# Noise vs quantum algorithms



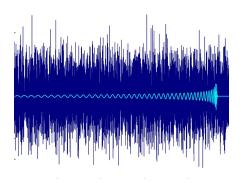
Yihui Quek MIT → EPFL





# Noise is the defining characteristic of NISQ computation!

Example: Google's fidelity for their 2019 quantum advantage demonstration was just 0.002.

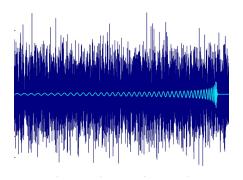


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= can we extract any signal from quantum noise?

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This talk is about **going beyond conventional wisdom** regarding this question.

Can quantum computation be made robust against errors?

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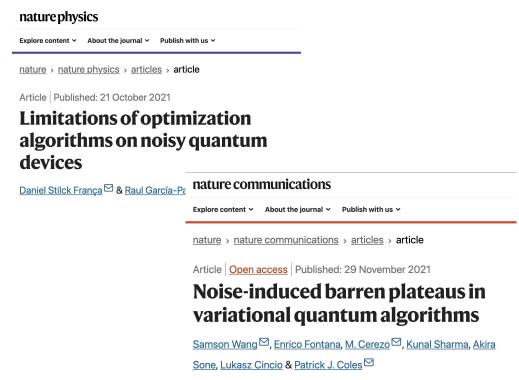
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~ 2024/2025 [This talk]: But what about NISQ+?
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### Depolarizing noise is certifiably bad news

(if you cannot error correct)



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Noise-induced barren plateaus in

variational quantum algorithms

Samson Wang 

, Enrico Fontana, M. Cerezo 

, Kunal Sharma, Akira Sone, Lukasz Cincio & Patrick J. Coles 

✓

### Depolarizing noise increases entropy!

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Depolarizing noise

acts on each qubit
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Maximally-mixed state 4 ~ uniform distribution on a single bit. Contains no information; maximally entropic!

### Depolarizing noise increases entropy rapidly!

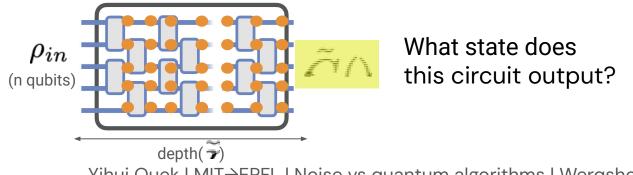
Depolarizing noise

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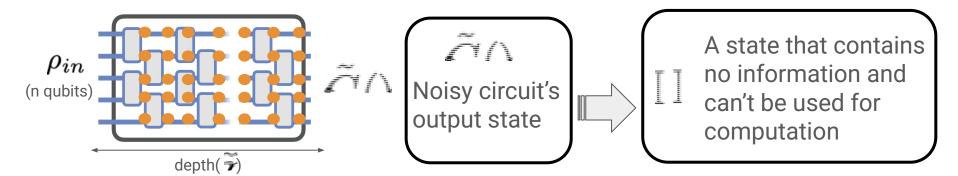
= single-qubit noise

Maximally-mixed state — uniform distribution on a single bit. Contains no information, maximally entropic!

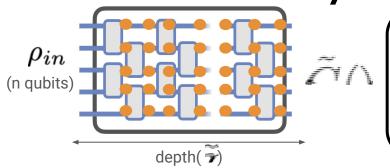
'Gate-based' noise in a circuit: noise acts after every gate!

