A photograph of a large African elephant and a much smaller calf walking through a lush green savanna. The large elephant is on the left, and the calf is on the right, walking towards the right side of the frame. The background is a vast, open grassy plain under a bright sky.

Classical
Computing

Quantum
Computing

Source – Google,
Original Idea- Scott Holmes

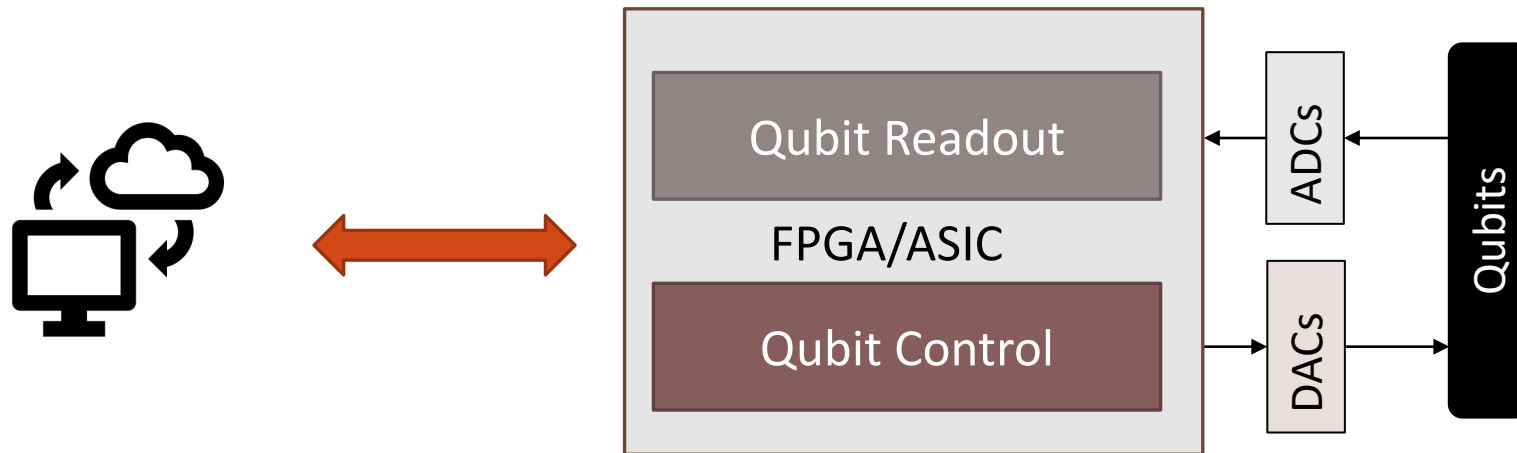
Hybrid Quantum-Classical Systems: Architectures, Resource Management, and Security (Part-2)

Swamit Tannu



WISCONSIN
UNIVERSITY OF WISCONSIN-MADISON

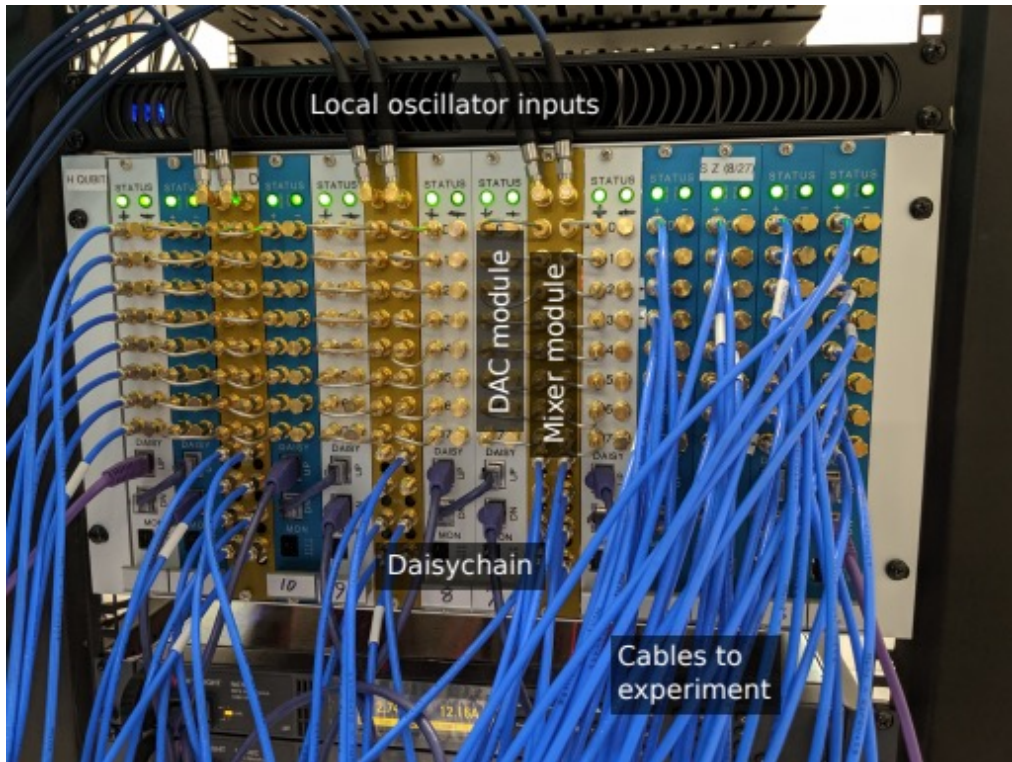
Quantum Control Hardware



Qubit Control: Responsible for manipulating the state of the qubits

Qubit Readout: Responsible for measuring the state of the qubits (0/1)

Control Hardware is Expensive



Control hardware for Google Sycamore

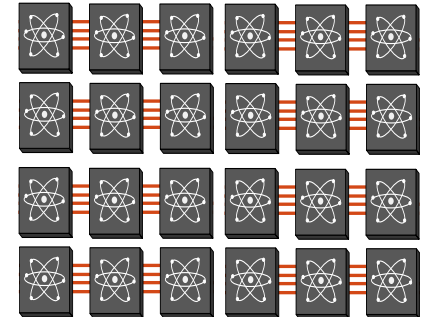
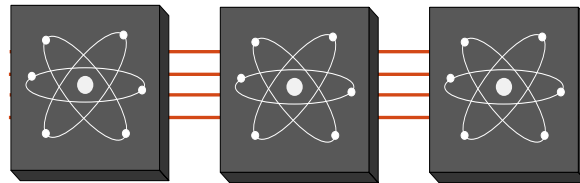
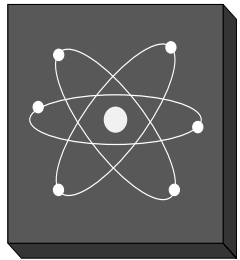


Number of qubits	53
Number of FPGAs	30+
Number of DACs	200+
Number of mixers	50+
Number of cables	200+

Mitigate Hardware Errors

Scale Control Architecture

New Materials, Devices, ...



