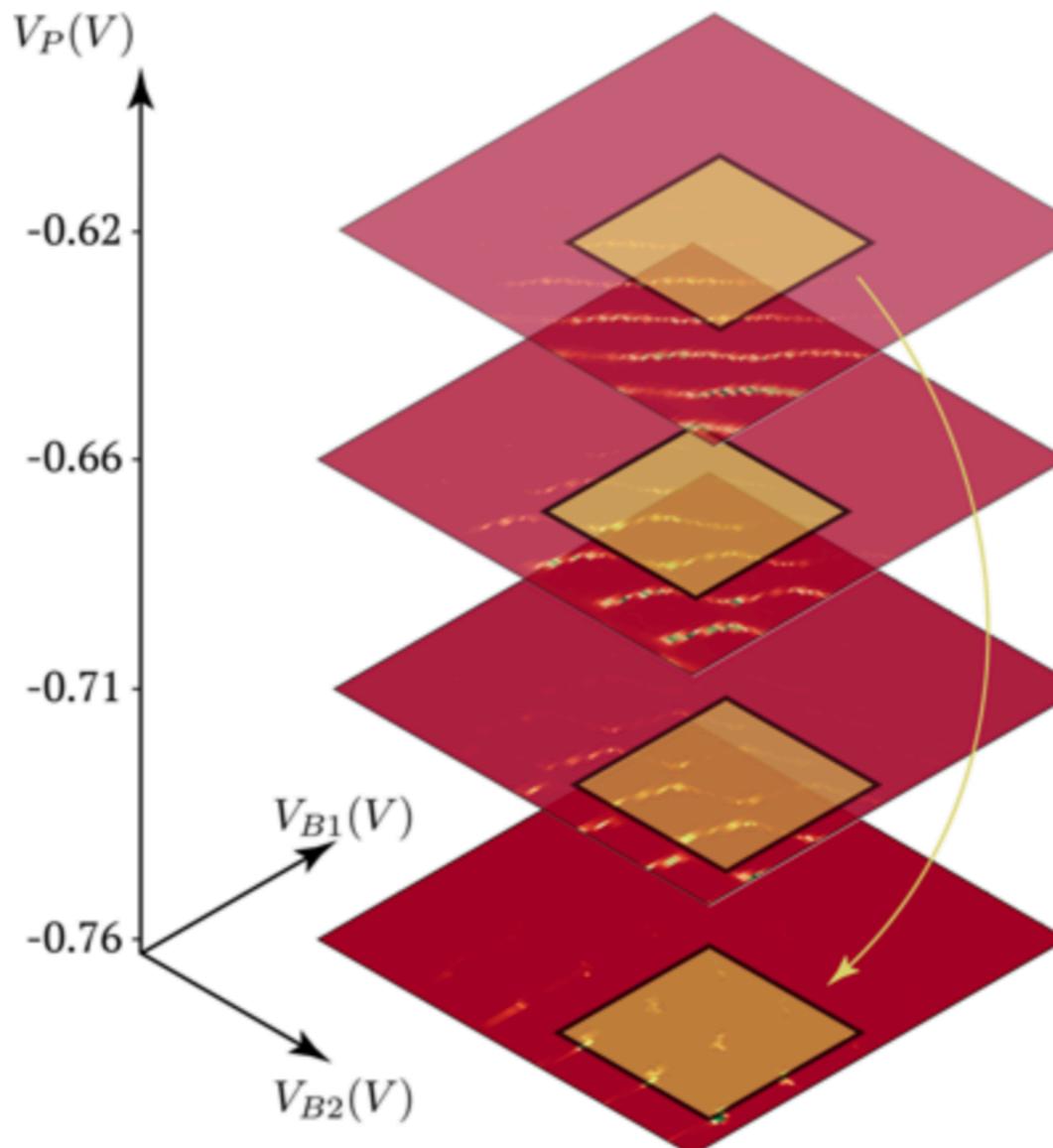


Automated tuning

Baart, T. A. et al. *Appl. Phys. Lett.* **108**, 213104 (2016)

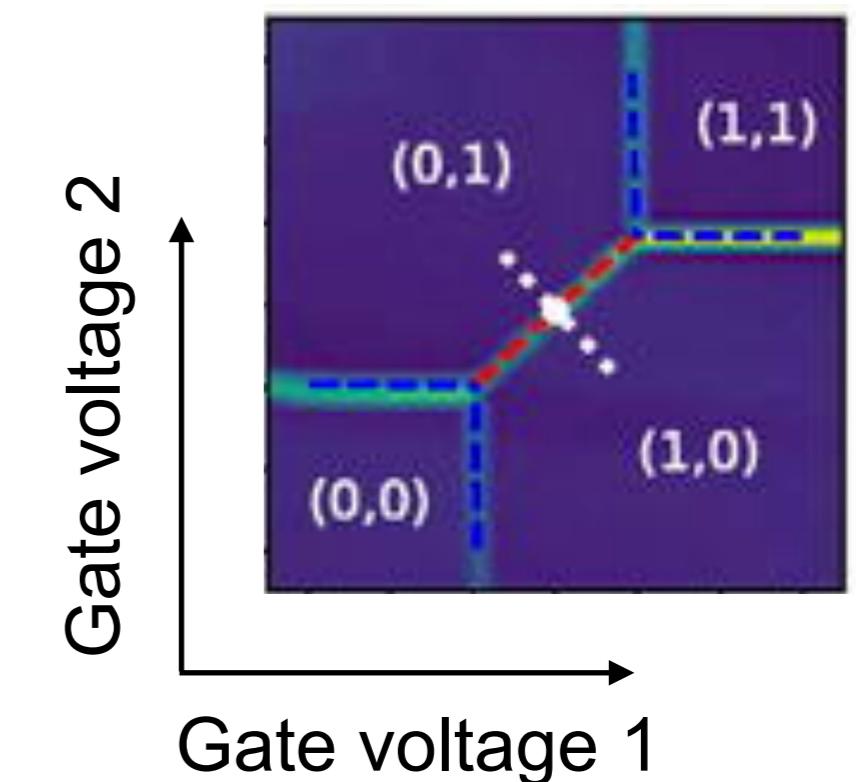


Kalantre, S. S., et al. *npj QI* **5**, 6 (2019)

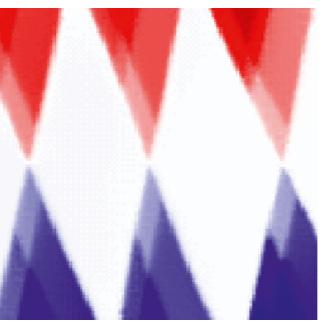


van Diepen, C.J., *Appl. Phys. Lett.* **113**, 033101 (2018)

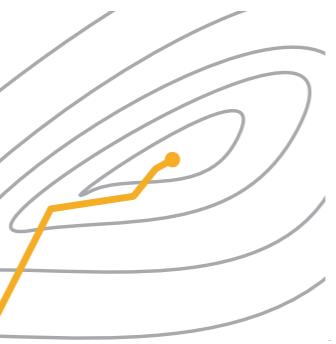
Teske, J.D., *Appl. Phys. Lett.* **114**, 133102 (2019)



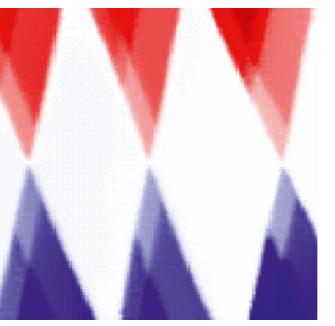
Machine learning algorithm measuring and tuning a device in real time