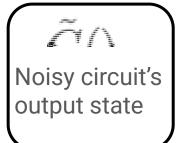


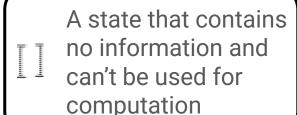
### As circuit depth increases:



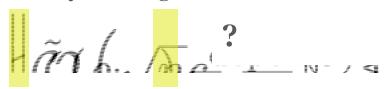
As circuit depth increases, depolarizing noisy circuit eventually outputs maximally-mixed state





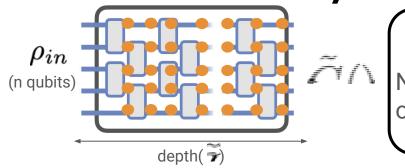


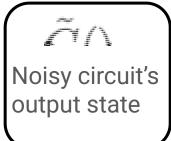
How fast do they converge?



Trace norm – measures how 'far apart' states are.

As circuit depth increases, depolarizing noisy circuit eventually outputs maximally-mixed state

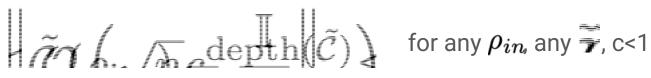






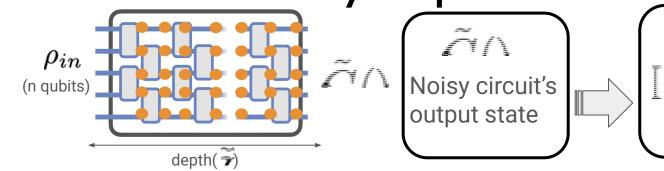
A state that contains no information and can't be used for computation

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Convergence in log depth for all circuits:(

As circuit depth increases, depolarizing noisy circuit eventually outputs maximally-mixed state



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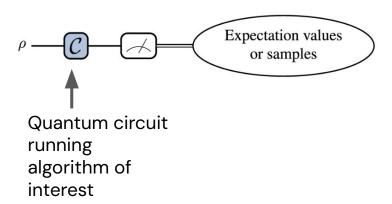
How fast do they converge?

for any 
$$ho_{in}$$
 any  $ho_{in}$ , c<1

Convergence in log depth for *all circuits* :( Huge problem for quantum advantage!

# What is error mitigation?

In a world with noiseless quantum computers:

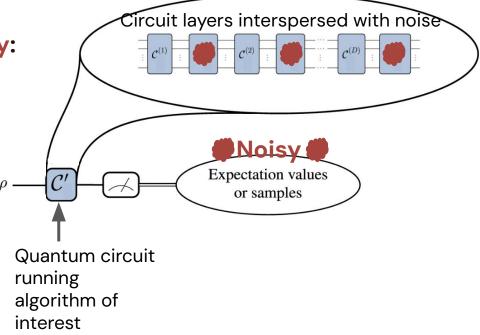


## What is error mitigation?

In the real world, C is noisy:

- qubit decoherence

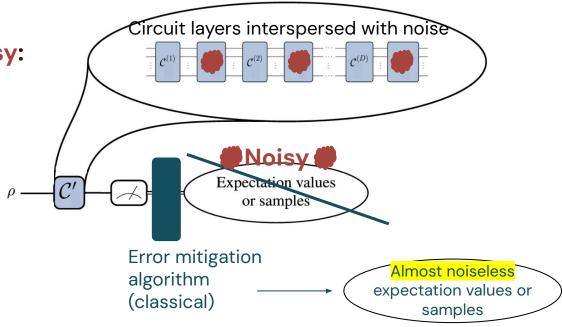
- gate errors



## What is error mitigation?

In the real world, C is noisy:

**Proposal:** revert the effect of noise on the computation result, with classical post-processing.

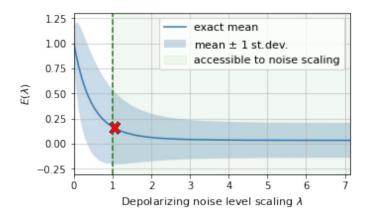


# Example of error mitigation protocol

#### Zero-noise extrapolation:

- 1) Run the circuit of interest at amplified noise level λ (call this ).
- 2) Measure





Plot taken from Giurgica-Tiron et al, 2020 IEEE International Conference on Quantum Computing and Engineering (QCE)

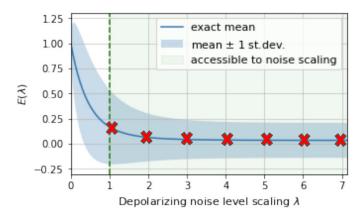
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3) Repeat steps 1, 2 for different  $\lambda$ .



