

# Optimal parametric quantum channels for quantum computing

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We stress the need for a perspective shift for computations in the NISQ era:

replacing (unitary) circuits by non-unitary protocols,  $U \rightarrow \mathcal{E}$

Even with fault-tolerance, some problems involve a mixed state preparation/evolution (for example for thermal states or for modeling open systems).

## From unitary to non-unitary channels

### Ideally

Unitary circuit: pure to pure

$$|\psi\rangle \rightarrow |\psi'\rangle = U|\psi\rangle$$

### Realistically

Quantum channel: mixed/pure to mixed

$$\rho \rightarrow \rho' = \mathcal{E}(\rho) = \sum_{\alpha} K_{\alpha} \rho K_{\alpha}^{\dagger}$$

In general, noisy hardware would make any ideal unitary operator into a quantum channel:  $\mathcal{E}_U(\rho) \equiv U\rho U^{\dagger} \xrightarrow{\text{noise}} \tilde{\mathcal{E}}_U(\rho)$

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*Pseudoinversion* might still be possible: better results with smaller chunks.

Quantum channels can also be engineered through partial measurements and/or stochastic sampling, not only noise.



## Some useful channel representations

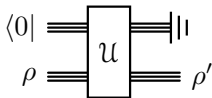
One can engineer a channel through Stinespring representation or via statistical sampling of circuit ensembles (mixed-unitary channels).

### Stinespring representation

Unitary on extended space  $\mathcal{A} \otimes \mathcal{H}$  without measurement on ancilla register  $\mathcal{A}$ :

$$\rho \rightarrow \rho' = \text{Tr}_{\mathcal{A}}[\mathcal{U}(|0\rangle\langle 0|_{\mathcal{A}} \otimes \rho)],$$

$$\mathcal{U} \in \text{SU}(2^{q+a})$$



### Stochastic sampling

Sample from circuits ensemble  $\{U_i\} \sim w(U)$ :

$$\rho \rightarrow \rho' \simeq \frac{1}{M} \sum_{i=1}^M U_i \rho U_i^\dagger$$

$$\rho' = \int_{\text{SU}(2^q)} dU w(U) U \rho U^\dagger$$

sampling from  $w(U)$

The diagram shows a box labeled  $U_i$ . An input line labeled  $\rho$  enters the box from the left. An output line labeled  $\rho'_i$  exits the box to the right. An arrow points from this box to the right, where the text  $\rho' = \text{mean}\{\rho'_i\}$  is written.

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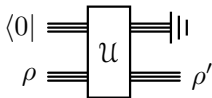
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$$\rho \equiv U_i \equiv \rho'_i \rightarrow \rho' = \text{mean}\{\rho'_i\}$$

In either representation, we can parameterize the protocol ( $\mathcal{U}_{\vec{\theta}}$  or  $w_{\vec{\theta}}(U)$ ).



## Optimizing channels for unitary targets

Unitary task:

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We can engineer a parametric quantum channel  $\tilde{\mathcal{E}}_U^{(\vec{\theta})}$  where non-unitarity is partially under control.

Our aim is then to minimize the difference between target and real parameterized channel

$$C(\vec{\theta}) \equiv d(\mathcal{E}_U, \tilde{\mathcal{E}}_U^{(\vec{\theta})})$$

## Proper distance between channels: the diamond norm

[A. Yu. Kitaev and A. Shen, *Classical and quantum computation* (2002)]

[M. Kliesch, R. Kueng, J. Eisert and D. Gross, *Improving Compressed Sensing With the Diamond Norm* (2016)]

A proper definition of distance between two quantum channels  $\mathcal{E}_1, \mathcal{E}_2$  is the **diamond norm** of their difference:

$$d_{\diamond}(\mathcal{E}_1, \mathcal{E}_2) \equiv \frac{1}{2} \sup_{n, \xi \geq 0} \text{Tr} |(\mathcal{I}_n \otimes \mathcal{E}_1)(\xi) - (\mathcal{I}_n \otimes \mathcal{E}_2)(\xi)|.$$

Each channel  $\mathcal{E}_i$  in  $\mathcal{H}$  is *trivially* extended to an operator  $\mathcal{I}_n \otimes \mathcal{E}_i$  in  $\mathcal{A} \otimes \mathcal{H}$  ( $n = \dim \mathcal{A}$ ), but states  $\xi$  can have *non-zero entanglement entropy* between  $\mathcal{A}$  and  $\mathcal{H}$  subsystems.

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Fortunately, by *convexity*,  $d_{\diamond}$  is saturated by  $\xi$  pure states  
 $\implies$  possible preparation via unitaries:  $\xi = V |0\rangle\langle 0| V^{\dagger}$ . Trace distance can be estimated, e.g., via randomized measurements.

## Known error mitigation techniques as particular cases

Mixed protocol can be implemented in different flavours, some specializing into already well known mitigation techniques:

- unitary mitigation channels as optimal encoders-decoders (e.g., **dynamical decoupling** in the case of identity maps);
- optimal sampling of ideally equivalent circuit ensembles (similar to **randomized compiling**);
- non-unitary mitigation channels as optimal channel encoders-decoders;
- non-unitary mitigation channel as embedded gate sampling;
- general circuits ensembles (e.g., optimal VQE ensembles of circuits as self-mitigating protocols).