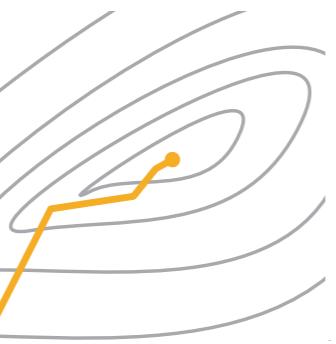
Device measurements



Device tuning



Device measurements



Device tuning

Deep learning

Image
recognition



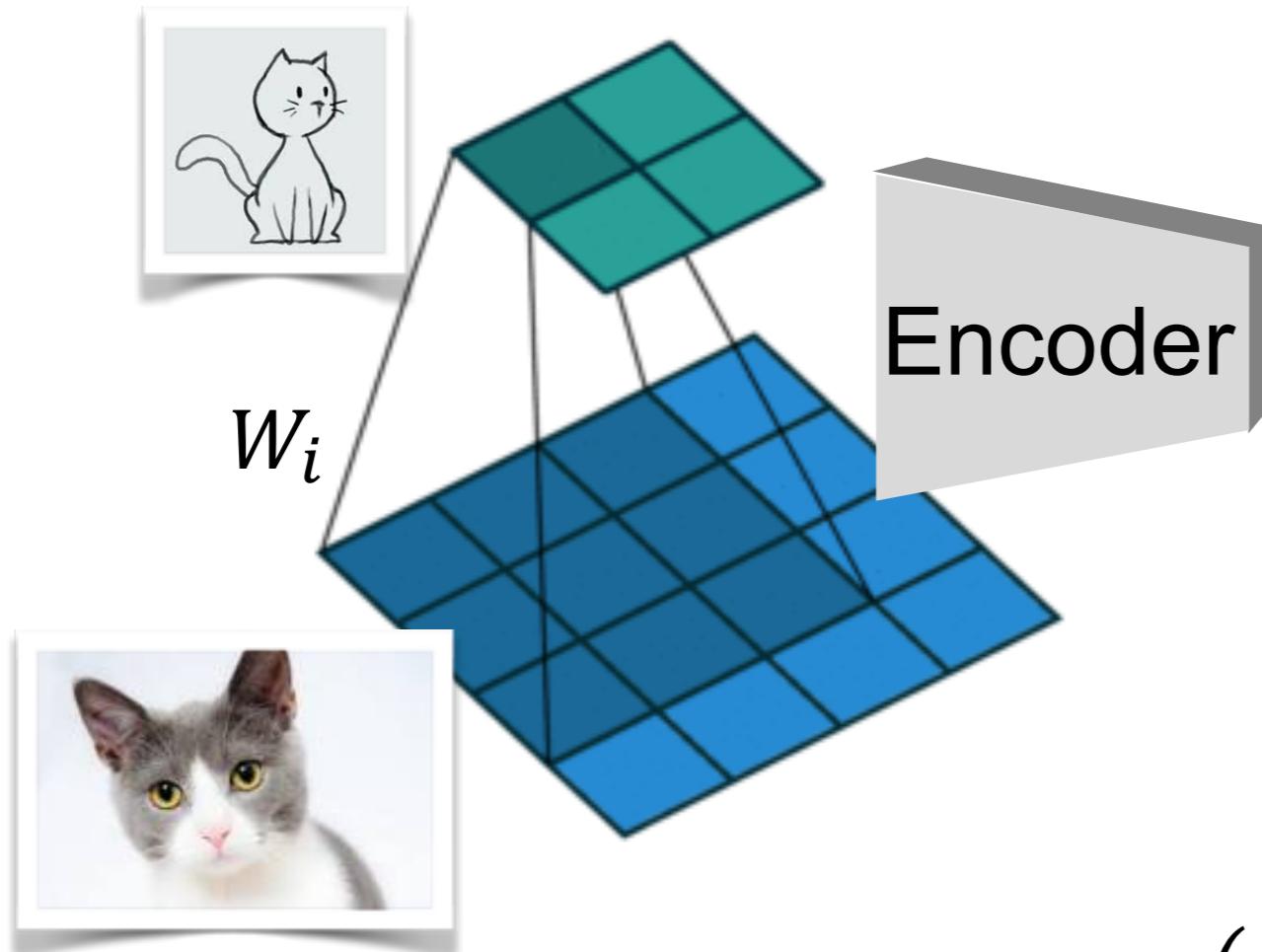
a cat

Deep
generative
models

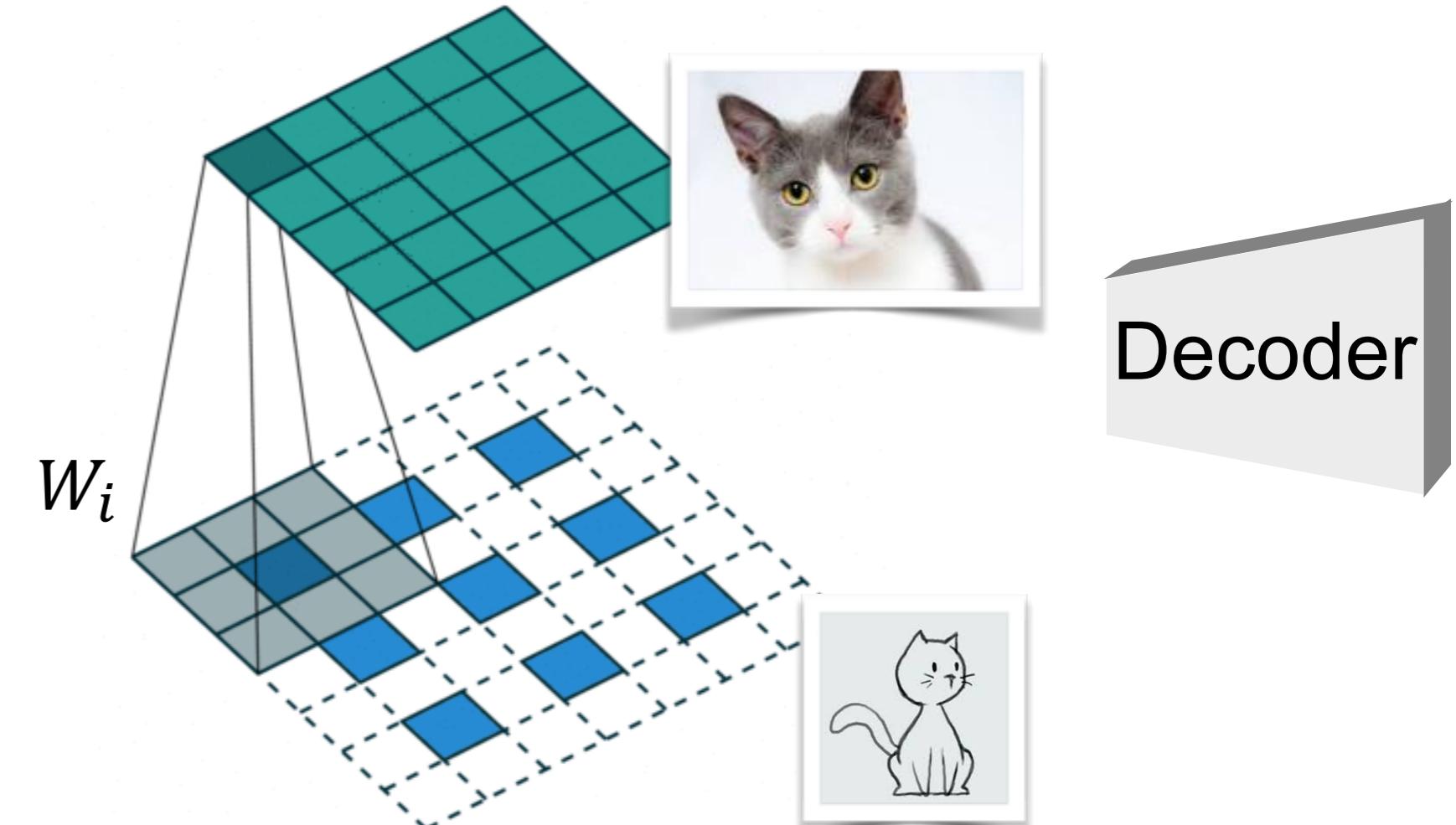


Deep learning

Image
recognition



Deep generative
models



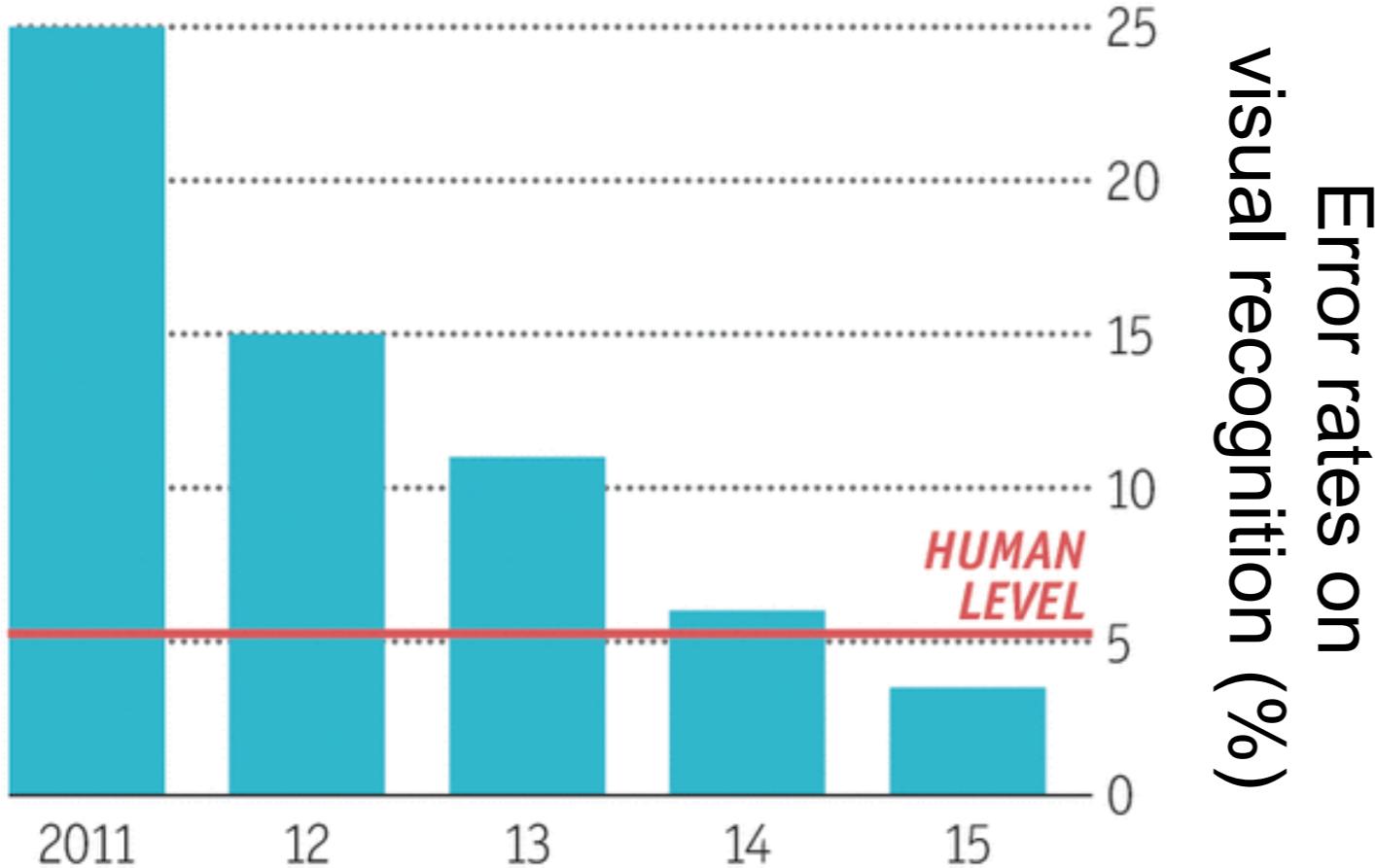
$$y = f_1 \left(f_2 \left(f_3(\dots) \right) \right)$$

where $f_i(\mathbf{x}) = \max(W_i \mathbf{x} + \mathbf{b}_i, 0)$

Image recognition and deep generative models

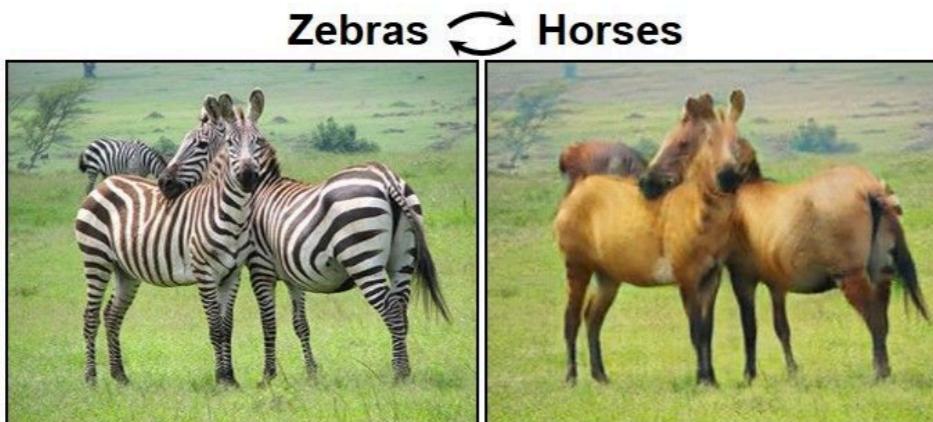
IMAGENET

1.2 M training images



Sources: ImageNet; Stanford Vision Lab

Economist.com



Jun-Yan Zhu*, Taesung Park*, Phillip Isola, and Alexei A. Efros, ICCV 2017

this bird is red with white and has a very short peak

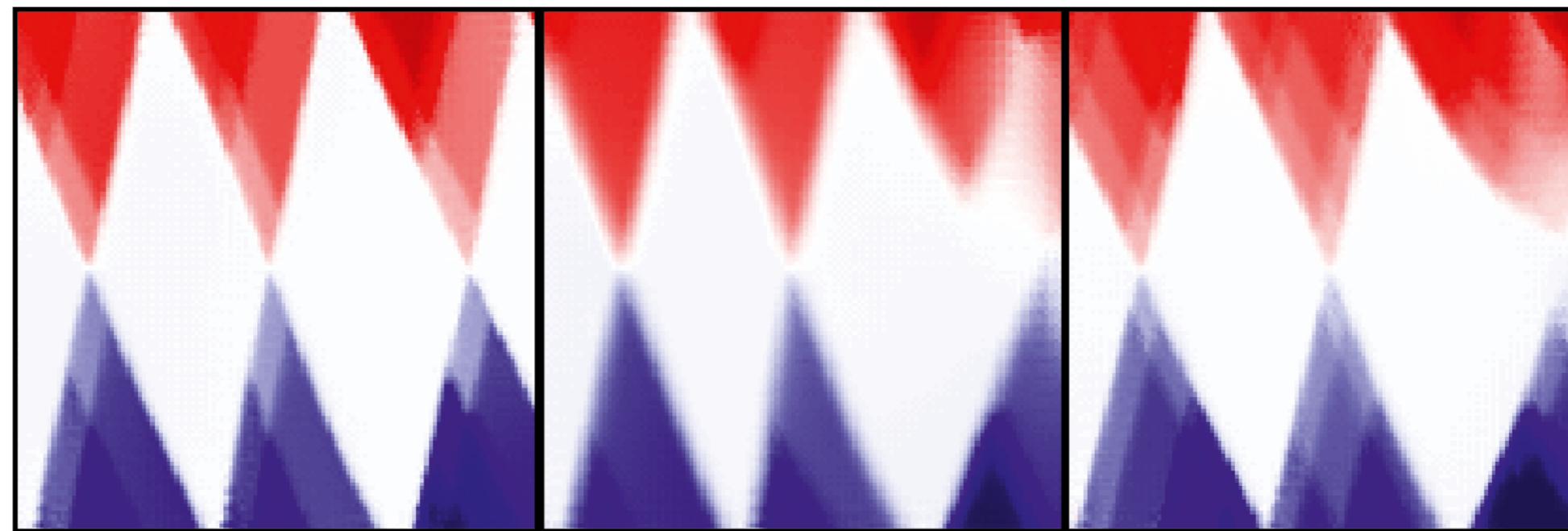
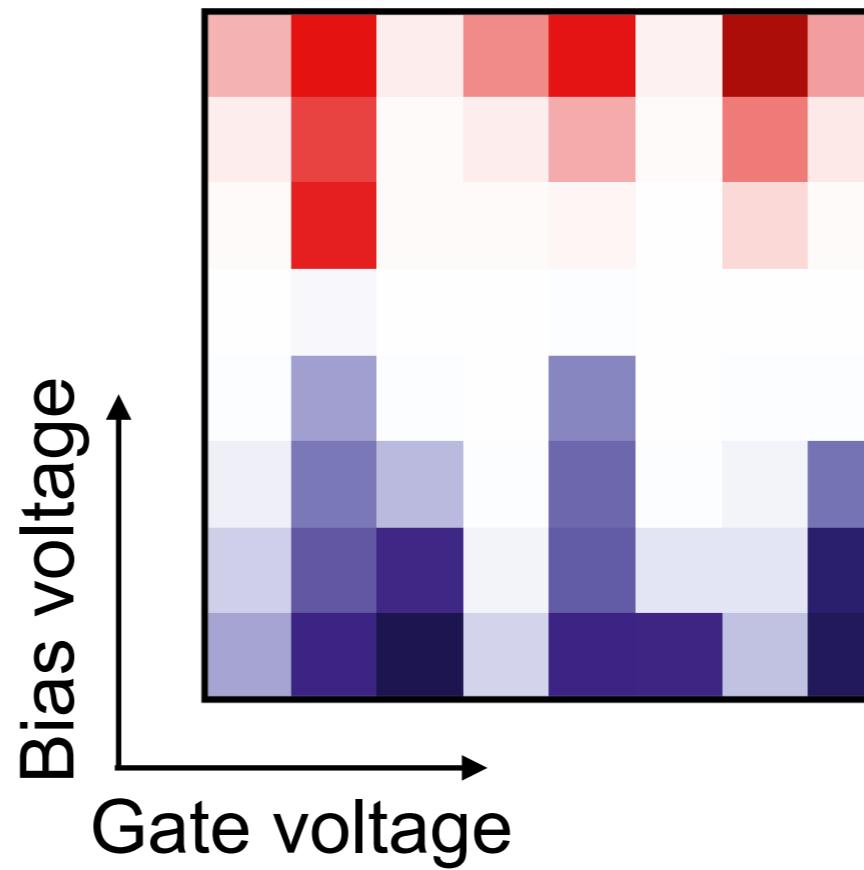