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# Example of error mitigation protocol

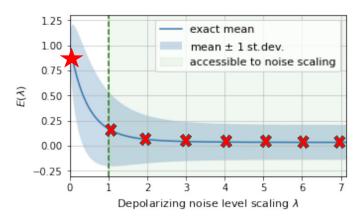
#### Zero-noise extrapolation:

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- 2) Measure



- 3) Repeat steps 1, 2 for different  $\lambda$ .
- 4) Output the extrapolated value



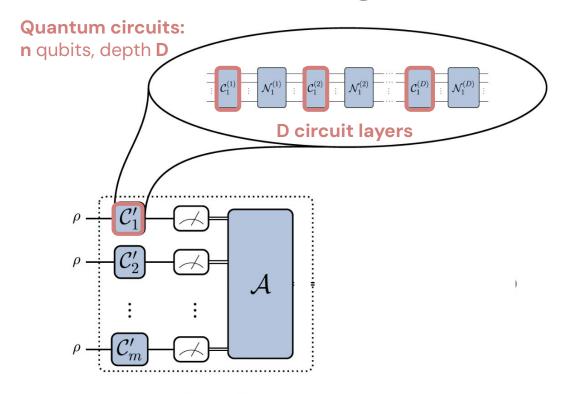


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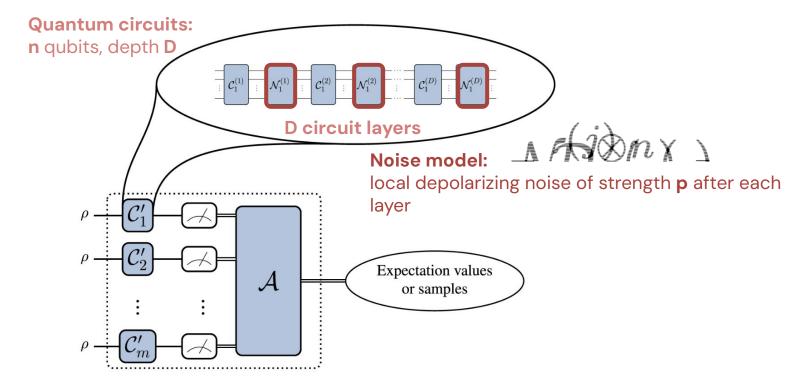
# Our model of error mitigation

/ = error mitigation algorithm **Expectation values** or samples

## Our model of error mitigation



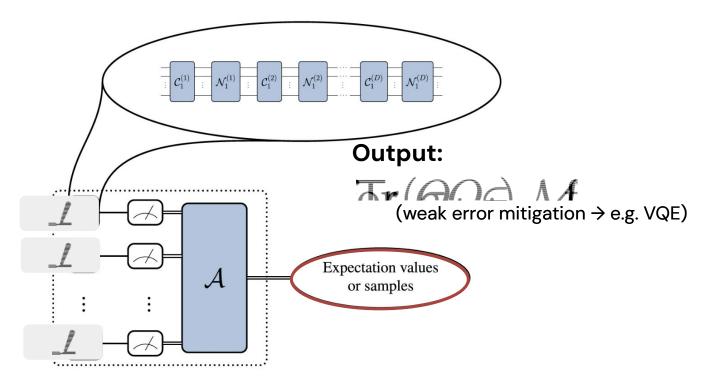
# Our model of error mitigation



# Input to /

Input: Copies of <u>I</u> output by circuits with depolarizing noise of **Expectation values** strength p or samples