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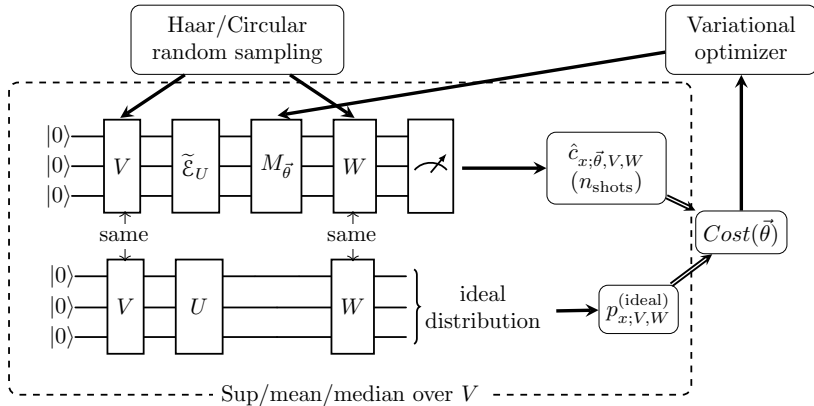
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- non-unitary mitigation channel as embedded gate sampling;
- general circuits ensembles (e.g., optimal VQE ensembles of circuits as self-mitigating protocols).

The more the freedom in modeling  $\tilde{\mathcal{E}}(\vec{\theta})$  the higher the training costs: some tradeoff is in order.

## Simple example: unitary decoding

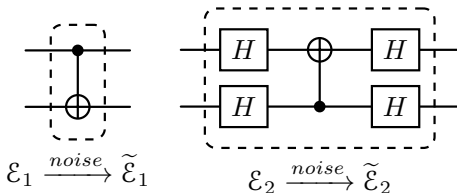
A single parameterized circuit  $M_{\vec{\theta}}$  is trained to partially correct noise in  $\tilde{\mathcal{E}}_U$ .



This also gives some explanation on how VQE algorithms are typically robust on noisy hardware.

## Case study: stochastic CNOT with asymmetric noise

Let us consider  $U = \text{CNOT}$



Without noise  $\mathcal{E}_1 = \mathcal{E}_2 = \mathcal{E}_{\text{CNOT}}$ .

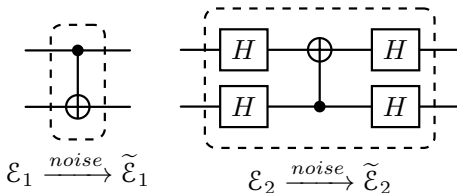
With asymmetric noise between the two qubits, the noisy version  $\tilde{\mathcal{E}}_i$  are different!

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One can convexly mix the two channels with weights  $w_i$ :

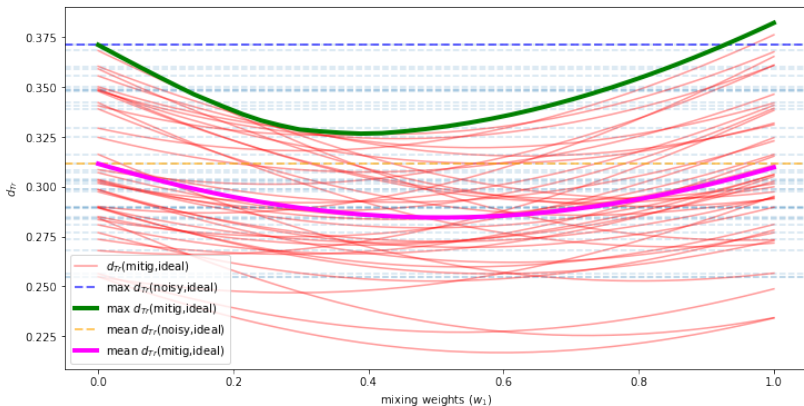
$$\tilde{\mathcal{E}}^{(\vec{w})} = w_1 \tilde{\mathcal{E}}_1 + w_2 \tilde{\mathcal{E}}_2 = w_1 \tilde{\mathcal{E}}_1 + (1 - w_1) \tilde{\mathcal{E}}_2.$$

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## Case study – stochastic CNOT with asymmetric noise: distance

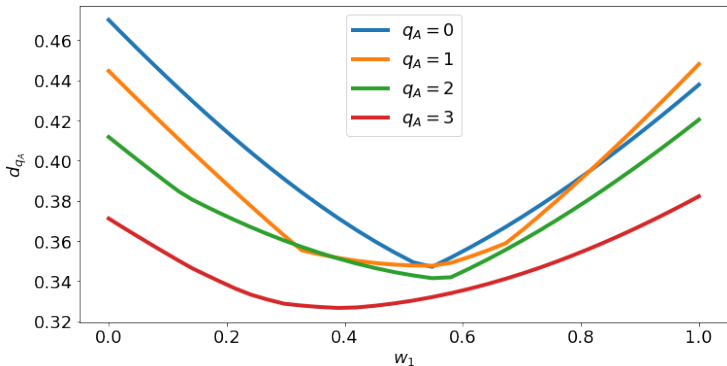
Cost as function of mixing weight  $w_1$  for different input states



Minmaxing would select the best worst case  $w_1^{(\text{opt})} \simeq 0.4$ .

## Case study – stochastic CNOT with asymmetric noise: extension dependence

Dependence on the extension dimension  $2^{q_A}$  for diamond norm



In this case, no degradation on extension is observed.



## Summary

Some main useful properties of mixed state quantum computation via parameterized quantum channels:

- generalizes unitary computing to NISQ era (give up ideal unitarity);
- it reduces to standard error mitigation techniques in some particular cases;
- can be realized in many different variants, depending on the task;
- it adapts to the specific noise properties of the QPU and gates/qubits involved.

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**Thank you**