Xu, T., Zhang, P., Huang, Q., Zhang, H., Gan, Z., Huang, X., & He, X. arXiv:1711.10485 (2017)

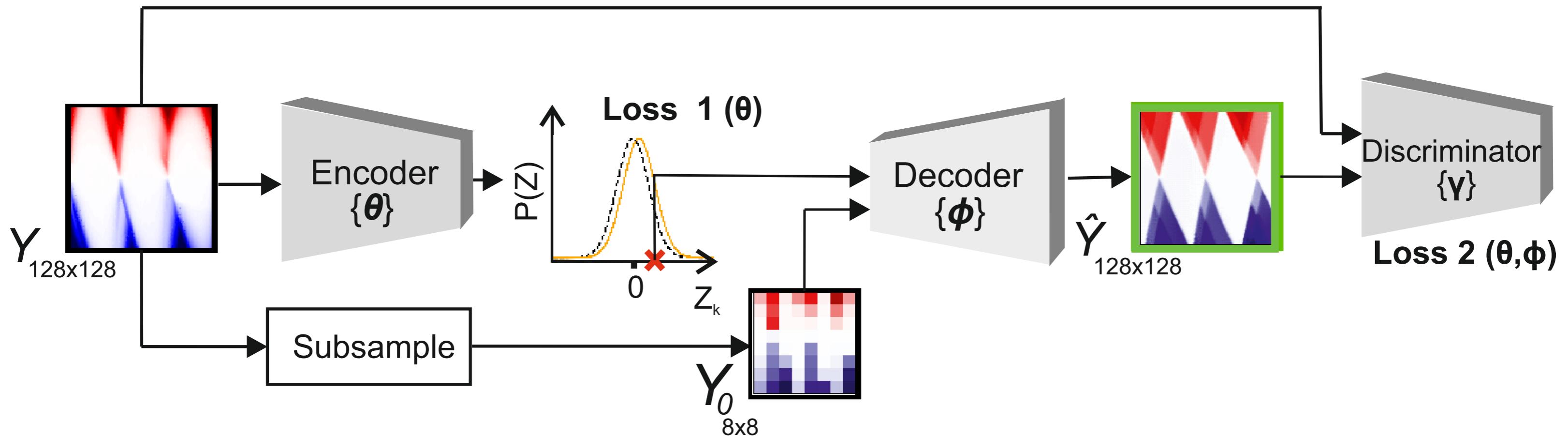


NVIDIA, ICLR 2018

Reconstructions

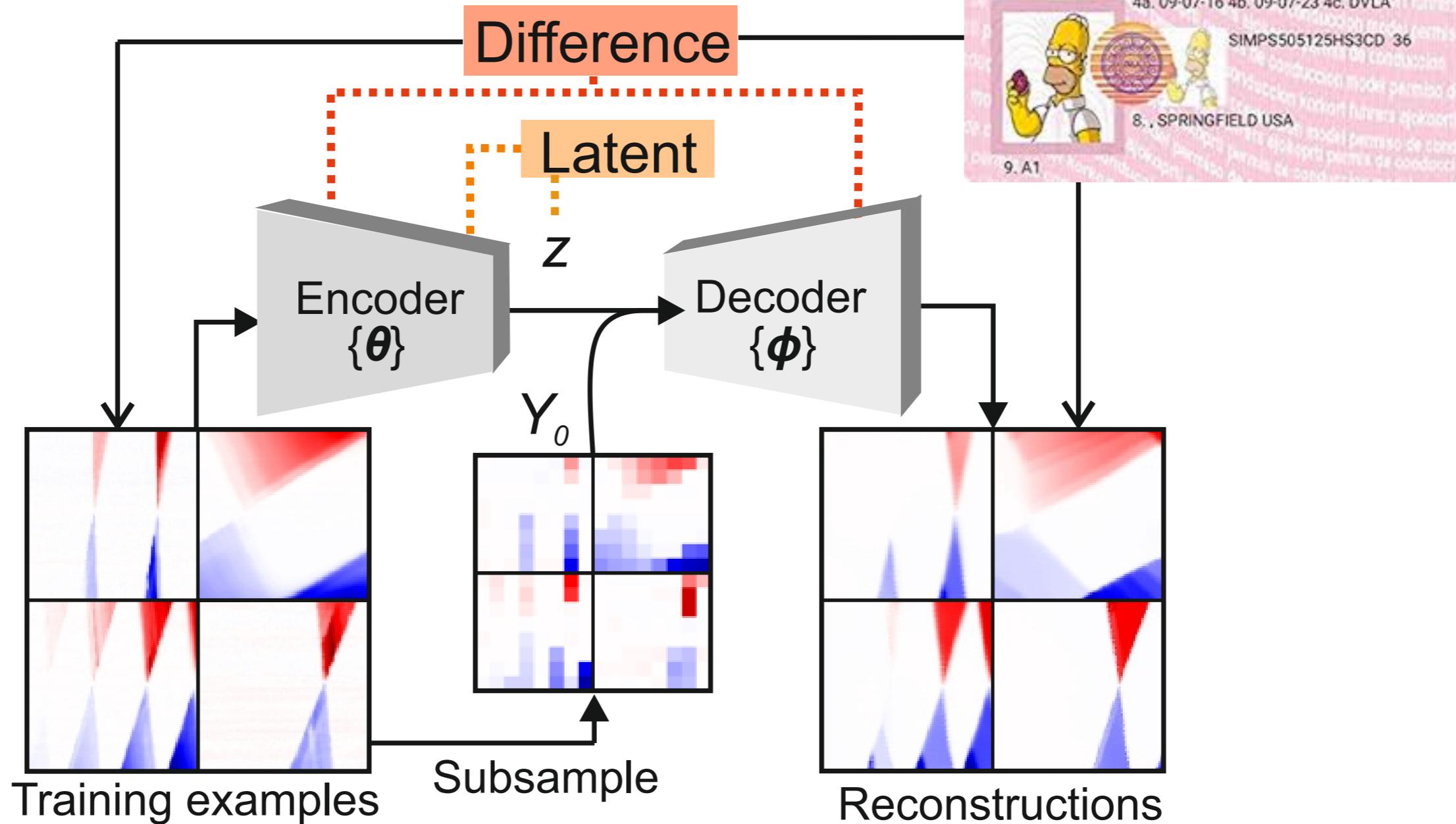


Deep generative model



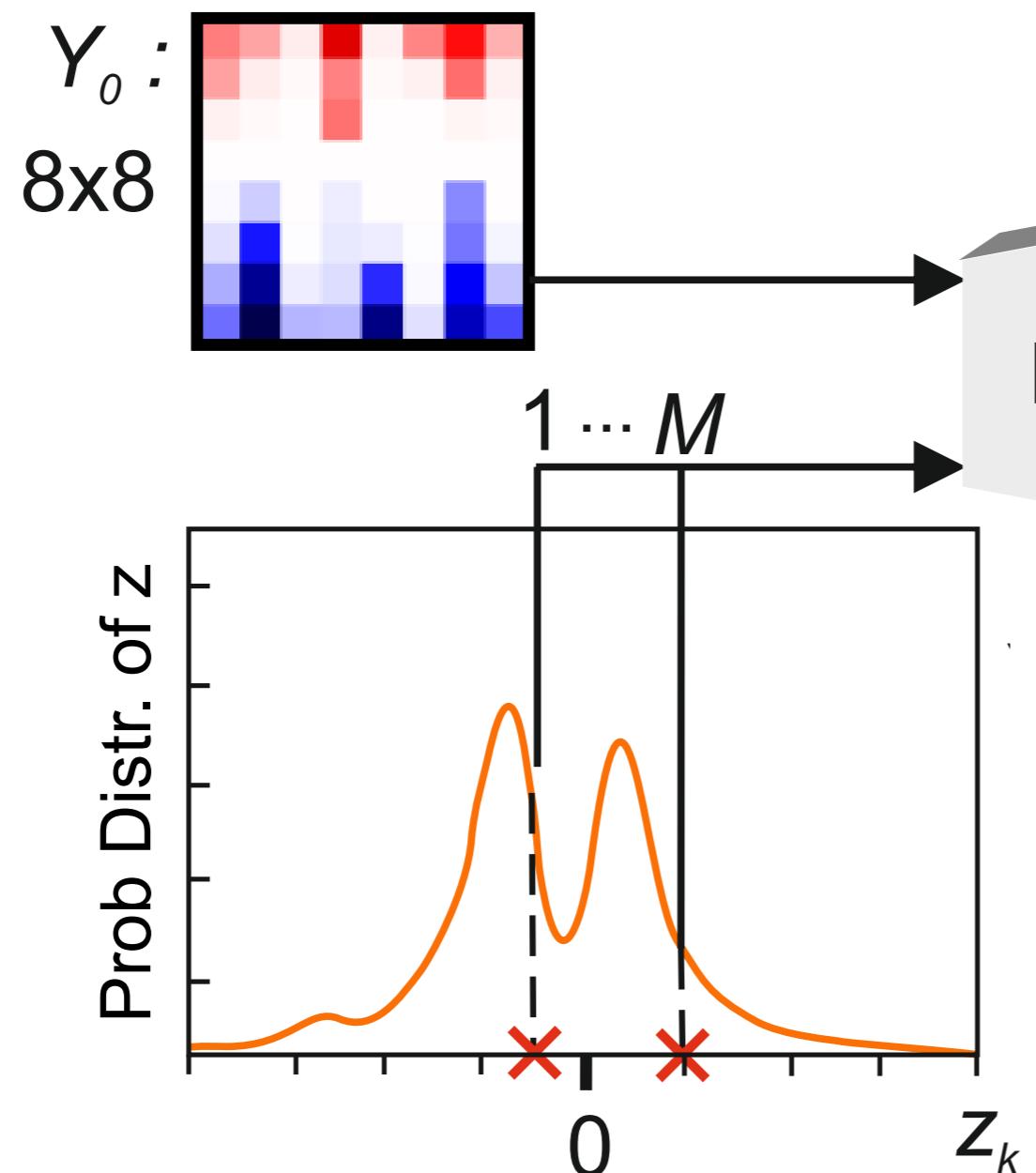
Deep generative model

Training

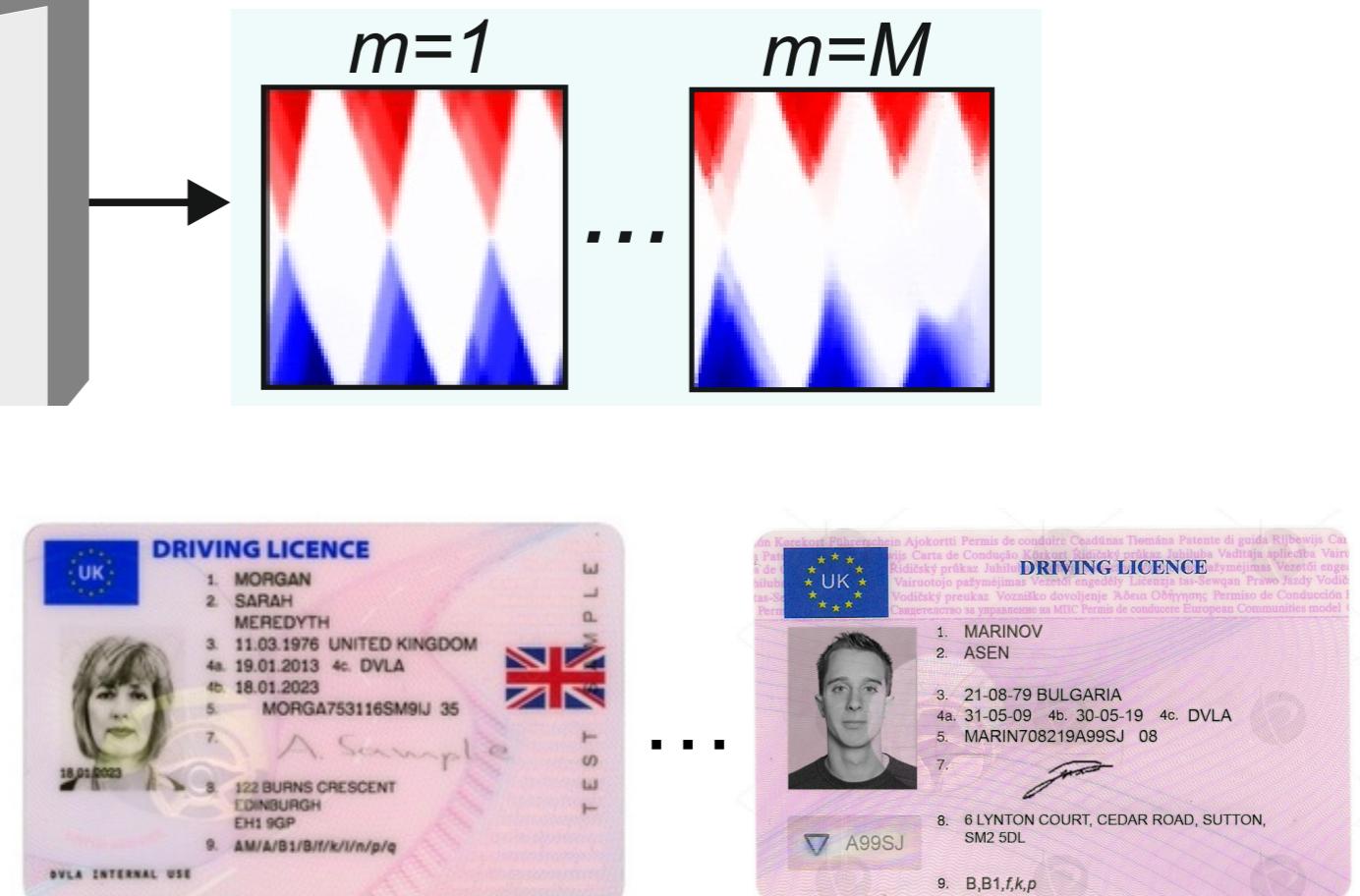


Deep generative model

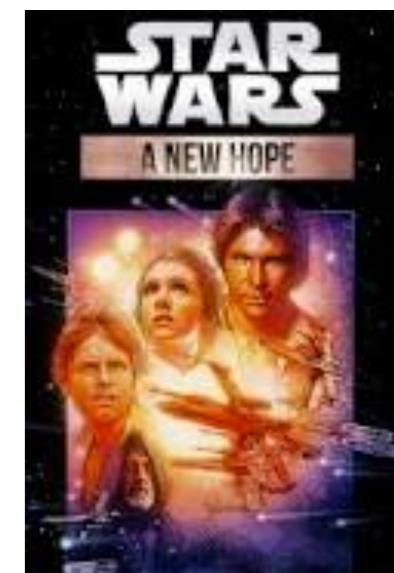
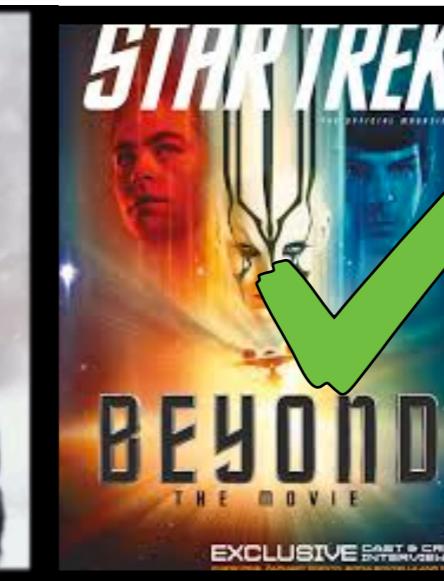
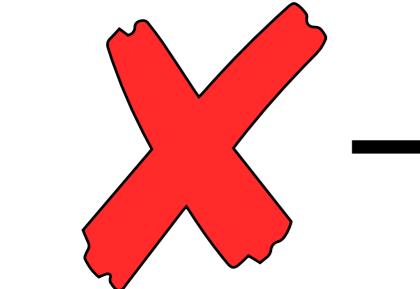
Reconstructions