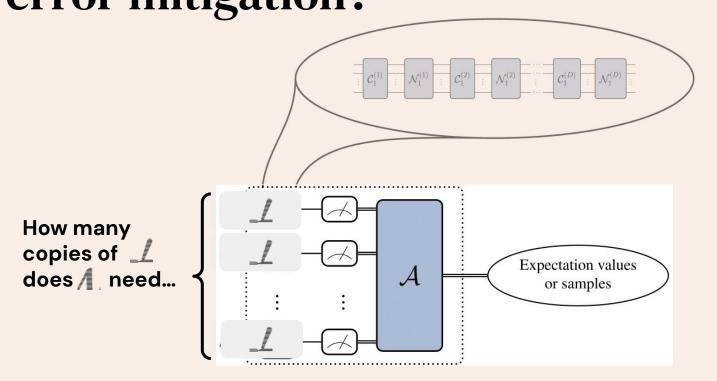
# Output of /



# Output of /

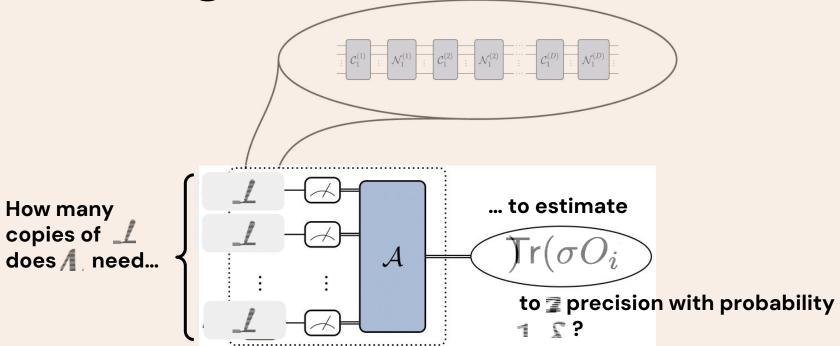
**r** = noiseless circuit output state **Output:** \_\_\_\_\_ noisy circuit Tr(AOA) 1A output state (weak error mitigation  $\rightarrow$  e.g. VQE) **Expectation values** or samples

Our question: sample complexity of error mitigation?

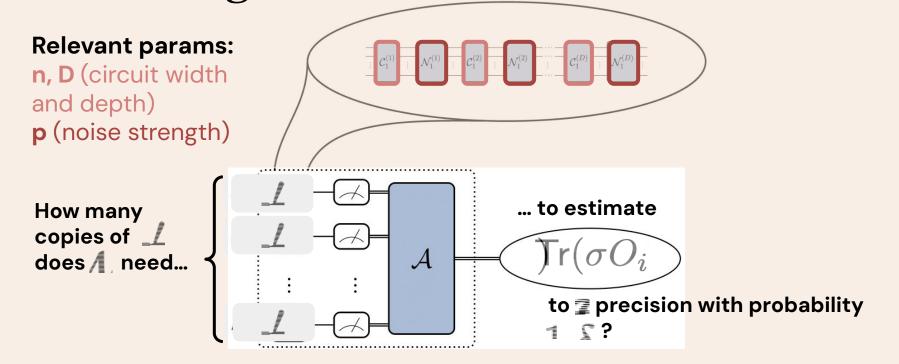


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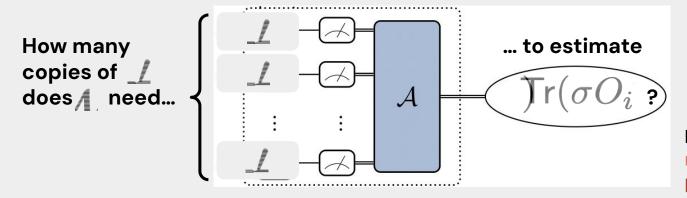
error mitigation?



Our question: sample complexity of error mitigation?



