# Quantum approximated cloning-assisted density matrix exponentiation

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June 19th, 2024





arXiv:2311.11751

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LMR trick:



#### LMR assisted by biomimetic copies



### Imperfect cloning





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### LMR<sub>[1]</sub> trick:

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### Could we find a better operation? $\mathcal{O}(\Delta t^3)$ ?

[1] Lloyd, S., Mohseni, M., & Rebentrost, P. (2014). "Quantum principal component analysis". Nature Physics, 10(9), 631-633. [2] Kimmel, S., Lin, C. Y. Y., Low, G. H., Ozols, M., & Yoder, T. J. (2017). "Hamiltonian simulation with optimal sample complexity". npj Quantum Information, 3(1), 13.



 $T_{\rm LMR}(\sigma)$  $e^{-i\rho\Delta t}\sigma e^{i\rho\Delta t} + \mathcal{O}(\Delta t^2)$ 

### LMR protocol is optimal<sub>[2]</sub>





### What if we consider a time interval *t* ?



Access to *n* copies of  $\rho$ 

 $\Delta t = t/n$ 







 $n = \mathcal{O}(t^2/\varepsilon)$ 



ρ

ρ

 $\sigma$ 





### Applicability



LETTERS PUBLISHED ONLINE: 27 JULY 2014 | DOI: 10.1038/NPHYS3029

#### Quantum principal component analysis

Seth Lloyd<sup>1,2\*</sup>, Masoud Mohseni<sup>3</sup> and Patrick Rebentrost<sup>2</sup>



#### Quantum embeddings for machine learning

Seth Lloyd,<sup>1,2</sup> Maria Schuld,<sup>2</sup> Aroosa Ijaz,<sup>2</sup> Josh Izaac,<sup>2</sup> and Nathan Killoran<sup>2</sup> <sup>1</sup>Massachusetts Institute of Technology, 77 Massachusetts Avenue, Cambridge, MA 02139, USA <sup>2</sup>Xanadu, Toronto, Canada (Dated: July 3, 2022)



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PRL 113, 130503 (2014)

#### PHYSICAL REVIEW LETTERS

week ending 26 SEPTEMBER 2014

#### Quantum Support Vector Machine for Big Data Classification

Patrick Rebentrost,<sup>1,\*</sup> Masoud Mohseni,<sup>2</sup> and Seth Lloyd<sup>1,3,†</sup>

<sup>1</sup>Research Laboratory of Electronics, Massachusetts Institute of Technology, Cambridge, Massachusetts 02139, USA <sup>2</sup>Google Research, Venice, California 90291, USA <sup>3</sup>Department of Mechanical Engineering, Massachusetts Institute of Technology, Cambridge, Massachusetts 02139, USA (Received 12 February 2014; published 25 September 2014)

Quantum Information npj

www.nature.com/npjqi

#### ARTICLE OPEN Hamiltonian simulation with optimal sample complexity

Shelby Kimmel <sup>1</sup>, Cedric Yen-Yu Lin<sup>1</sup>, Guang Hao Low<sup>2</sup>, Maris Ozols<sup>3</sup> and Theodore J. Yoder<sup>2</sup>





## Contents

### Density matrix exponentiation LMR trick:



### LMR assisted by biomimetic copies



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## Biomimetic cloning

$$d = 2^{q}$$
 Observed  

$$\rho = \sum_{i,j=1}^{d} \rho_{ij} |\psi_{i}\rangle \langle\psi_{j}|$$

$$\rho \quad \rho$$

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$$\rho \quad \rho$$

*n* original copies

The biomimetic cloning machine ( $\hat{O}_{C}$ ) clones the statistics associated to an observable



[1] U. Alvarez-Rodriguez, M. Sanz, L. Lamata, and E. Solano. "Biomimetic Cloning of Quantum Observables". Sci Rep 4, 4910 (2014).



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### Biomimetic cloning

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$$n \text{ original copies}$$

# We consider $\rho$ as the observable i=1

[1] U. Alvarez-Rodriguez, M. Sanz, L. Lamata, and E. Solano. "Biomimetic Cloning of Quantum Observables". Sci Rep 4, 4910 (2014).





Acting *k* times:

$$\hat{O}_{c}^{(k)}(\rho) = \sum_{i=1}^{d} p_{i} \left( |\psi_{i}\rangle\langle\psi_{i}| \right)^{\otimes k}$$





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### LMR assisted by biomimetic copies

Given *n* copies of  $\rho$ 



From each original copy





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### **Error analysis**

Is it worth disturbing the original copies of  $\rho$  to create k biomimetic copies?

Original protocol:  $\varepsilon_{\text{LMR}(n)} \approx \| [\rho, \sigma]_2 + 2(\rho - \rho) \|$ 

 $\varepsilon_{\text{BIO}(n \to nk)} \approx \| [\rho, \sigma]_2 + 2 \rho$ Our protocol:



[1] Puchała, Zbigniew, Łukasz Pawela, and Karol Życzkowski. "Distinguishability of generic quantum states." Physical Review A 93.6 (2016): 062112.



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$$\rho$$



$$\sigma$$
)  $\| t^2/2n$ 

Does not violate optimality

$$\circ \sigma - \{\rho, \sigma\} \| t^2/2n$$

- First order in  $\rho, \sigma$ 

$$\overline{\mathsf{I}}_{_{1}} \equiv Q_{1}$$

- Second order in  $\rho$ ,  $\sigma$ 

Statistical case:

 $\rho$  and  $\sigma$  random density matrices

$$Q_1 \ge \frac{d}{8} \left( \frac{\|\rho - \sigma\|_1 - 32/d^2}{1 + 4/d} \right)$$

$$\|\rho - \sigma\|_{\overrightarrow{1}} \operatorname{const} . [1]$$

Average  $Q_1 \propto d$ 









### Cost analysis

Instead of cloning I could generate more original copies of  $\rho$ 





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 $l \cdot C_s \ge n \cdot (k-1) \cdot C_c$ 

l to guarantee an error smaller or equal than the one with biomimetics copies

 $C_c \leq \frac{C_s}{L-1} \left( \frac{1}{L} \right)$ -1)



Cost  $C_c$ 

Cost  $C_s$ 



### Performance analysis

100,000 random cases uniformly distributed according to the Hilbert-Schmidt measure



Given  $n \longrightarrow$  Exponential reduction in  $\epsilon$ 



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## **Outlook and conclusions**

Density matrix exponentiation can be <u>enhanced</u>

? Killing application

- On average, enhancement scales with the <u>dimension of the system</u>
- Using imperfect cloning could enhance <u>other protocols</u> requiring copies

Block-diagonalization ?







### **Collaborators:**



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#### arXiv:2311.11751

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Patrick Rebentrost

Mikel Sanz



## Thank you for your attention!