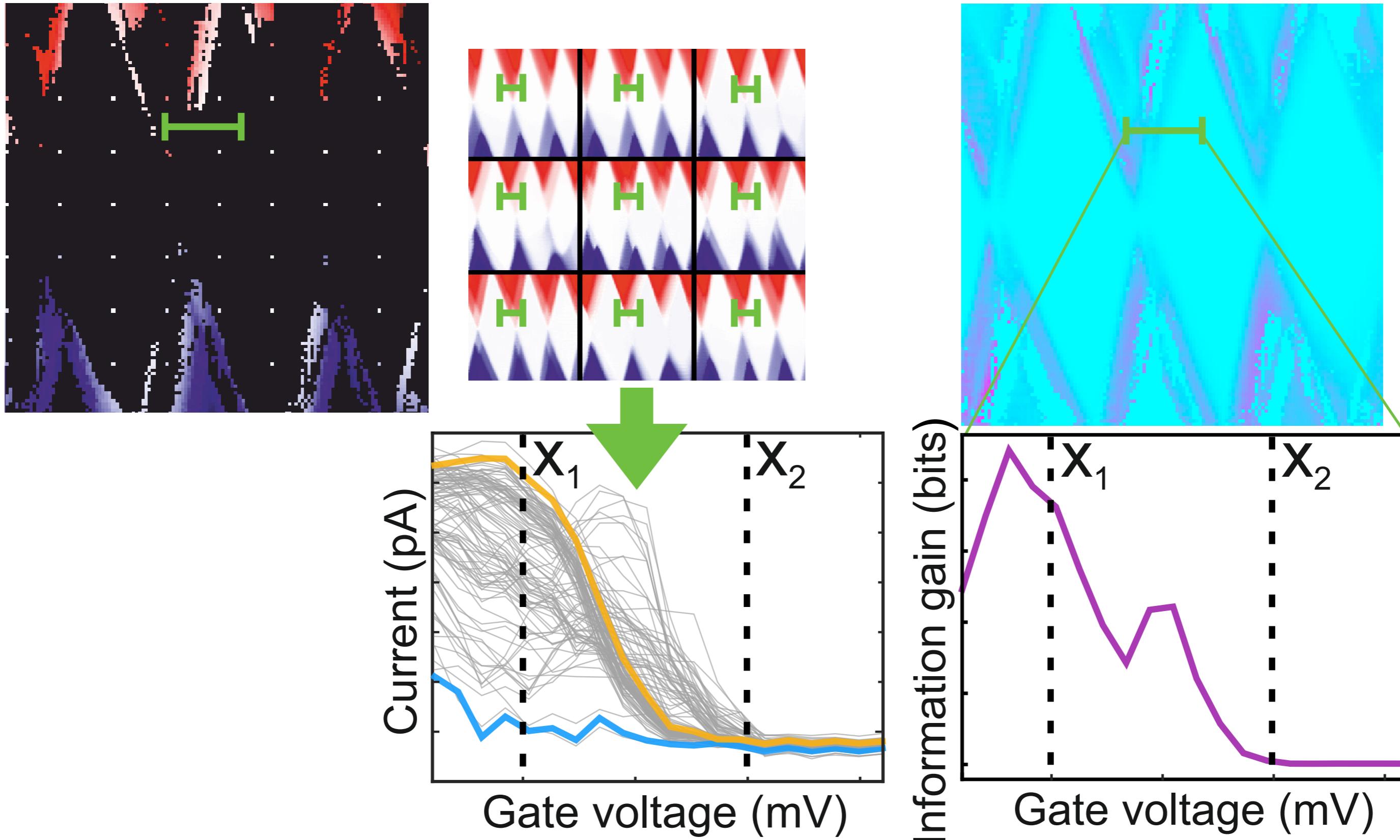
Reconstructions



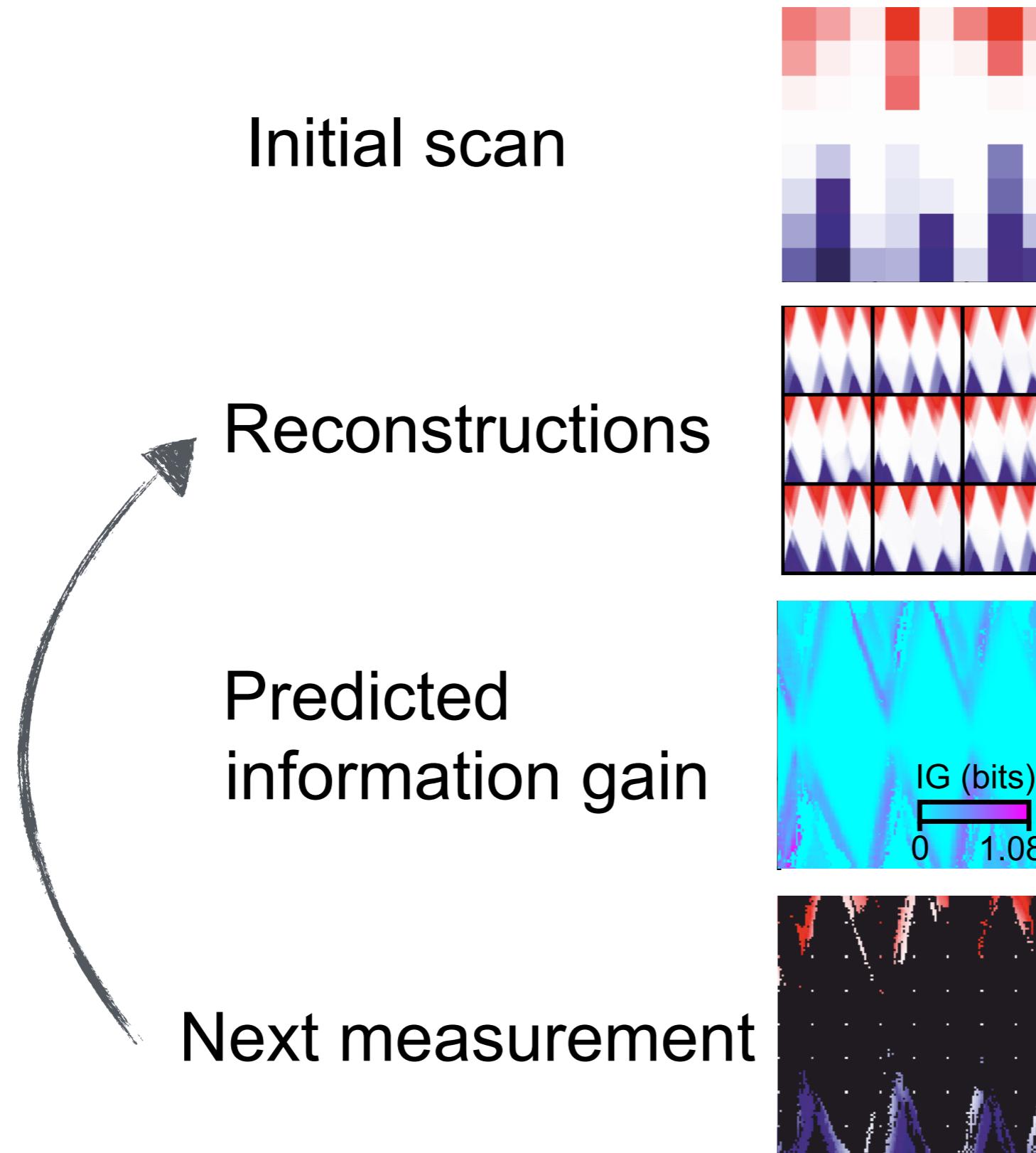
Information theoretic models



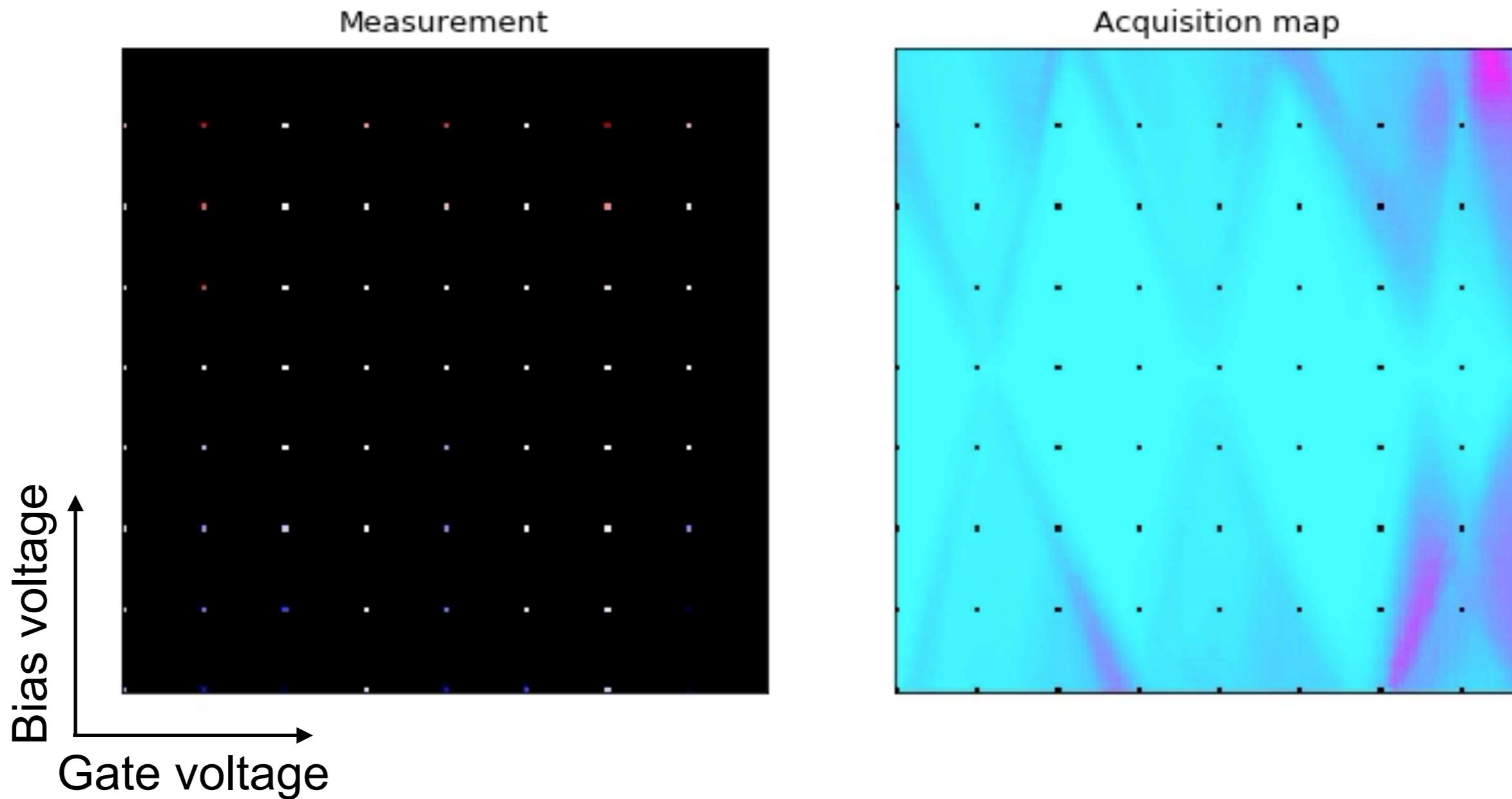
Information gain map



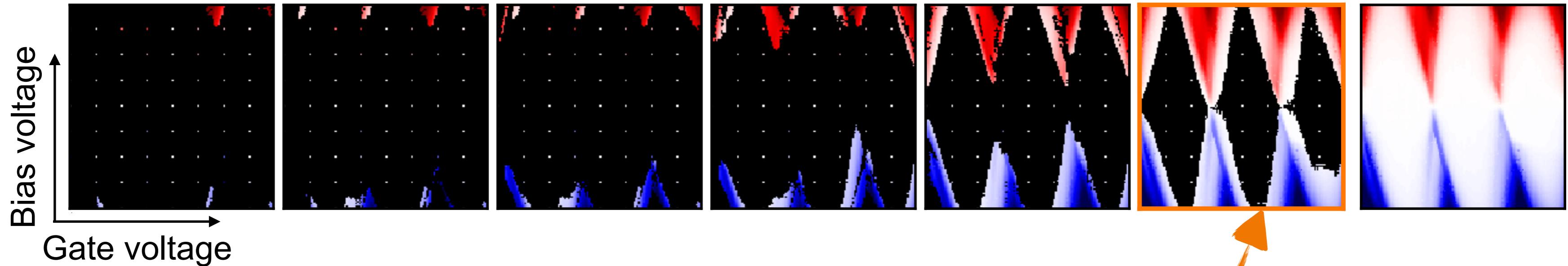
Machine learning for quantum device measurement



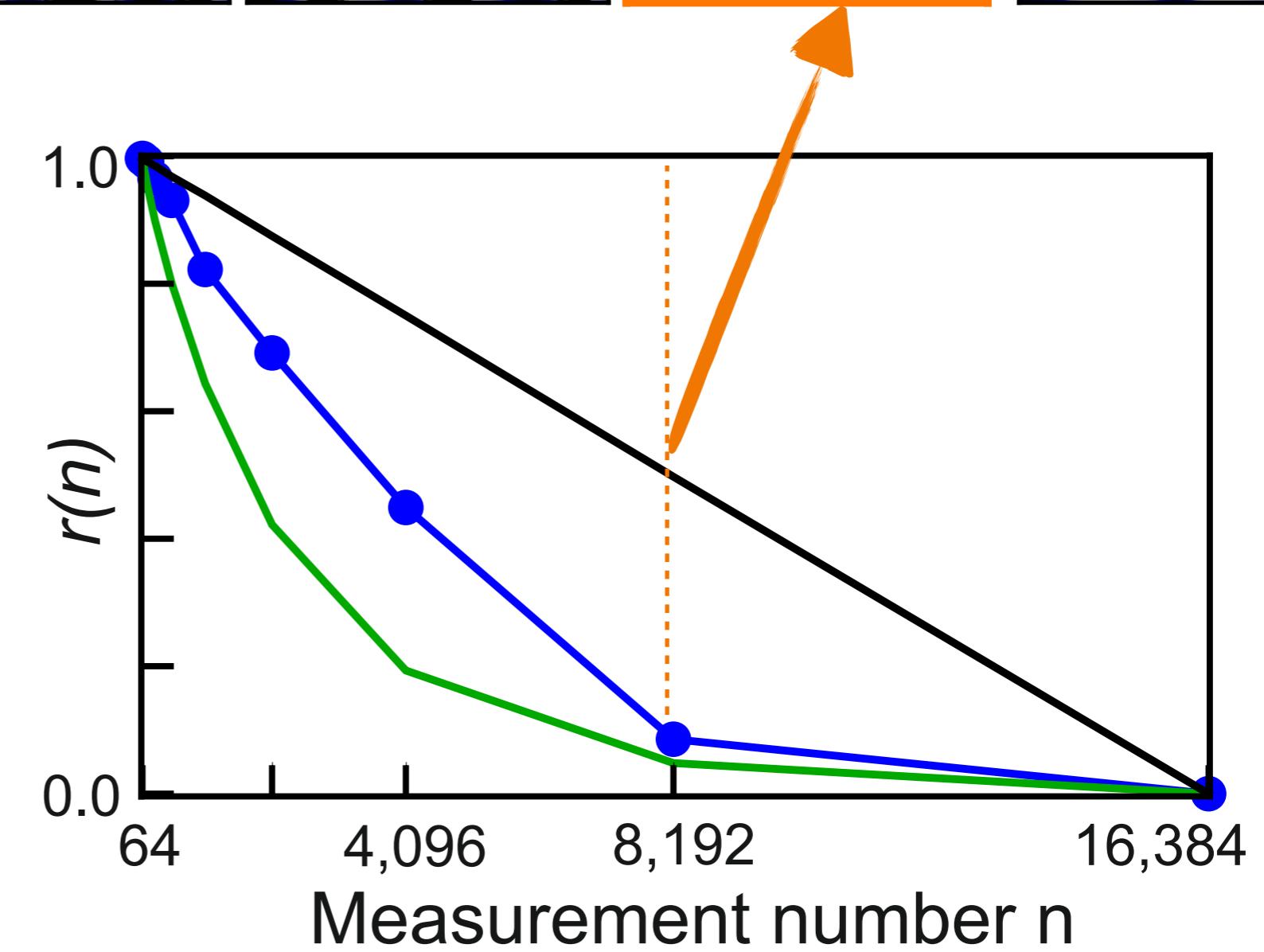
Machine learning for quantum device measurement



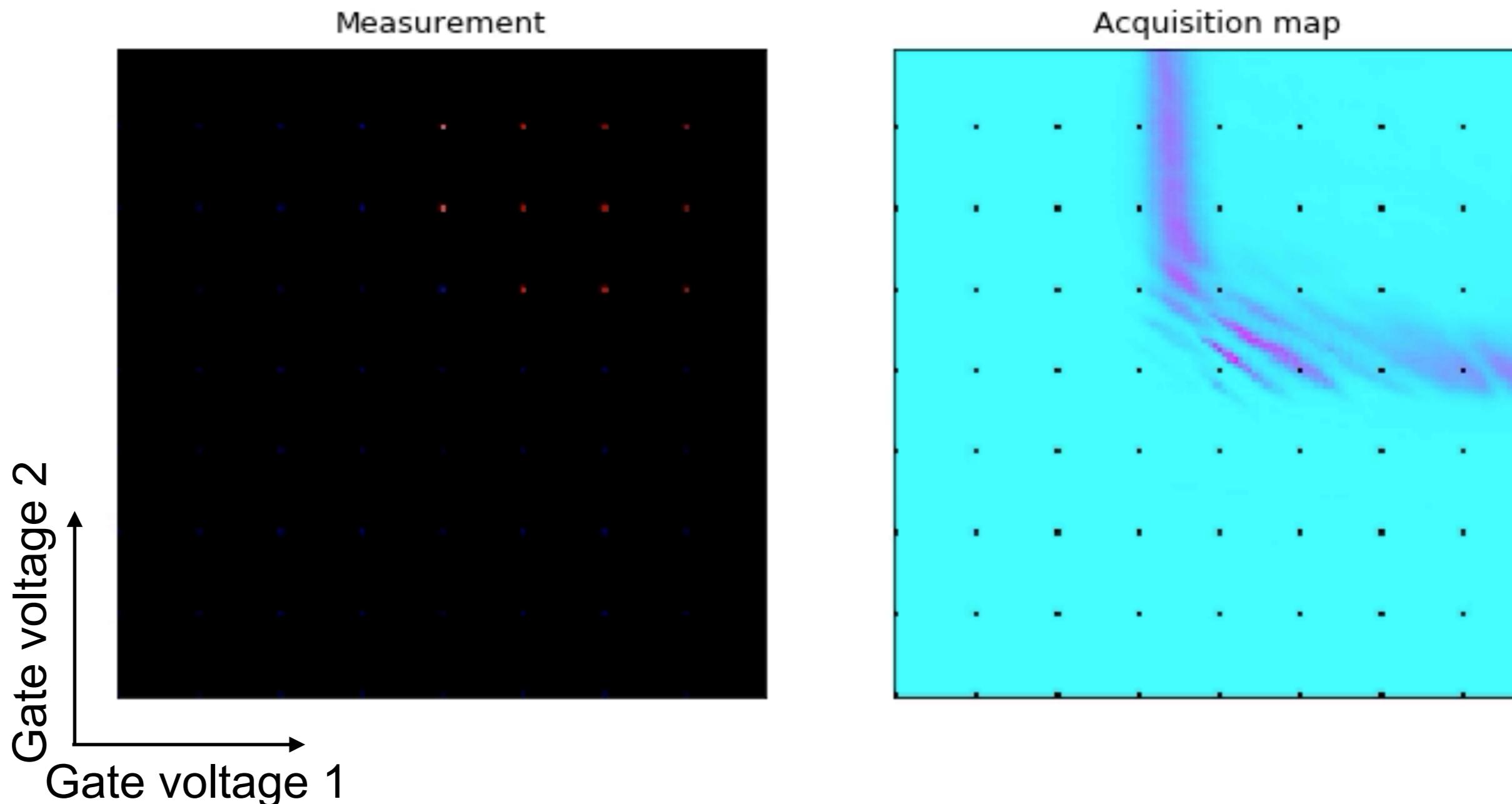
Machine learning for quantum device measurement