### Our lower bounds



#### Relevant parameters:

n, D (circuit width/depth); p (depolarizing noise strength)

Thm 1: (1 + 1) if circuit outputting 1 has depolarizing noise and is of depth (1 + 1).

## How to interpret our results

We show:  $\exp(\Omega(nD))$  runs of a depolarizing-noisy circuit are required for good error mitigation.

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- Previous belief:  $\exp(\Omega(D))$  copies required.
- But NISQ circuits are depth ( ): our result is exponentially stronger.
- Loss of quantum advantage for error-mitigated algorithms may occur earlier than expected in the presence of noise

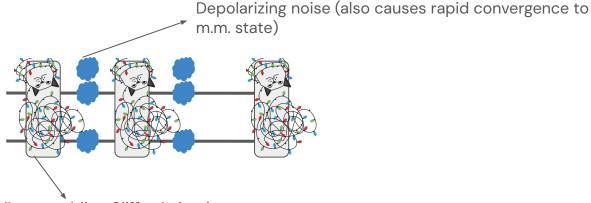
### **Proof intuition**

Question: How many copies of \_\_\_ are needed for EM?

### **Proof intuition**

#### 

We construct such circuits:



Extremely rapidly scrambling Clifford circuits → quick convergence to m.m. state

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We construct such circuits:

→ quick convergence to m.m. state

Extremely rapidly scrambling Clifford circuits

Depolarizing noise (also causes rapid convergence to

What this captures:

depolarizing noise and the
circuits 'conspire' to push the
state toward maximally mixed.

With no intermediate measurements, you are at the mercy of entropy generation.

#### Not all noise is depolarizing!

See: T1 decay, atom loss, photon loss.



Superconducting qubits (Google, IBM, Rigetti)



Neutral atom arrays (e.g. Lukin group/QuEra)

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Superconducting aubits

Neutral atom arrays

| Error source                 | Time optimal    | Smooth amplitude | Error type X, Y, Z, LG, AL** |
|------------------------------|-----------------|------------------|------------------------------|
| Scattering*  1>              | 0.103% / 0.043% | 0.036%           | 6%, 6%, 25%, 47%, 15%        |
| Scattering  0>               | 0.019%          | 0.025%           | 7%, 7%, 14%, 62%, 10%        |
| Rydberg $T_1 = 88 \mu s$     | 0.113%          | 0.085%           | 2%, 2%, 6%, 23%, 67%         |
| Rydberg $T_2^* = 3 \mu s$    | 0.134%          | 0.089%           | 0%, 0%, 75%, 0%, 25%         |
| Position fluct.              | 0.012%          | 0.054%           | 0%, 0%, 96% 0%, 4%           |
| Rydberg $m_{J}=-\frac{1}{2}$ | 0.06 - 0.15%    | 0.01%            |                              |
| Total fidelity               | 99.53 - 99.62%  | 99.70%           | 2%, 2%, 41%, 17%, 38%        |

From <u>High-fidelity parallel entangling gates on a neutral-atom quantum computer</u>

Yihui Quek | MIT>EPFL | Noise vs quantum algorithms | Werqshop

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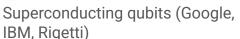
Definition of non-unital quantum channel: doesn't preserve the m.m. state.

Canonical example: amplitude damping noise! ~ partial reset-to-|0>

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Definition of non-unital quantum channel: doesn't preserve the m.m. state.

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Non-unital noise: physically important yet shockingly understudied!

# Fantastic features of non-unital noise and where to find them:

I will use amplitude-damping noise as a concrete example; behaviors hold for general non-unital noise.



Depolarizing noise tends to "scramble" the distribution by increasing entropy.

Fixed point: maximally-mixed state



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Amplitude damping noise tries to "unscramble" the distribution by decreasing entropy!