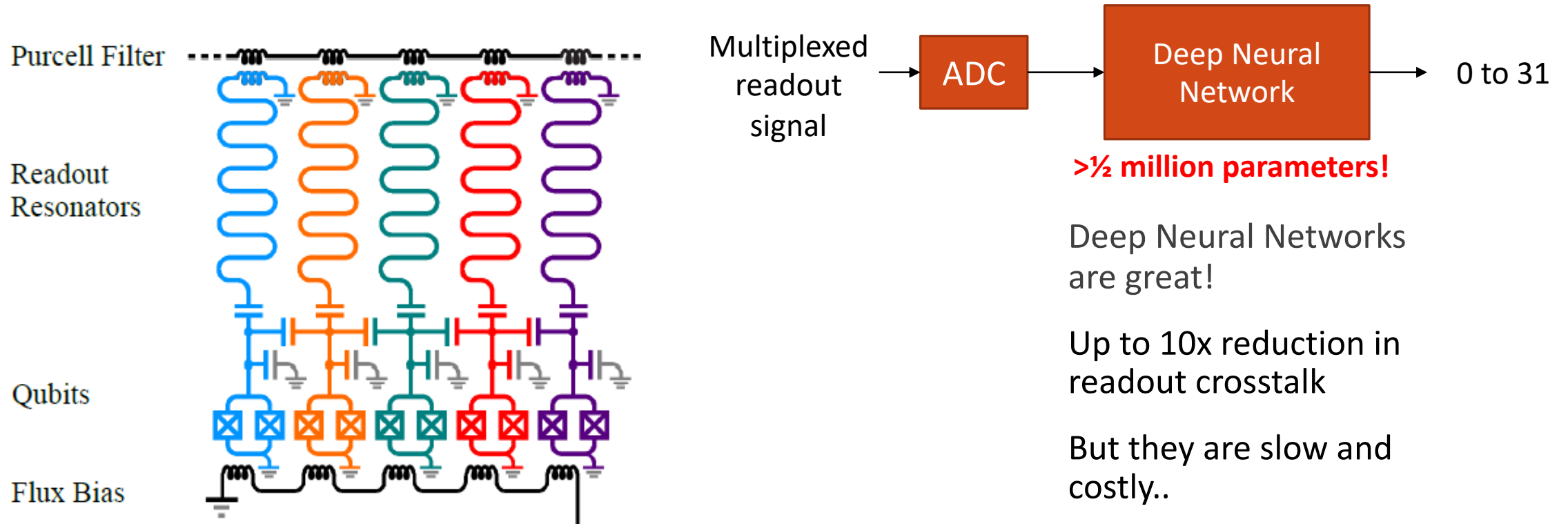
**Current NISQ
(100+ Qubits)**

**Near Future NISQ
(1000 Qubits)**

**Dream
(1,000,000 Qubits)**

Goal: \$700 per qubit

Qubit Readout for Transmon



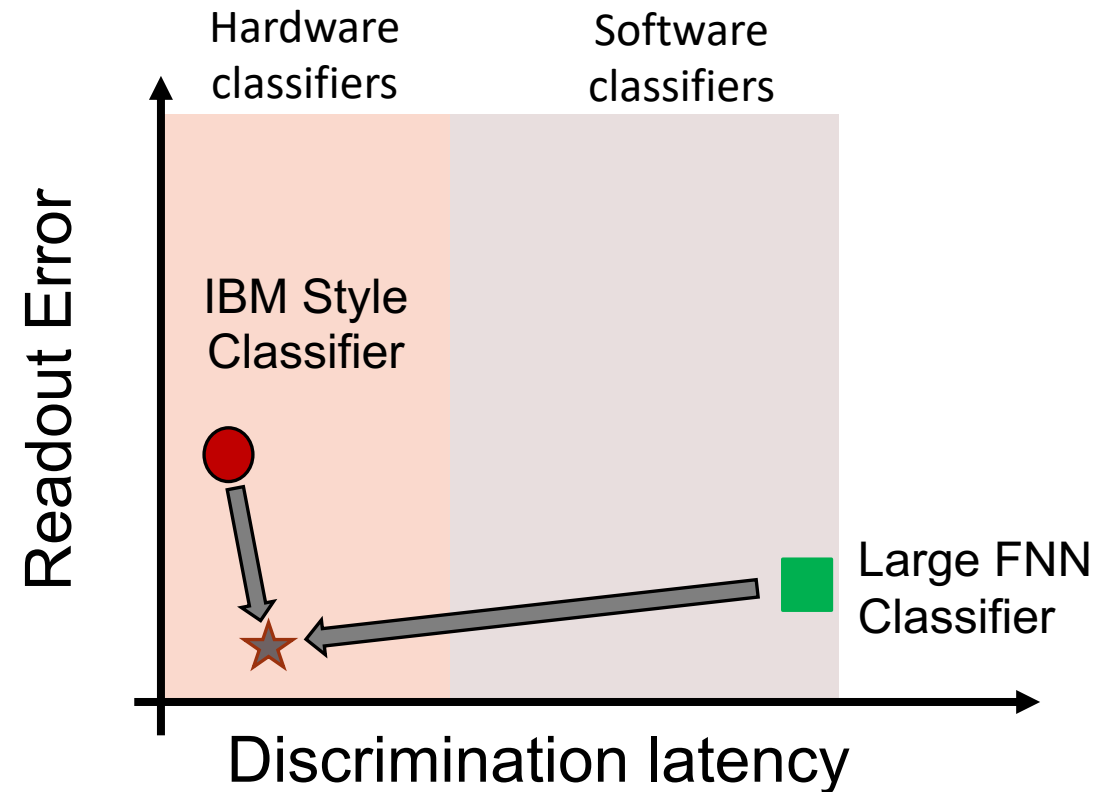
5 frequency-multiplexed superconducting qubits¹

¹Lienhard, Benjamin, et al. "Deep-neural-network discrimination of multiplexed superconducting-qubit states." *Physical Review Applied* 17.1 (2022): 014024.

Goal: Make Readout Cost Effective

Retain crosstalk mitigation advantages offered by neural networks

Reduce hardware cost and complexity



Efficient Machine Learning Systems for High-Fidelity Qubit Readout (ISCA'23)