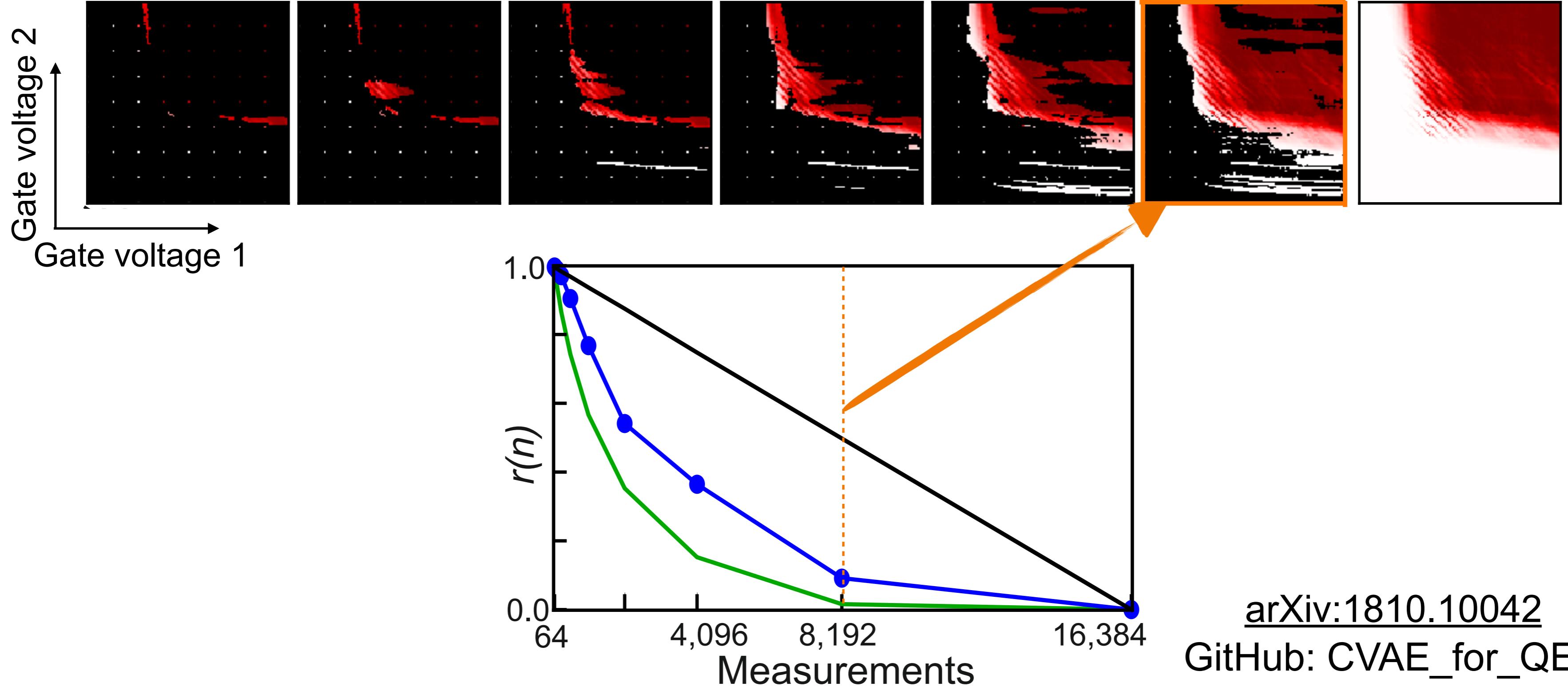
$$r(n) = \frac{\text{unmeasured current gradient}}{\text{total current gradient}}$$