Fixed point: IO>



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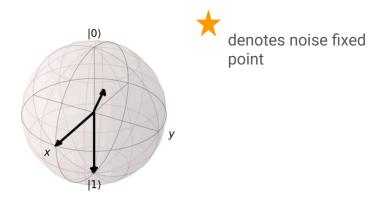
Fixed point: maximally-mixed state

Amplitude damping noise tries to "unscramble" the distribution by decreasing entropy!

Fixed point: |0>

Consequence: The same circuit, with depolarizing noise and with amplitude damping noise, acts very differently on the Bloch sphere!

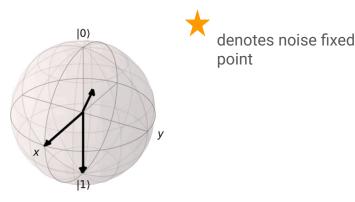
Circuit with depolarizing noise



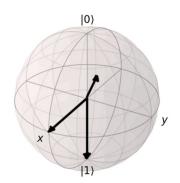
Noise drives input towards the center of Bloch sphere.

Circuit with depolarizing noise

Circuit with amplitude damping noise



Noise drives input towards the center of Bloch sphere.



Noise drives input towards the north pole of Bloch sphere.

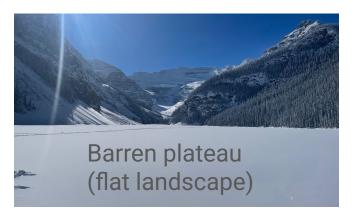
### Consequence: No barren plateaus

Circuits used for quantum machine learning often display barren plateaus, making them hard to optimize.



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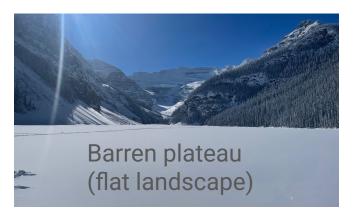


We show: optimization landscape under non-unital noise is **not barren**.



### Consequence: No barren plateaus

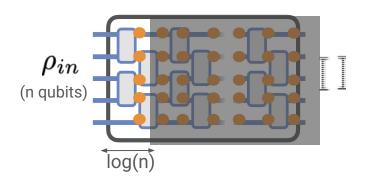
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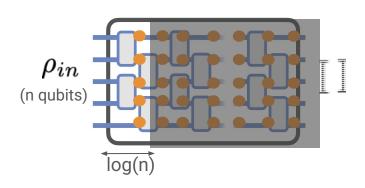


Important limitation: we don't show that the resulting peak is at the location of minimum energy, but others have tackled this.



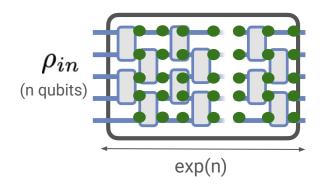
With no error correction,

depolarizing noise erases all
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log(n) depth.



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#### **Quantum refrigerator proposal:**

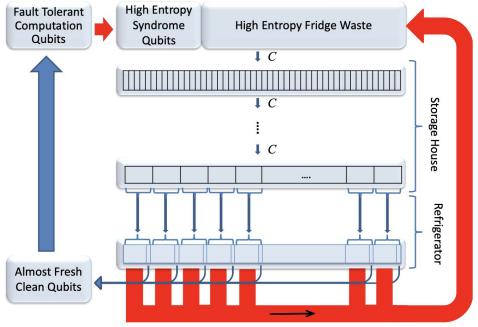
Even with no error correction, non-unital noise can be leveraged to compute for exp(n) depth!

Key idea [Aharonov/Ben-Or 1999]: it's possible to do fault-tolerant quantum computation without intermediate measurements if one supplies fresh auxiliary qubits in the state |O>.