SATVIK MAURYA

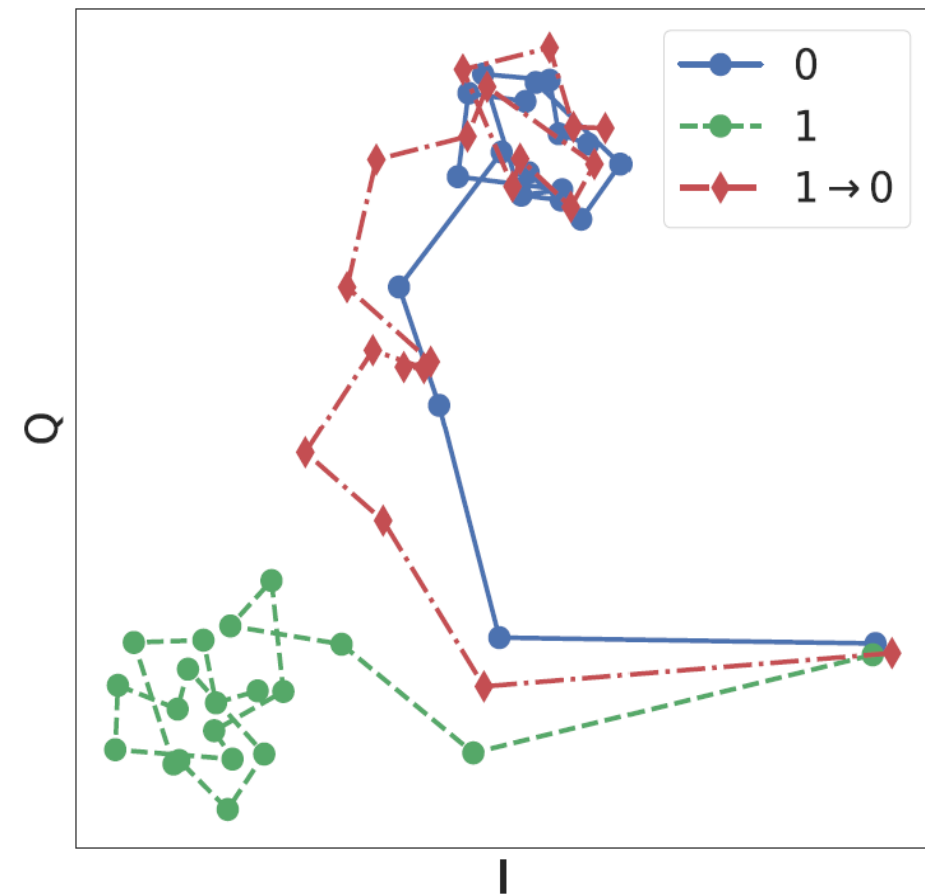
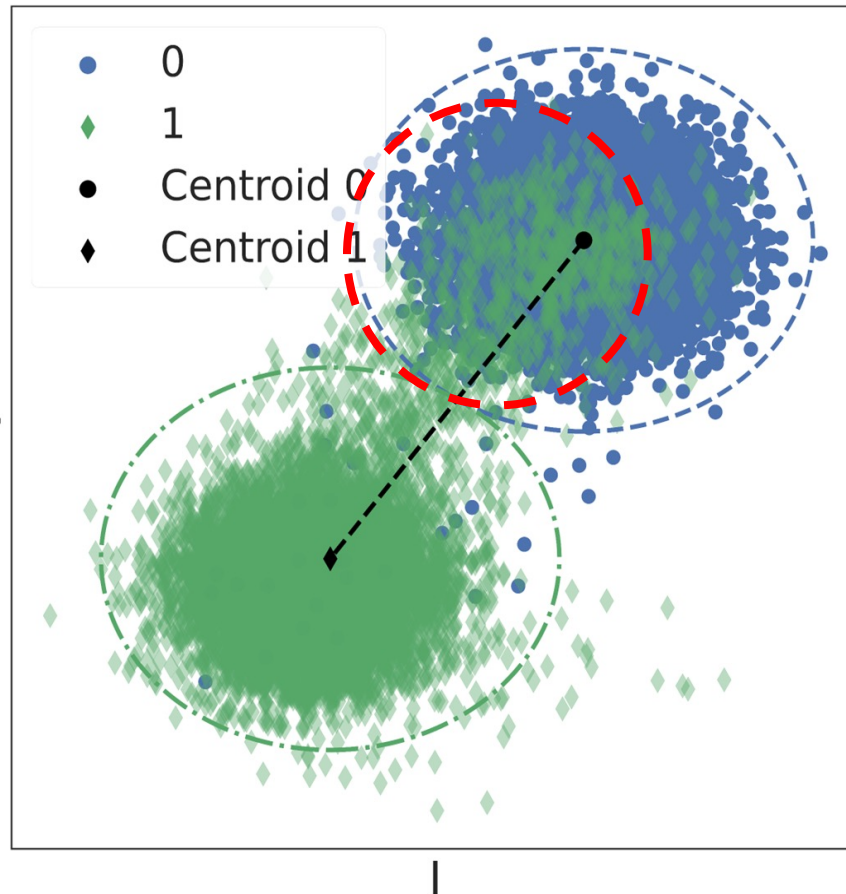
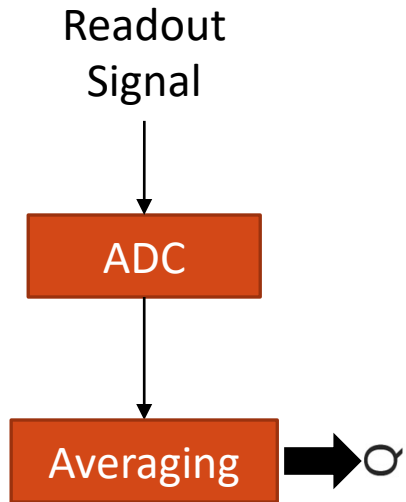
CHAITHANYA NAIK MUDE