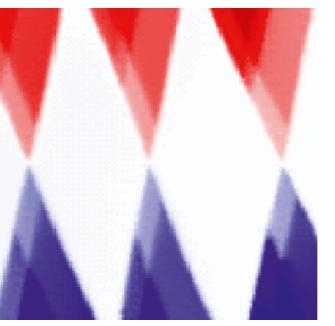


Machine learning for quantum device measurement

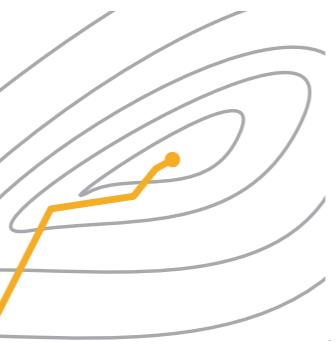


Machine learning for quantum device measurement



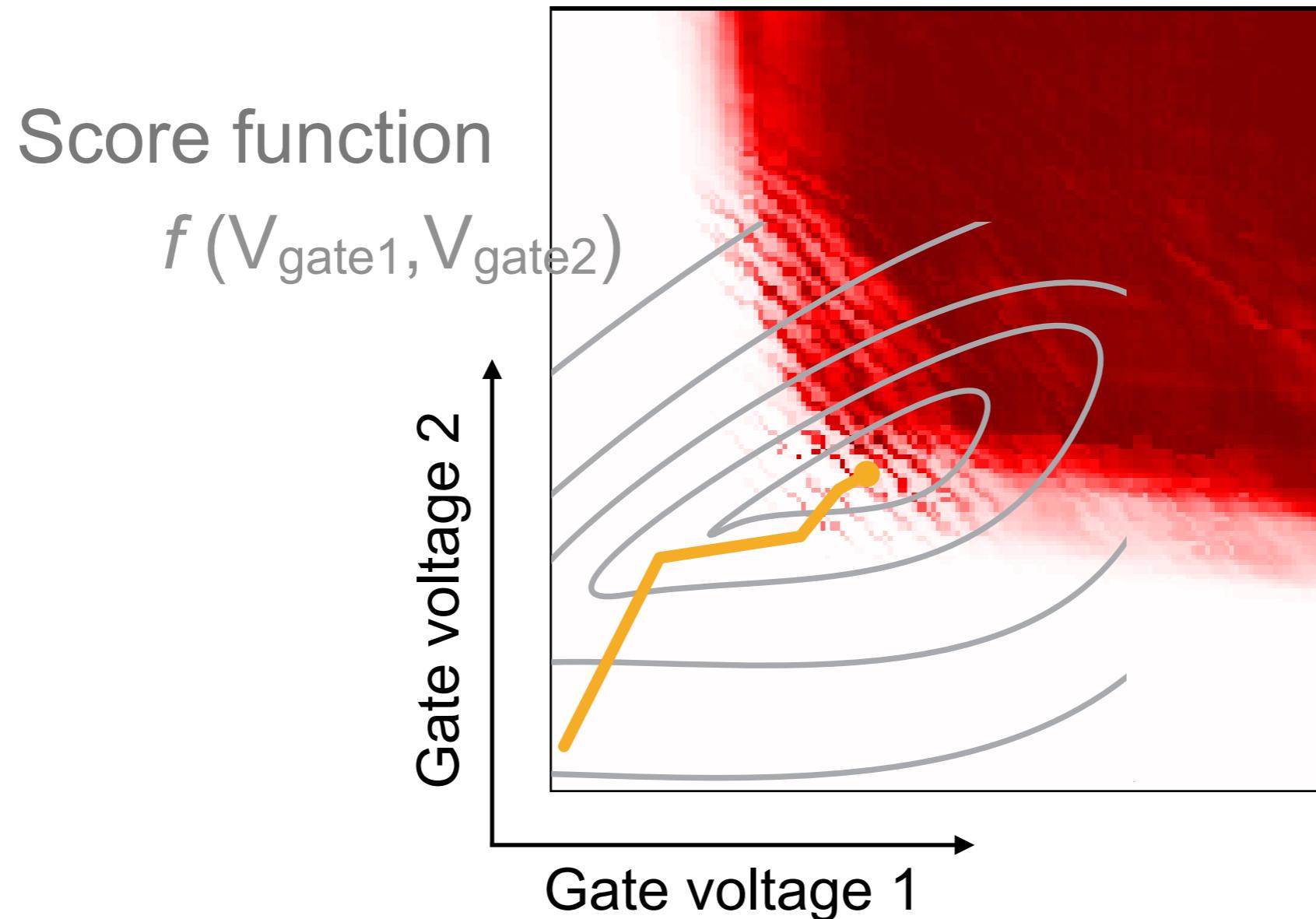


Device measurements

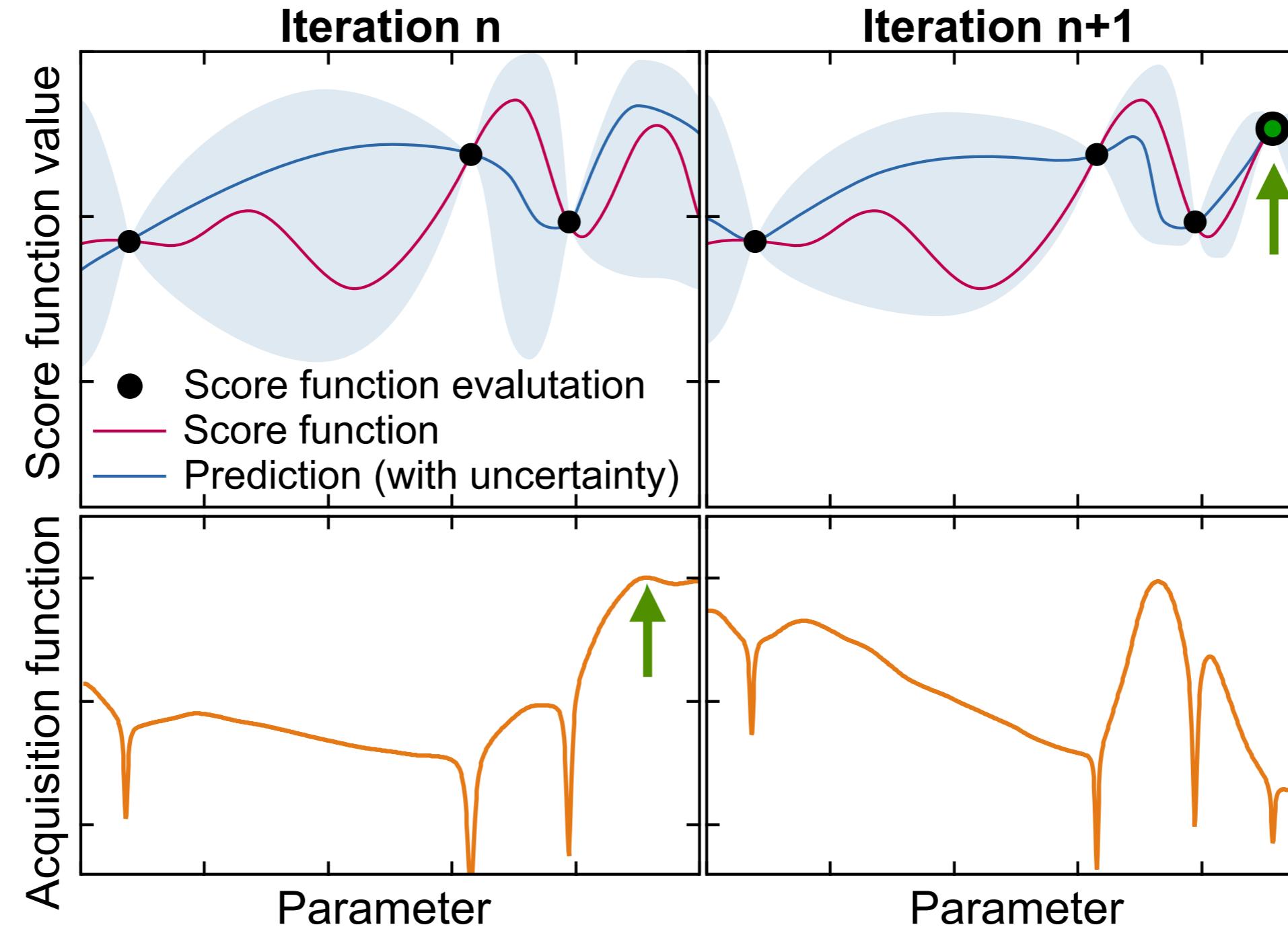