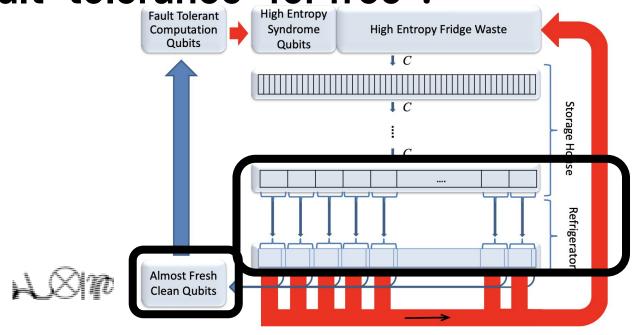
Key idea [Aharonov/Ben-Or 1999]: it's possible to do fault-tolerant quantum computation without intermediate measurements if one supplies fresh auxiliary qubits in the state |O>.

Quantum refrigerator [Gottesman, Ben-Or 2013]: Let's use **non-unital noise** to supply us with qubits in the state |O>!

Remember: Amplitude-damping noise ~ reset-to-all-Os

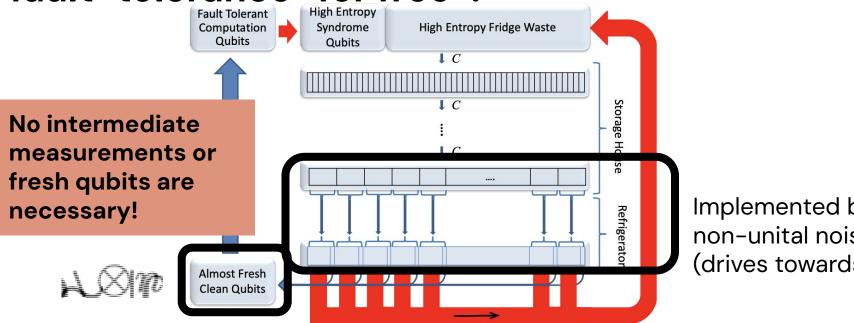


Quantum refrigerator, Ben-Or, Gottesman, Hassidim (arXiv 1301.1995)



Implemented by non-unital noise (drives towards )

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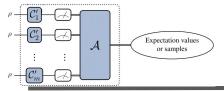


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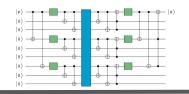
# Application: Error recovery beyond error mitigation?

#### **Error mitigation**



Few quantum resources but high sample complexity

#### **Error correction**



Sample-efficient but large quantum resource burden

Application: Error recovery beyond error mitigation?



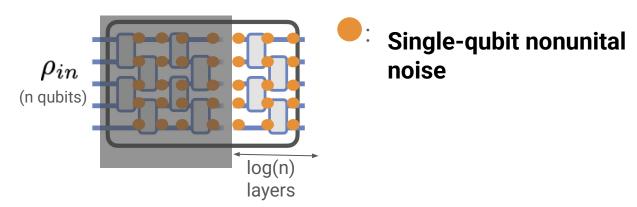
Is the "quantum refrigerator" exactly what we need?

#### A limitation to bear in mind

For a circuit with *random* gates, non-unital noise (like depolarizing noise) also creates **effectively shallow circuits**.

#### A limitation to bear in mind

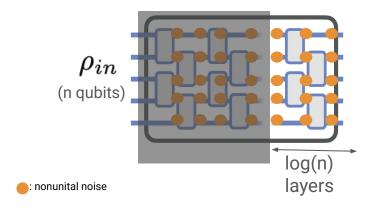
For a circuit with *random* gates, non-unital noise (like depolarizing noise) also creates **effectively shallow circuits**.



All gates more than log(n) layers from the last layer cannot influence expectation values by much!

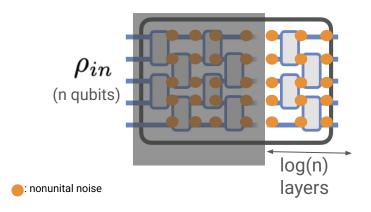
Million-dollar question: Can you still get quantum advantage via nonunital noise for a sampling task?

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Effective shallow depth picture only holds for local expectation values.

