# **Verification of Quantum Superiority**

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Quantum Superiority

Simpler Quantum Computers

Hardness Results

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Quantum Superiority

#### **Superiority Hypothesis**

The set of samples I have in my posetion were drawn from a distribution produced by a classical computer <sup>1 2</sup>

<sup>&</sup>lt;sup>1</sup>In a reasonable amount of time

<sup>&</sup>lt;sup>2</sup>Disproving this null hypothesis would demonstrate quantum superiority [1]

#### A Recipe

#### Ingredients:

- A computational problem <sup>3</sup>
- A reason to believe there is a separation between the classical and quantum runtime
- A method of verifying the outcome

Cooking time: polynomial

Serves: you right extended Church-Turing thesis

<sup>&</sup>lt;sup>3</sup>Not necessarily of practical interest

# Factoring [2] as an Instance of our Recipe

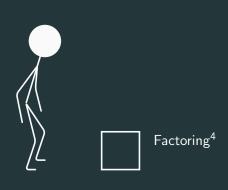
- A computational problem:
  - Factoring

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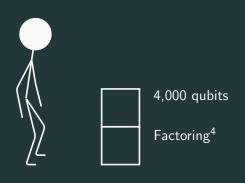
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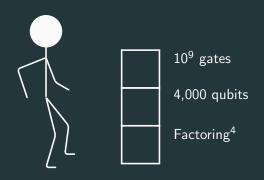
- A computational problem:
  - Factoring
- A reason to believe there is a separation between the classical and quantum runtime
  - Well... we've tried our best for a while now
- A method of verifying the outcome
  - We can multiply the factors



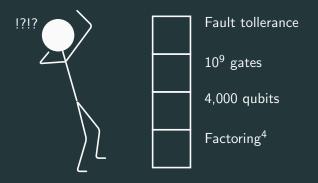
<sup>&</sup>lt;sup>4</sup>Of a 2048 bit number, which is basically impossible for a classcal computer



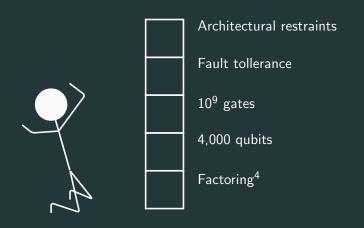
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#### **A** New Ingrediant

#### Ingredients:

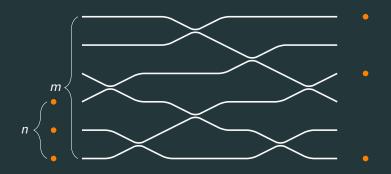
- A computational problem <sup>5</sup>
- A reason to believe there is a separation between the classical and quantum runtime
- A method of verifying the outcome
- An implementation on a near-term device

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# Simpler Quantum Computers

# **Boson Sampling [4]**

Linear optical network:



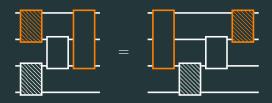
Photons are counted at the end

#### **Boson Sampling Chalenges**

- Randomised single photon source has inherently poor scaling
  - Scattershot boson sampling?
- Lossy systems
- Some way to go
  - ullet Can implement  $\sim$  5 photons,  $\sim$  10 modes
  - ullet Can simulate  $\sim$  30 photons ... on a laptop [5]

# Instantaneous Quantum Polytime [6, 7]

# Commuting gates:



#### Random Quantum Circuits [8]

Alternating entanglement patterns and random gates:

# Hardness Results

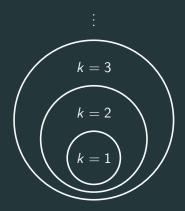
#### Polynomial Hierarchy

- $f(x) \in NP \implies f(x) = \bigvee_{y} g(x, y)$
- k<sup>th</sup> level of PH has k alternating quantuifers
  - $f(x) = \bigvee_{y_1} \bigwedge_{y_2} ... \bigwedge_{y_k} g(x, y_1, ..., y_k)$
- ullet It is conjectured  $k^{th}$  and  $k+1^{th}$  level of PH are not equal
  - If it is then there is a colapse to  $k^{th}$  level " it's the  $k^{th}$  level all the way down"

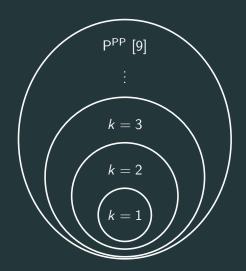
#### **Post-Selection**

- A computation takes input strings x and outputs strings y and z
- we condition on z and output y
- Allowing post selection on exponentially unlikely outcomes is very powerful

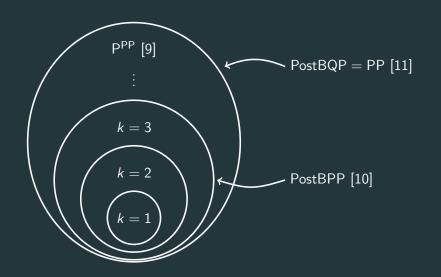
# What is the Layout?