WILLIAM D. OLIVER

BENJAMIN LIENHARD

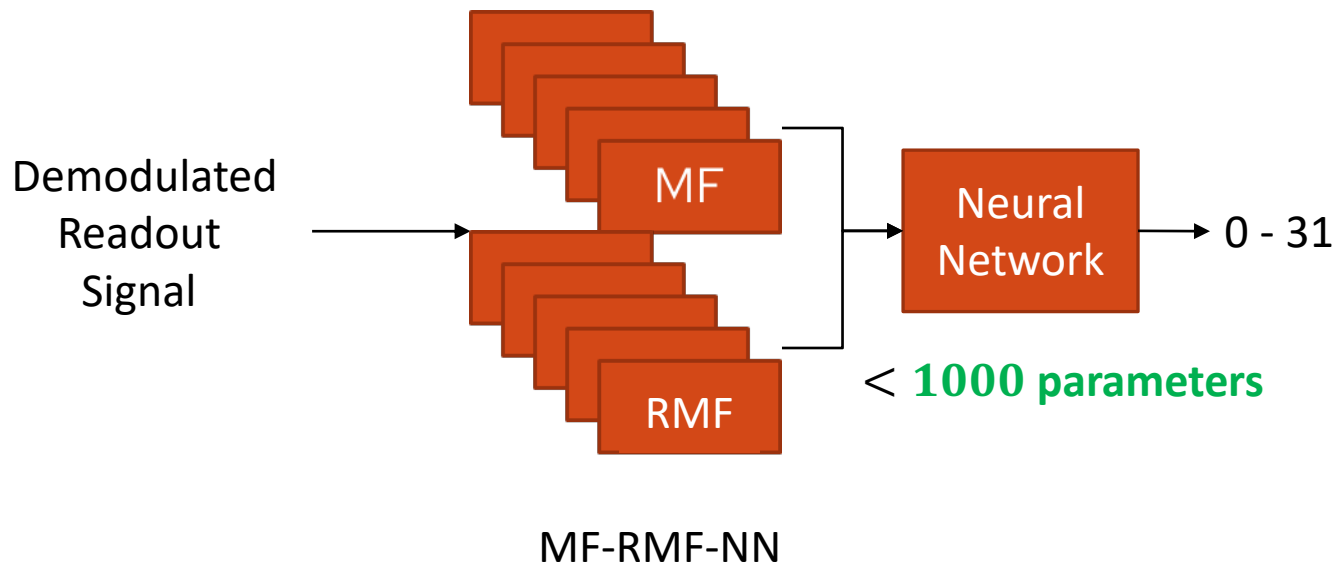
SWAMIT TANNU

Detecting Relaxations



Combining Matched Filters

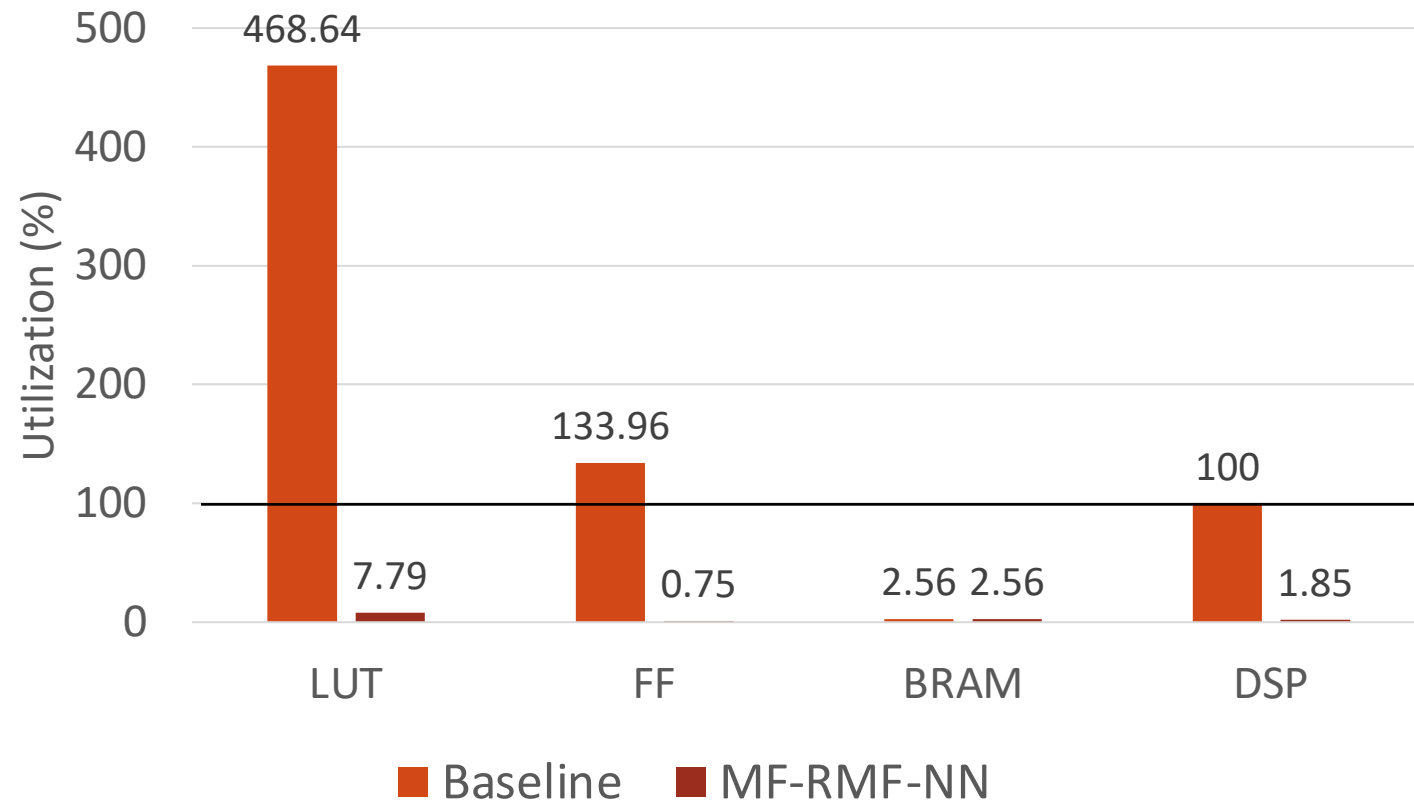
Use traces corresponding to relaxations for training Relaxation Matched Filters (RMF).



	Baseline ¹	Our
Qubit 1	0.969	0.985
Qubit 2	0.753	0.754
Qubit 3	0.943	0.966
Qubit 4	0.946	0.962
Qubit 5	0.97	0.989
\mathcal{F}_{5Q}	0.9122	0.9266

¹Lienhard, Benjamin, et al. "Deep-neural-network discrimination of multiplexed superconducting-qubit states." *Physical Review Applied* 17.1 (2022): 014024.

Hardware Utilization

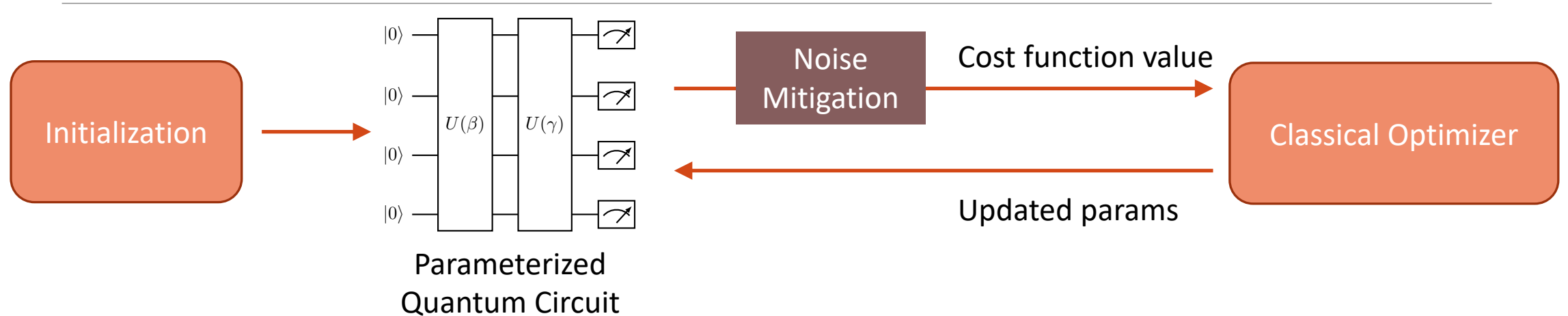


To read **five qubits**, baseline needs more resources than what we have on the FPGA, we can read **fifty qubits** with one FPGA

Lienhard, Benjamin, et al. "Deep-neural-network discrimination of multiplexed superconducting-qubit states." *Physical Review Applied* 17.1 (2022): 014024.