### **Million-dollar question:** Can you still get quantum advantage via nonunital noise for a *sampling* task?



Effective shallow depth picture only holds for local expectation values.

On verifiable quantum advantage with peaked circuit sampling

Scott Aaronson<sup>\*1</sup> and Yuxuan Zhang<sup>⊙†2,3</sup>

 <sup>1</sup>Department of Computer Science, The University of Texas at Austin.
 <sup>2</sup>Department of Physics and Centre for Quantum Information and Quantum Control, University of Toronto

 $^3$ Vector Institute for Artificial Intelligence, W1140-108 College Street, Schwartz Reisman Innovation Campus, Toronto, Ontario M5G 0C6, Canada

Can non-unital noise help you to hide a peak in a **shallow depth circuit**? Hide = classical computer cannot tell from circuit description if peaked or random.

#### Exponentially tighter bounds on limitations of quantum error mitigation

Yihui Quek,<sup>1</sup> Daniel Stilck França,<sup>2,3,1</sup> Sumeet Khatri,<sup>1</sup> Johannes Jakob Meyer,<sup>1</sup> and Jens Eisert<sup>1,4</sup>

<sup>1</sup> Dahlem Center for Complex Quantum Systems,
Freie Universität Berlin, 14195 Berlin, Germany

<sup>2</sup> Department of Mathematical Sciences, University of Copenhagen, 2100 København, Denmark

<sup>3</sup> Univ Lyon, Inria, ENS Lyon, UCBL, LIP, F-69342, Lyon Cedex 07, France.

<sup>4</sup> Helmholtz-Zentrum Berlin für Materialien und Energie, 14109 Berlin, Germany

Quantum error mitigation has been proposed as a means to combat unwanted and unavoidable errors in near-term quantum computing by classically post-processing outcomes of multiple quantum circuits. It does so in a fashion that requires no or few additional quantum resources, in contrast to fault-tolerant schemes that come along with heavy overheads. Error mitigation leads to noise reduction in small schemes of quantum computation. In this work, however, we identify strong limitations to the degree to which quantum poice can be offertively independent for larger water gives.

(Dated: November 14, 2022)





#### Noise-induced shallow circuits and absence of barren plateaus

Antonio Anna Mele,<sup>1,\*</sup> Armando Angrisani,<sup>2,3,†</sup> Soumik Ghosh,<sup>4</sup> Sumeet Khatri,<sup>1</sup> Jens Eisert,<sup>1,5</sup> Daniel Stilck França,<sup>6,‡</sup> and Yihui Quek<sup>7,§</sup>

<sup>1</sup>Dahlem Center for Complex Quantum Systems, Freie Universität Berlin, 14195 Berlin, Germany 
<sup>2</sup>LIP6, CNRS, Sorbonne Université, 75005 Paris, France

<sup>3</sup>Institute of Physics, Ecole Polytechnique Fédérale de Lausanne (EPFL), CH-1015 Lausanne, Switzerland

<sup>4</sup>Department of Computer Science, University of Chicago, Chicago, Illinois 60637, USA

<sup>5</sup>Fraunhofer Heinrich Hertz Institute, 10587 Berlin, Germany

<sup>6</sup>Univ Lyon, ENS Lyon, UCBL, CNRS, Inria, LIP, F-69342, Lyon Cedex 07, France

<sup>7</sup>Departments of Mathematics and Physics, Massachusetts Institute of Technology, 182 Memorial Drive, Cambridge, MA 02138, USA (Dated: October 11, 2024)

Motivated by realistic hardware considerations of the pre-fault-tolerant era, we comprehensively study the impact of uncorrected noise on quantum circuits. We first show that any noise 'truncates' most quantum circuits to effectively logarithmic depth, in the task of estimating observable expectation values. We then prove that quantum circuits under any non-unital noise exhibit lack of barren plateaus for cost functions composed of local.