Device tuning

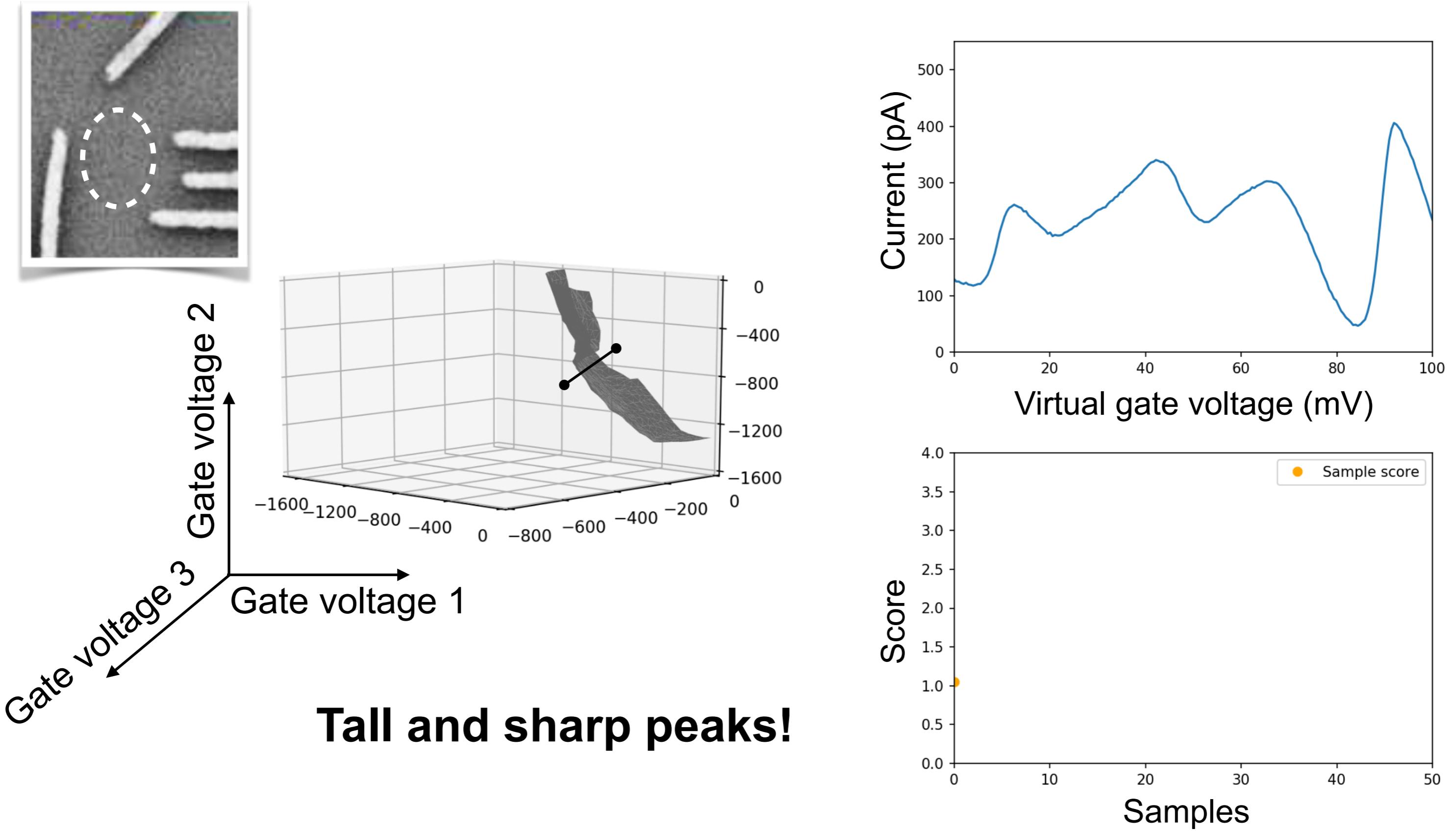
Machine learning for quantum device tuning



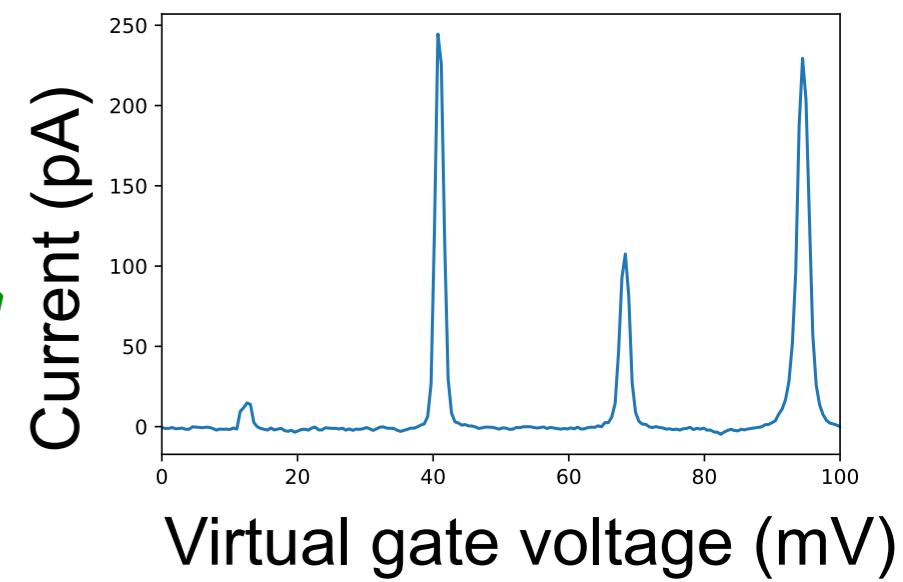
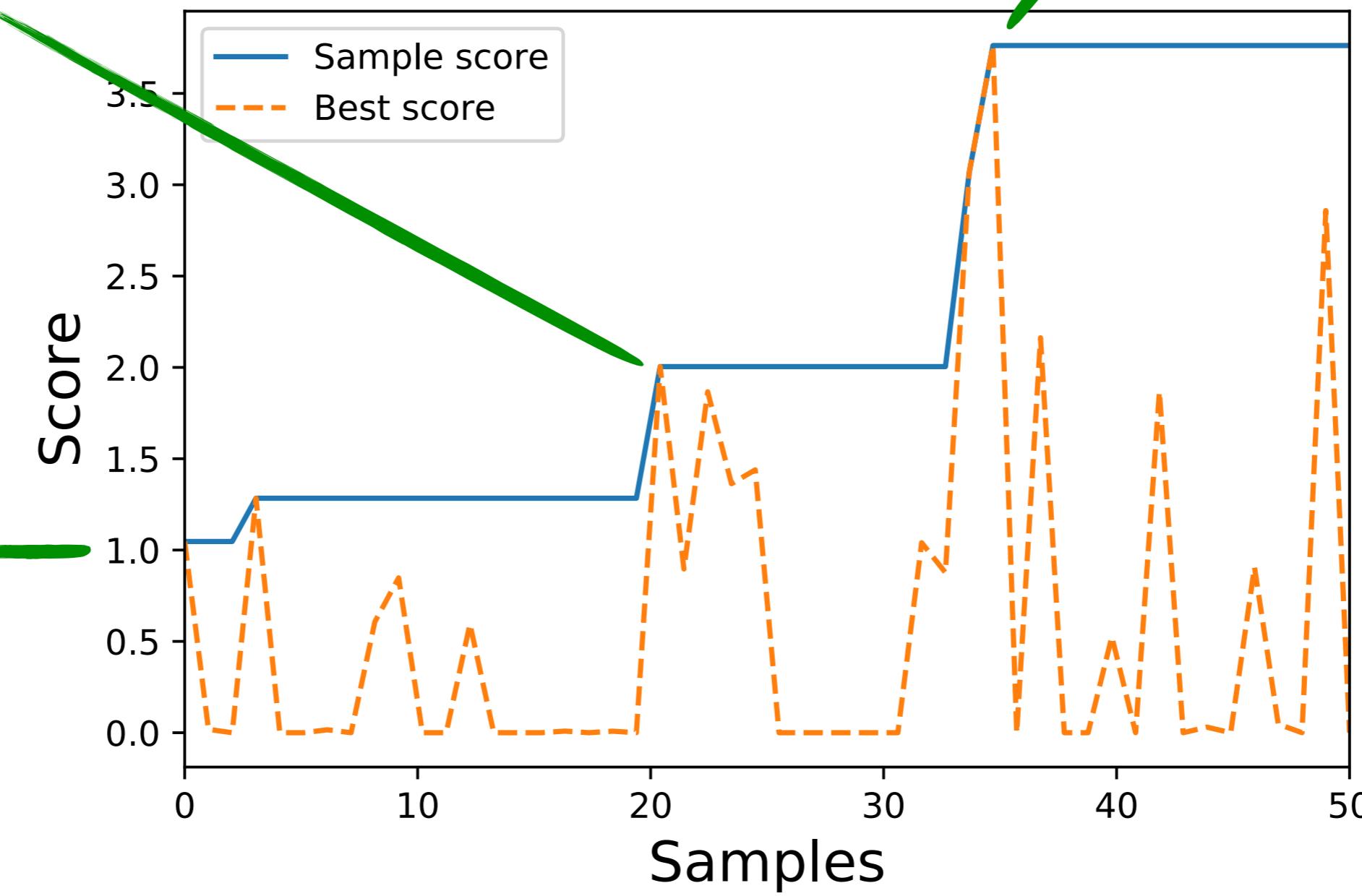
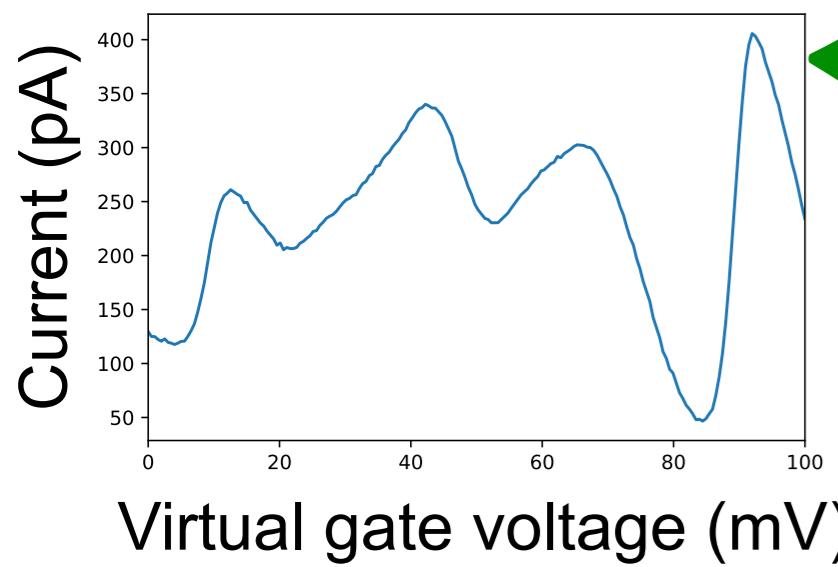
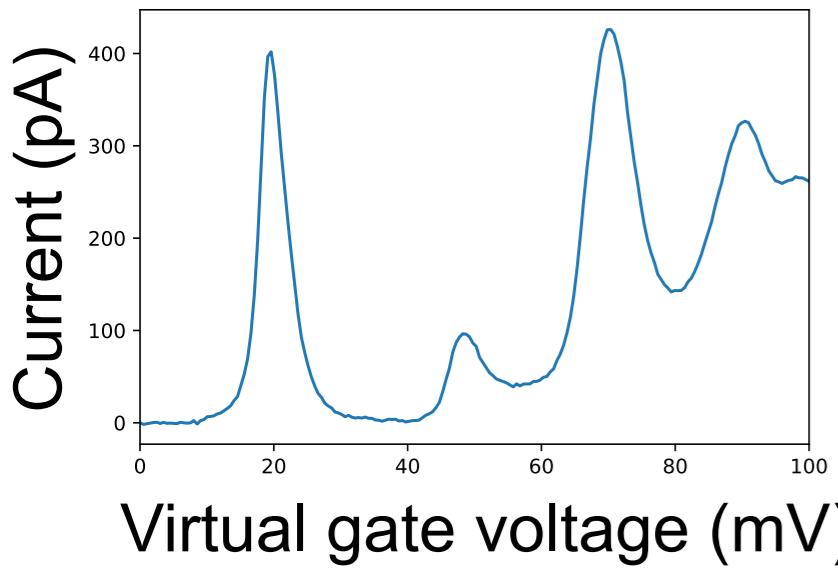
Bayesian optimisation



