



#### **Evaluation quantum gradient through quantum non-demolition measurements**

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#### Collaboration

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## **Variational problem**

- Find the minimum of a function  $\hat{H}(\vec{\theta})$   $\vec{\theta} = \text{parameter vector}$
- We know that for any state

 $\langle H(\vec{\theta}) \rangle = \langle \psi | \hat{H}(\vec{\theta}) | \psi \rangle \ge E_g \qquad E_g = \text{minimum energy}$ 

• For a generic operator we define a cost function that is the associated to its average value

 $f(\boldsymbol{\theta}) = \langle \psi(\boldsymbol{\theta}) | \hat{M} | \psi(\boldsymbol{\theta}) \rangle = \langle 0 | U^{\dagger}(\boldsymbol{\theta}) \hat{M} U(\boldsymbol{\theta}) | 0 \rangle$ 

## Variational problem

$$f(\boldsymbol{\theta}) = \langle \psi(\boldsymbol{\theta}) | \hat{M} | \psi(\boldsymbol{\theta}) \rangle = \langle 0 | U^{\dagger}(\boldsymbol{\theta}) \hat{M} U(\boldsymbol{\theta}) | 0 \rangle$$

• Circuit in a quantum computer



• Cost

m measurements

 $2k \longrightarrow 2km$  total logical operators

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## Variational problem: classical



- Gradient allows us to gain more information and speed up the convergence
- It needs the *first derivative* of *f*
- The Newton optmizer uses second derivatives

## Variational quantum algorithm

• For the quantum case the first derivative can be obtained as

$$g_j(\boldsymbol{\theta}) = \frac{f(\boldsymbol{\theta} + s\mathbf{e}_j) - f(\boldsymbol{\theta} - s\mathbf{e}_j)}{2\sin(s)}$$

- We need to estimate the *f* function in two points
- This means to measure twice the quantum observable
- Multiplication of preparation of the system, evolution and measurements
- For the second derivative we need four ponts

$$g_{j_1,j_2}(\boldsymbol{\theta}) = \left[ f\left(\boldsymbol{\theta} + s\left(\mathbf{e}_{j_1} + \mathbf{e}_{j_2}\right)\right) - f\left(\boldsymbol{\theta} + s\left(-\mathbf{e}_{j_1} + \mathbf{e}_{j_2}\right)\right) - f\left(\boldsymbol{\theta} + s\left(\mathbf{e}_{j_1} - \mathbf{e}_{j_2}\right)\right) + f\left(\boldsymbol{\theta} - s\left(\mathbf{e}_{j_1} + \mathbf{e}_{j_2}\right)\right) \right] \times \left[2\sin(s)\right]^{-2}.$$
(11)

Mari et al. Phys. Rev. A, 103, 012405 (2021)

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## Hybrid quantum-classical algorithms



• The two average values are used by a classical computer to update  $\theta$  (hybrid architecture)

$$\boldsymbol{\theta}^{t+1} = \boldsymbol{\theta}^t - \eta \nabla f(\boldsymbol{\theta}^t)$$
 • Gradient update

# Hybrid quantum-classical algorithms



• Cost

2m measurements

 $4k \longrightarrow 4km$  total logical operators

- For large quantum system the cost is too high
- Any cost reduction is of crucial importance

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- Using a quantum detector, we can have direct information about the gradient if *f*
- We store this information in the phase which is eventually measured *a single time*



- If we want to measurement the gradient of *M*, we couple the system and the detector twice with  $e^{i\lambda\hat{p}\otimes\hat{M}}$ 

 $\lambda =$ coupling parameter

 $\hat{p}=\text{detector}$  operator



$$U_{tot} = e^{i\lambda\hat{p}\otimes\hat{M}}U_2e^{-i\lambda\hat{p}\otimes\hat{M}}U_1$$

• Quantum circuit



- It can be shown that the phase of the detector is a characteristic function for the gradient
- The moments can be obtained from its derivatives

First derivative

$$-i\partial_{\lambda}\mathcal{G}_{\lambda}\Big|_{\lambda=0} \propto \operatorname{Tr}_{S}[U_{1}^{\dagger}U_{2}^{\dagger}\hat{M}U_{2}U_{1}\rho_{S}^{0} - U_{1}^{\dagger}\hat{M}U_{1}^{\dagger}\rho_{S}^{0}]$$
$$= \underbrace{f(\theta + s\mathbf{e}_{j_{1}}) - f(\theta - s\mathbf{e}_{j_{1}})}_{\operatorname{Gradient}}$$
Gradient

#### Notes

- $\lambda$  can be taken small
- Close to  $\lambda=0$  we need only one evaluation of the phase

#### **Advantages**

- We perform only a measurement on detector instead of two
- We reduce the number of repetition and the logical gate to evolve the system

	qubits	iterations	gates
Direct measurement	n	2m	$\approx 4mk$
quantum non-demolition	n+1	m	$\approx mk$

- m = number of repetitions
- k = number of logical operations

#### **Advantages**

• For the higher derivatives, the advantage is exponential because we perform a single measurement against an exponential number of measurements

	qubits	iterations	gates
Direct measurement	n	4m	$(\approx 8mk)$
quantum non-demolition	n+1	m	$\approx mk$

m = number of repetitions

k = number of logical operations

#### **Advantages**

• For complex operators we must perform additional measurements of the single terms

$$H = \underbrace{h_1 P_1}_{h_1 P_1} + h_2 P_2 + h_3 P_3 + \dots + h_J P_J$$
  
*m* measurements

	qubit	iterations	gates
Direct measurement	$\mid n \mid$	2mJ	$\approx 4mJk$
quantum non-demolition	n+1	m	$\approx (k+2J)m$

- m = number of repetitions
- k = number of logical operations

#### Summary

- We have shown that using a quantum detector the number of operations and repetitions to estimate a quantum gradient can be reduced
- The advantages increase for the higher derivatives and complex operators
- Possible uses for variational quantum algorithms
- Implementation in noisy quantum computers where the cost reduction is of paramount importance

#### Thank you