Software developers spend **35-50 percent of their time validating and debugging** software. The **cost of debugging**, testing, and verification is estimated to account for 50-75 percent of the total budget of software development projects, amounting to more than **\$100 billion annually**

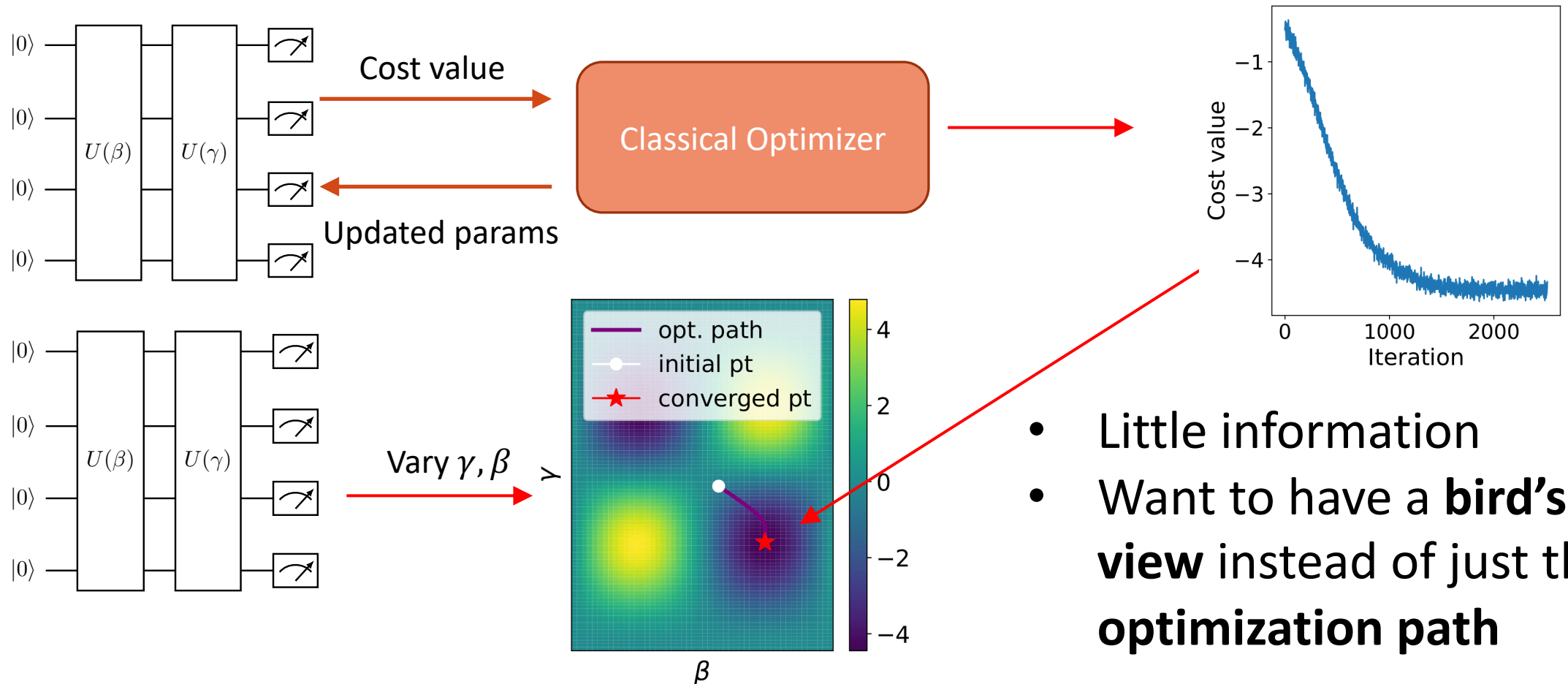
Even if they work VQAs can be hard to monetize



Running a Variational Quantum Algorithm (VQA) successfully needs:

- (1) Right initialization for circuit parameters
- (2) Appropriate noise mitigation methods
- (3) Suitable classical optimizer configurations

VQA landscapes can help



- Little information
- Want to have a **bird's eye view** instead of just the **optimization path**

High Performance Debugging for Variational Quantum Algorithms using Compressed Sensing (ISCA'23)

TIANYI HAO*

KUN LIU*

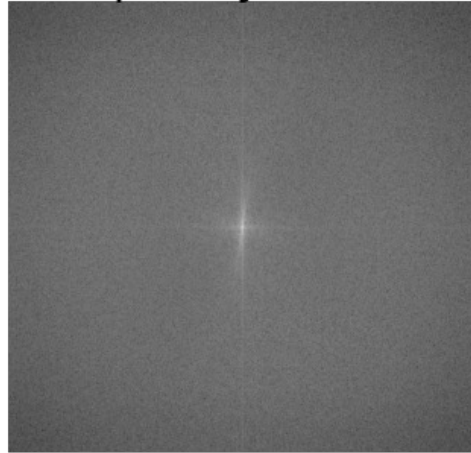
SWAMIT TANNU

Compressed Sensing

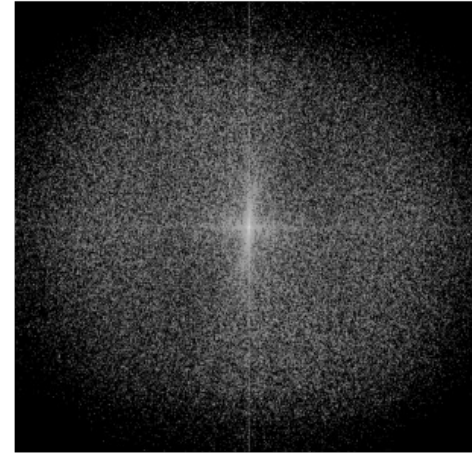
original



frequency domain



truncated



reconstructed



Candès, E.J., Romberg, J.K. and Tao, T. (2006), Stable signal recovery from incomplete and inaccurate measurements. *Comm. Pure Appl. Math.*, 59: 1207-1223. <https://doi.org/10.1002/cpa.20124>

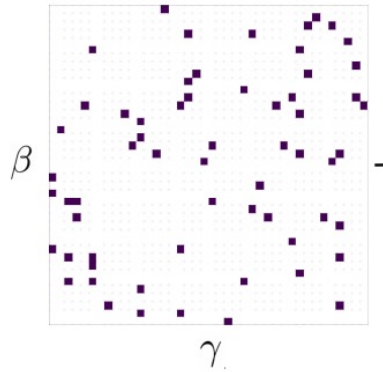
OSCAR: cOmpressed Sensing based Cost Landscape Reconstruction