Machine learning for quantum device tuning

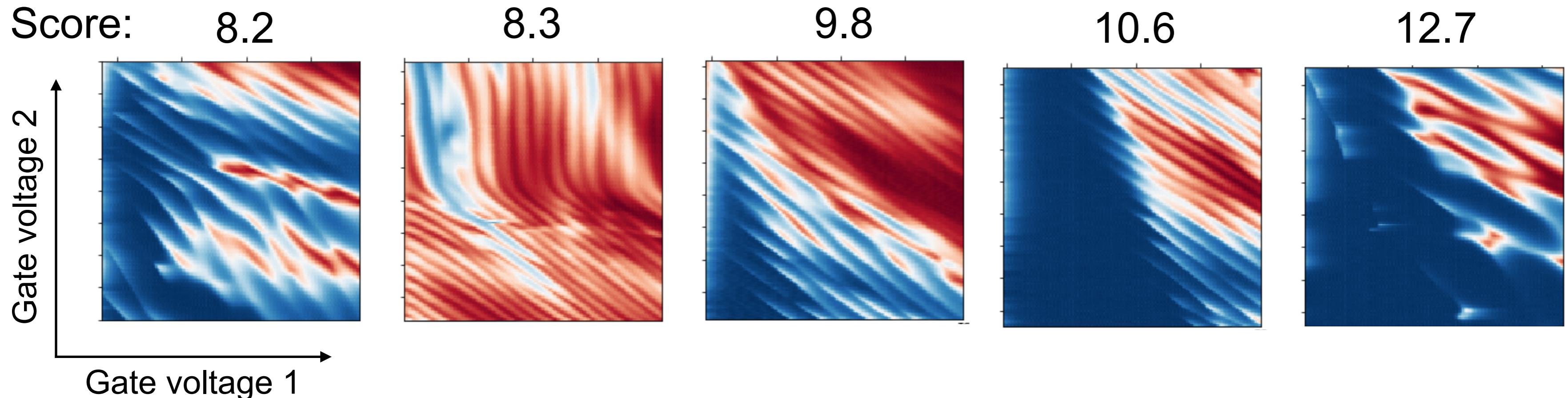
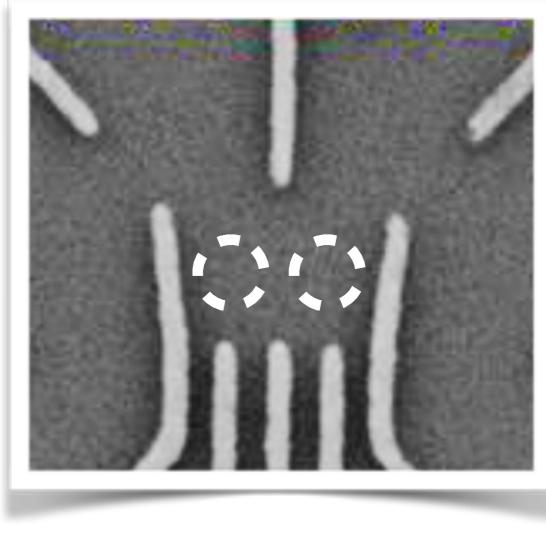


Machine learning for quantum device tuning



Machine learning for quantum device tuning

Bias triangles!



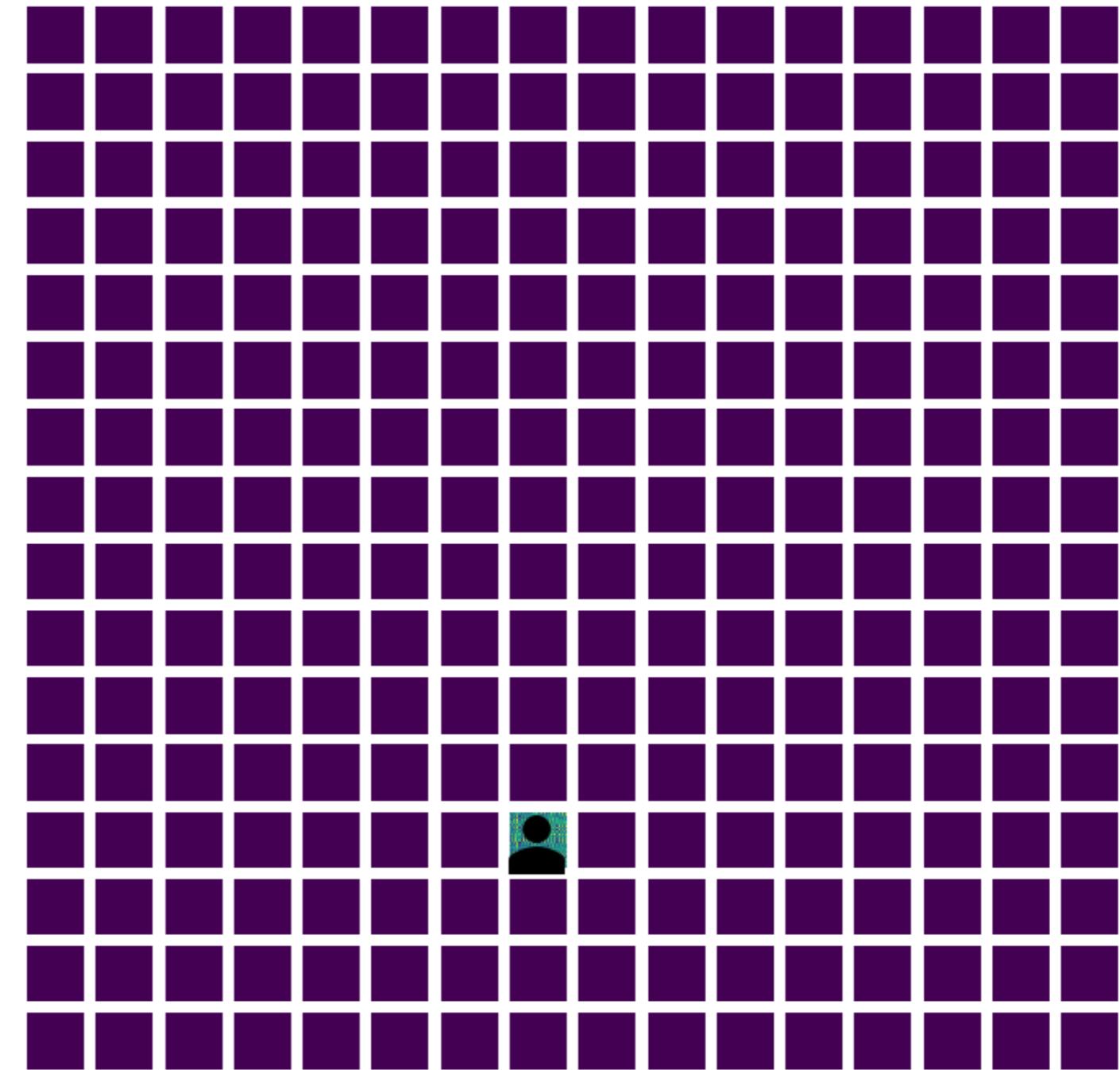
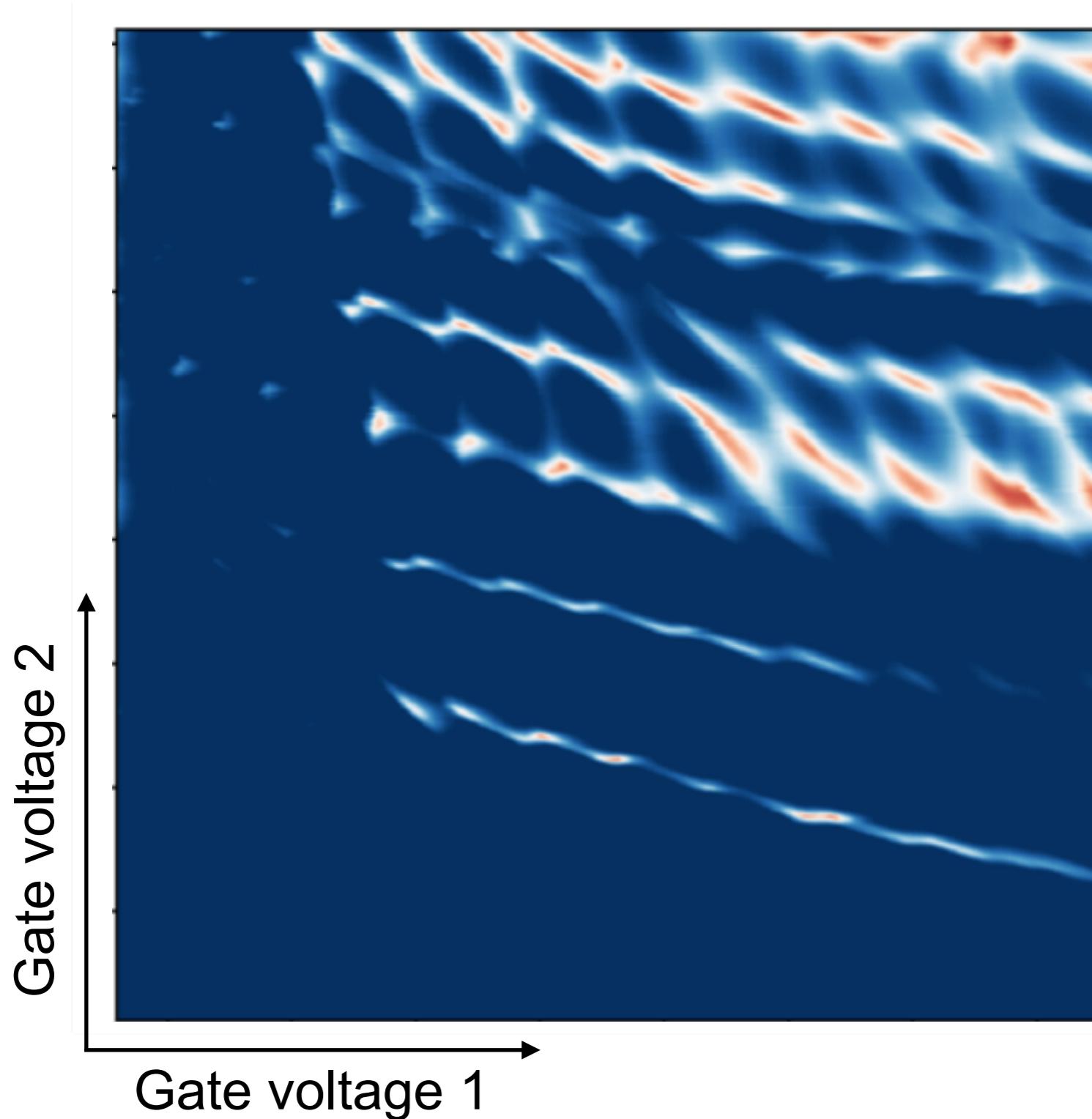
Reinforcement learning for finer tuning



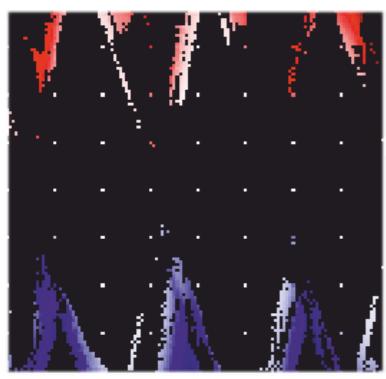
Deep Mind (2015)



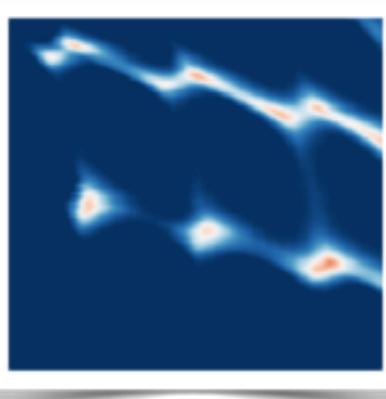
Reinforcement learning for finer tuning



Summary

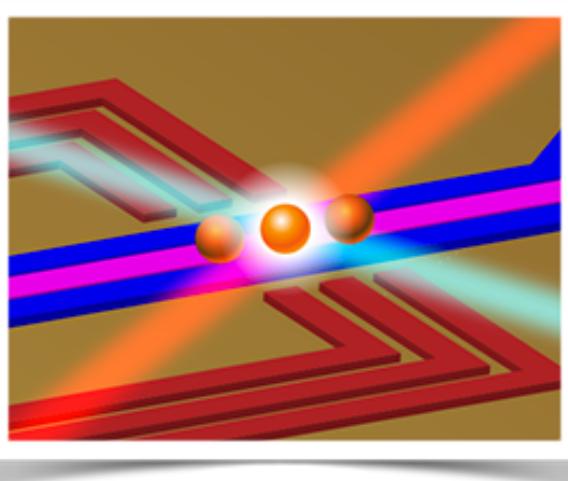


- Efficient quantum dot measurements using machine learning



- Efficient quantum dot tuning using machine learning

- Perspectives:



- ▶ Characterise and tune large quantum dot circuits
- ▶ Apply our findings to different qubit realisations

Thank you