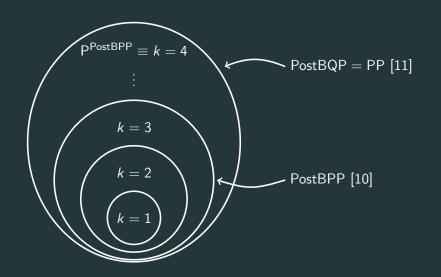
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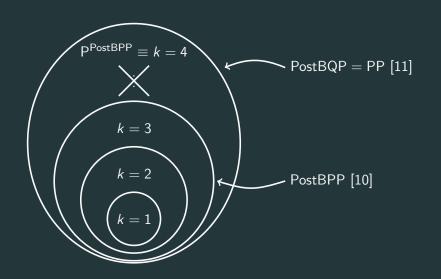
### What is the Layout?



#### What if PostBQP = PostBPP?



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#### **Problem with Complexity Theory**

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  - We would prefer a more fine grained complexity complexity like "this computation takes time 2<sup>n</sup> on n qubits" [12]

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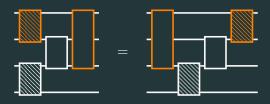
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  - We have some average case hardness results based on stronger conjectures

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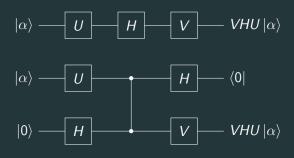
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- BPP = BQP ⇒ PostBQP = PostBPP

# Instantaneous Quantum Polytime [6, 7]

# Commuting gates:



# **IQP Superiority [13]**



#### Multiplicative vs Additive Error

$$(1-\epsilon)\,q\,(0^n) \leq p\,(0^n) \leq (1+\epsilon)\,q\,(0^n)$$
 vs  $\sum_z |p\,(z)-q\,(z)| \leq \epsilon$ 

# **IQP Additive Superiority [14]**

 For two classes of problems, a classical sampler, acurate up to good additive error in the worst case, must be acurate in multiplicative error in the average case.

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- Can use Stockmeyer to estimate individual output probabilities up to small multiplicatie error.
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- This gives an algorithm for computing multiplicative approximation to large fraction of class.
- This causes a collapse of PH, assuming some conjectures about the two classes.

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#### **IQP Superiority**

 Arbitrarily small constant noise on each qubit at the end of IQP circuit makes [15] easy up to additive error.

#### Random Circuit Superiority: 3 Main Arguments

- 1. No known simulation using reasonable amount of memory
- 2. IQP-esque complexity results giving asymptotic hardness
- 3. Circuits have properties we expect of hard distributions

#### **Intuative Initial Arguments**

Close to Porter-Thomas  $\implies$  Behaves like chaotic system  $\implies$  Small perturbation = large divergence  $\implies$  Must store full state  $\implies$  Hard to simulate

Verification

#### Verification

#### Options:

- 1. Direct certification
- 2. Classically simulate small instances
- 3. Statistical test of some properties we expect.

#### Verification Using HOG [16]

#### **Problem**

HOG - Heavey Output Generation

Given as input a random quantum circuit C, generate output strings  $x_1, ..., x_k$  at least a  $\frac{2}{3}$  fraction of which have greater than median probability in C's output distribution.

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#### Conjecture

QUĂTH - QUantum THreshold assumption

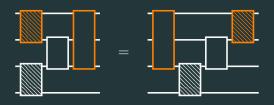
There is no polynomial-time classical algorithm that takes as input a description of a random quantum circuit C, and which guesses whether  $|\langle 0^n | C | 0^n \rangle|^2$  is greater than or less than the median of all  $2^n$  of the  $|\langle 0^n | C | x \rangle|^2$ 

#### Verification of Random Circuits Using Entropy Benchmarking

- Measures closeness of output to perfect circuit
- Takes exponential time classically
  - Maybe that's okay?

#### Instantaneous Quantum Polytime Machine [6]

#### Commuting gates:



In particular:

$$\exp i\theta \bigotimes_{i:q_i=1} X_i$$

where  $q \in \{0,1\}^{n_p}$ ,  $\theta \in [0,2\pi]$ .

#### Instantaneous Quantum Polytime Machine [6]

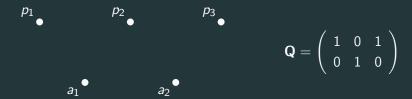
$$\exp i\theta \bigotimes_{i:q_i=1} X_i$$

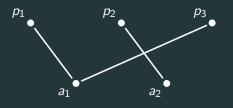
An IQP program may consist of many of these gates, and so many different q. Hence we may represent the whole computation by, for example:

$$\mathbf{Q} = \left(\begin{array}{ccc} 1 & 0 & 1 \\ 0 & 1 & 0 \end{array}\right)$$

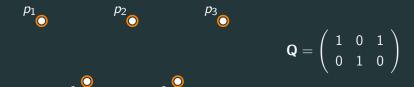
where, in this case, we have two gates defined by q=(101) and q=(010).