① Pick small number of β, γ randomly

② Run circuit with randomly selected β, γ pairs

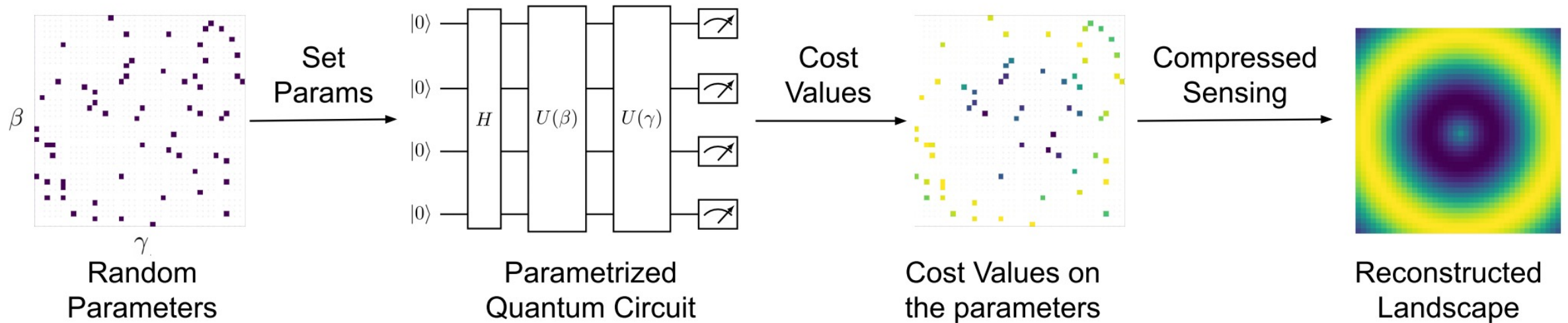
③ Generate sampled landscape

④ Reconstruct Landscape



With 5%-10% of samples, we can reconstruct the full landscape

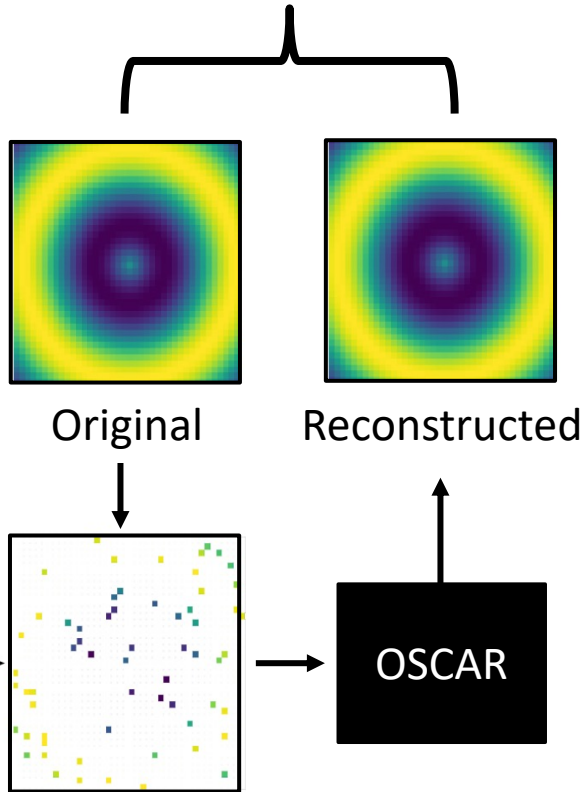
Parallel Reconstruction of Landscape



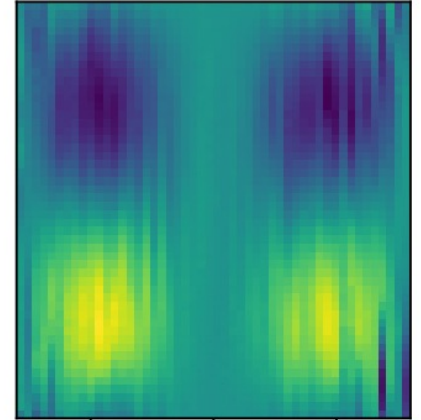
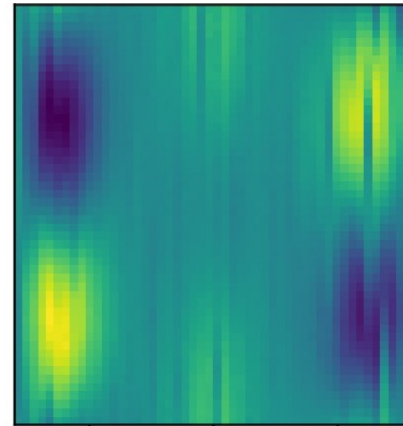
Random parameters are independent \rightarrow Embarrassingly Parallel

Evaluating Efficacy of Landscape Reconstruction

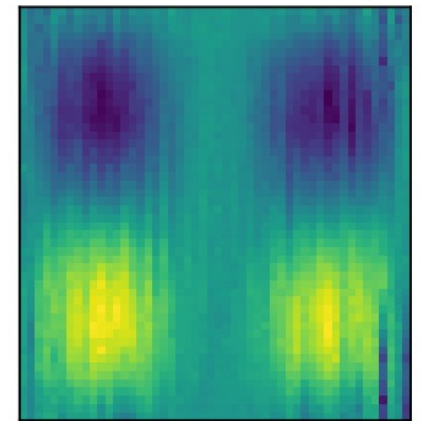
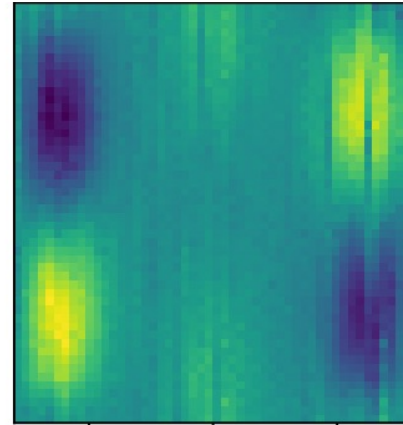
Compare, calculate similarity



Original
landscapes on
Google
Sycamore:

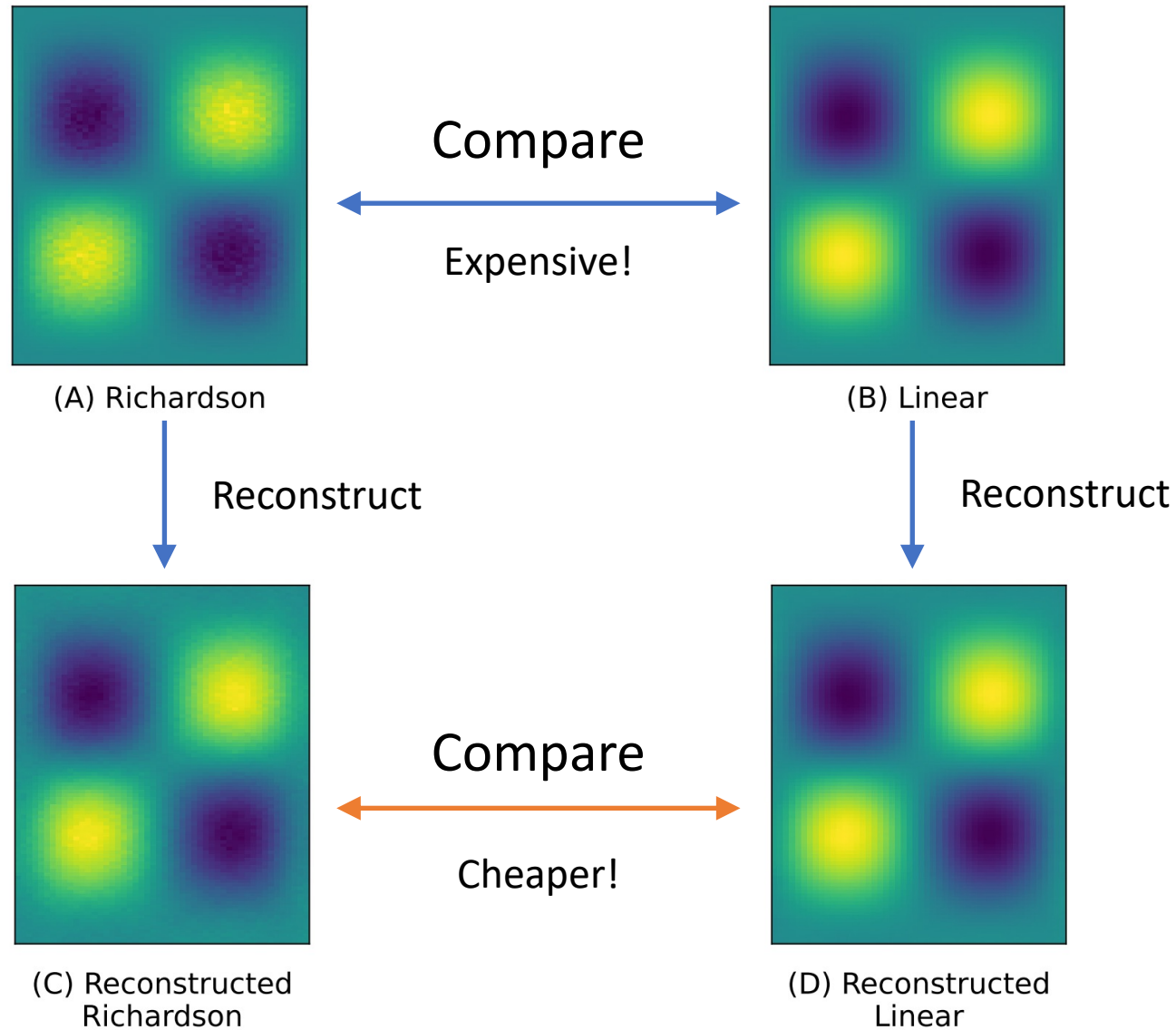


Reconstructed
landscapes:



OSCAR can efficiently and accurately reconstruct cost landscapes

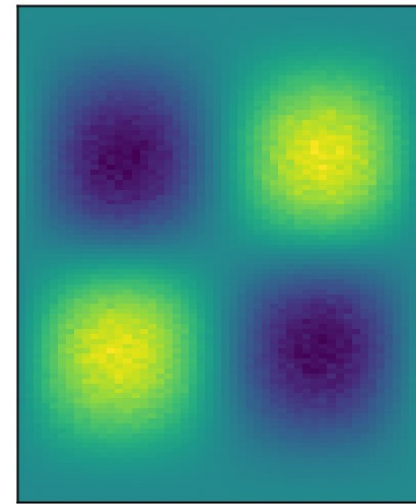
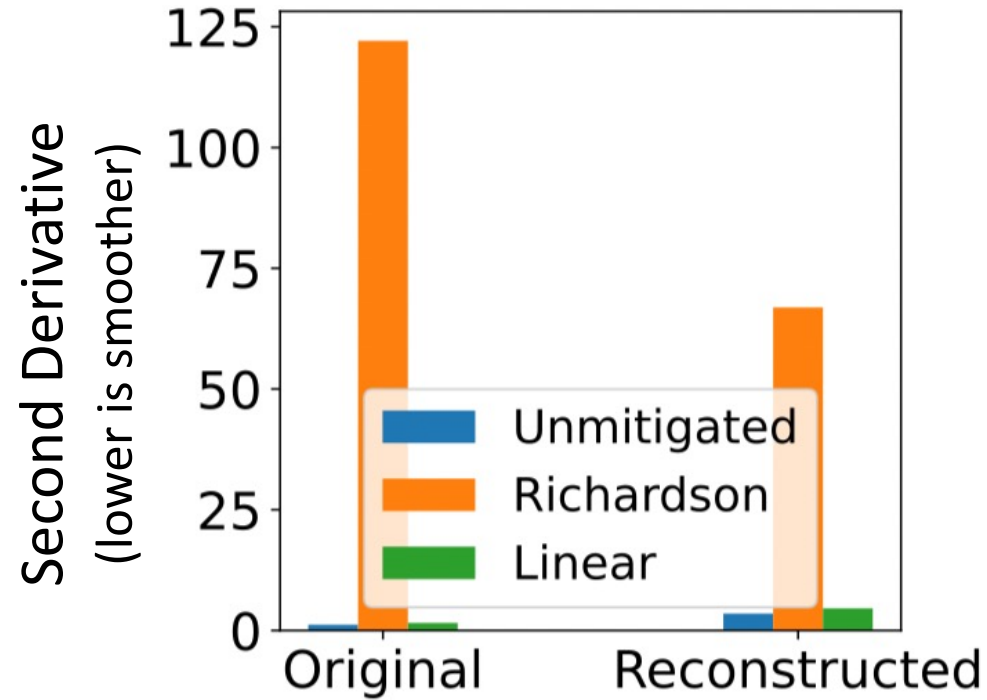
Use Case – Help benchmark efficacy of noise mitigation



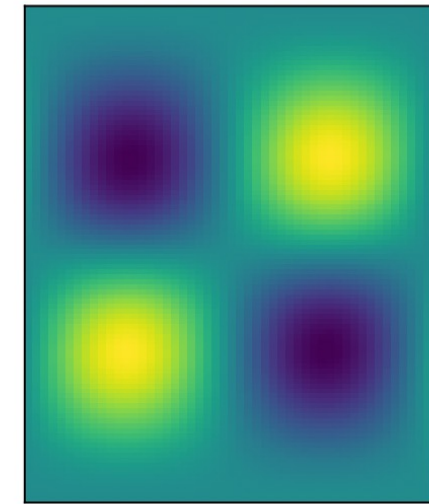
Richardson and Linear:
two mitigation methods