The input is  $|0^{n_p}\rangle$  and the output is the resulting state measured in the computational basis.





$$\mathbf{Q}=\left(egin{array}{ccc} 1 & 0 & 1 \ 0 & 1 & 0 \end{array}
ight)$$



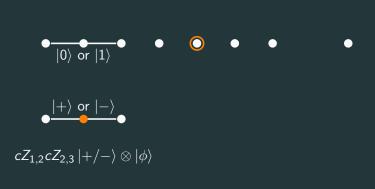


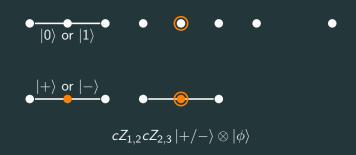


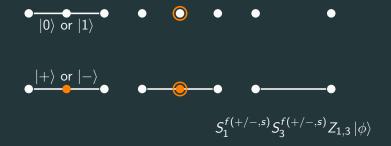
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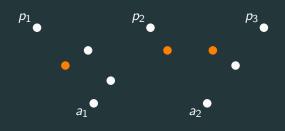


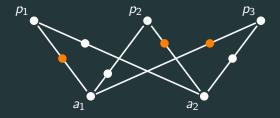


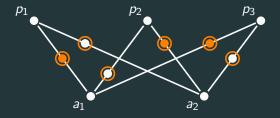


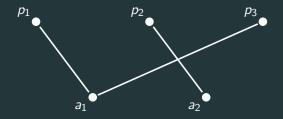


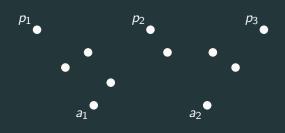


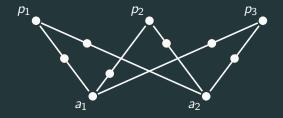


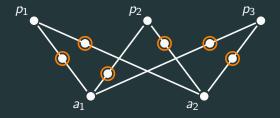


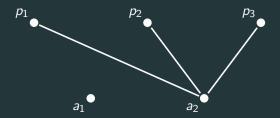


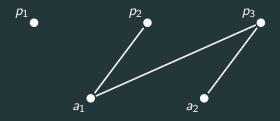


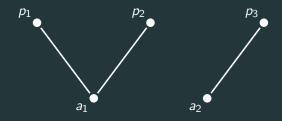








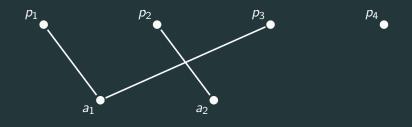


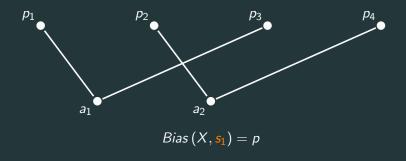


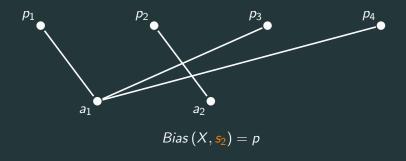
Bias of a random variable,  $X \in \{0,1\}^{n_p}$ , in a direction  $s \in \{0,1\}^{n_p}$ .

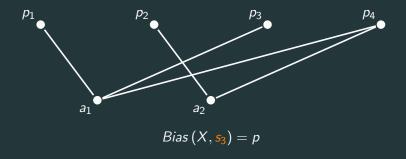
$$\mathbb{P}\left(X\cdot s^{T}=0\right)=Bias\left(X,s
ight)$$

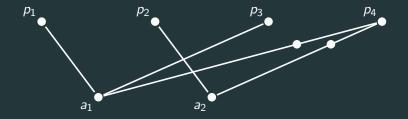
Can be easily calculated, for some special IQP computations (depending on s), if one knows s [6].

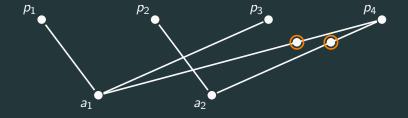


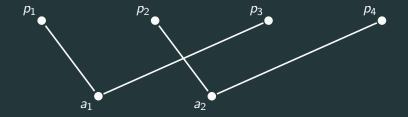












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- The Client knows a secret property allowing them to check the outcome
  - The Client knows the direction s

- The Server must complete a hard computations
  - Computation bias calculation is hard
- The Client knows a secret property allowing them to check the outcome
  - The Client knows the direction s
- The Server hides the secret property
  - Using blind IQP

# Conclusion

## Conclusion

• VERIFICATION OF SOME PROPERTY (BUT NOT THE WHOLE THING) IS INTERESTING!

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