**Reconstructed landscapes
preserve features of the
original ones**

Recon. landscapes preserve features of the original's

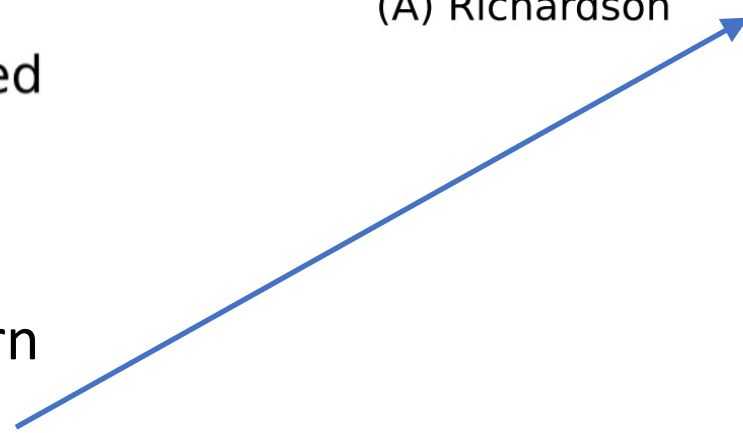


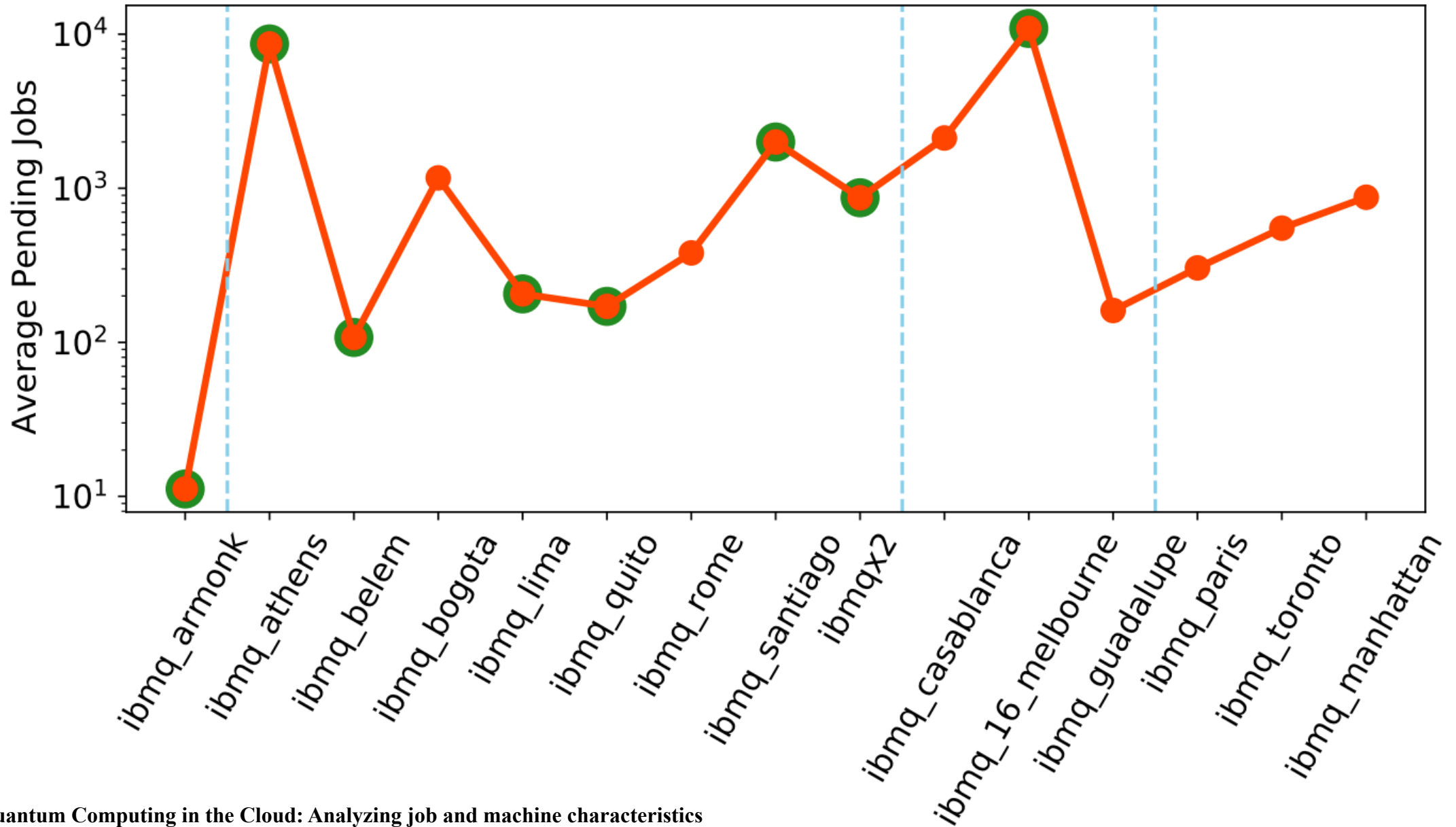
(A) Richardson



(B) Linear

- Share the similar pattern
- Match the actual case



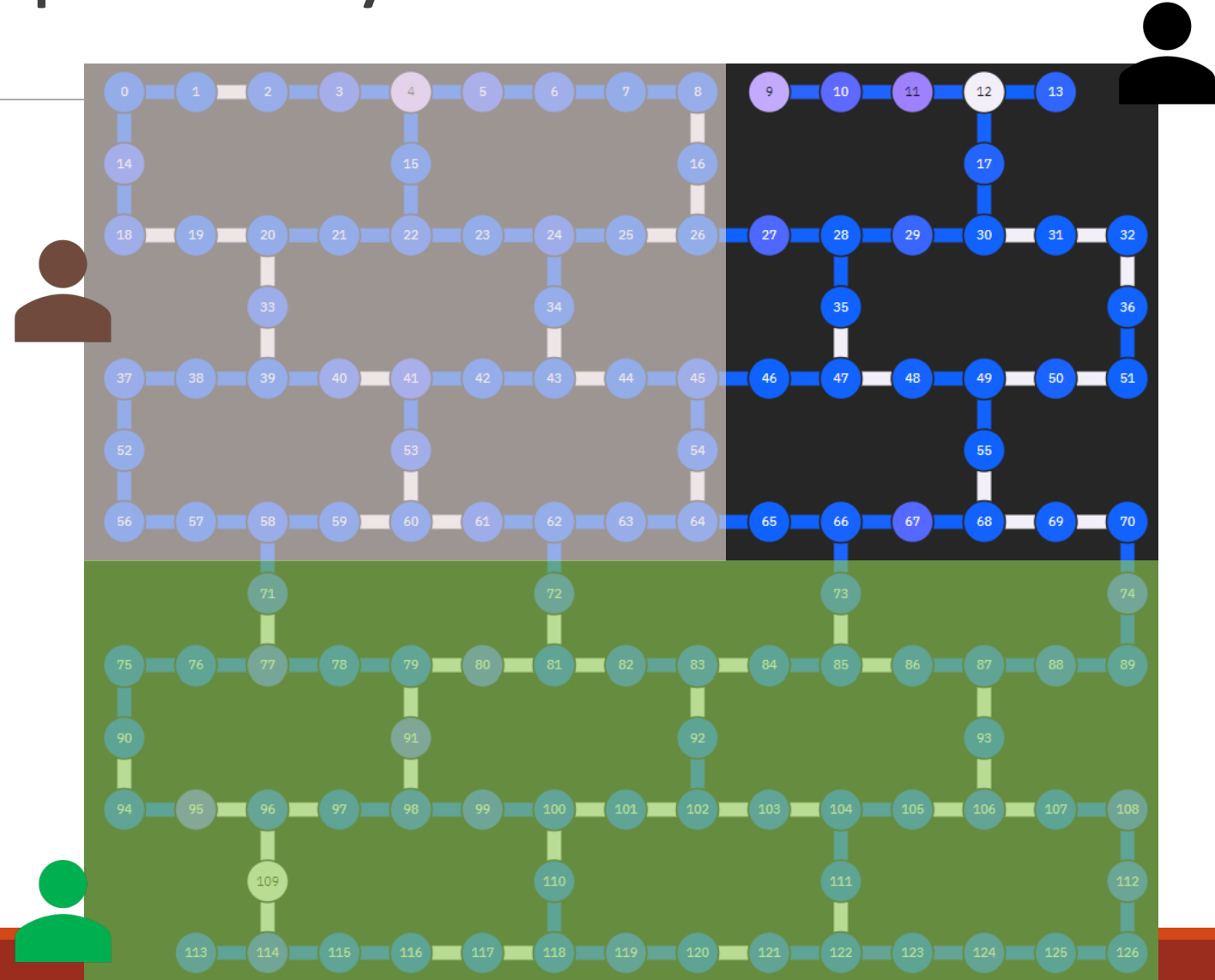


Source- Quantum Computing in the Cloud: Analyzing job and machine characteristics

Underutilized Quantum Computers Result in Large Queuing Delays

Multiprogramming: Opportunity

Partition the quantum resources enable multiprogramming to improve utilization and reduce cost



PayPal was founded in 1998, in 2000,
it lost \$6 million, or \$1,900 an hour,
to fraud at a time when its revenue
was less than \$5 million

Multiprogramming: Security Risks

Speculated Risks : DoS, learning output state, steal circuits, compiler optimizations, etc.

“Quantum Intellectual Property”
can become target

