# Verification of NISQ Devices

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From Benchmarking to Protocol Verification QuHackEd 2019



# What are NISQ Devices?

#### Noisy Intermediate Scale Quantum Devices

- Few qubits: 100-200
- Limited architecture
  - Cannot always directly connect all qubits
- Lots of Noise (I mean really... wow)
- No fault tolerance
  - Error correction requires significantly more qubits

#### Noisy Intermediate Scale Quantum Devices

For example...

#### **IBM-Q 5 Tenerife**

#### ibmq\_5\_tenerife - ibmqx4 v1.0.0



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#### IBM-Q 16 Melbourne



#### Rigetti Aspen-4-16Q-A



16 QUBITS Aspen-4-16Q-A			
Т1	25.24 µs	fRO	93.43%
T2	19.89 µs	fCZ	90.81% ± 0.24%
f1QRB	82.19%	fBellState	91.08%
fActiveReset	95.41%		

#### **Qubit Counter**

www.qubitcounter.com



# What Would We Like From Verification?

#### In An Ideal World

- Is the computation being performed on the quantum computer the one I want?
- Is the state my quantum computer is preparing the one I wanted?

#### In The Real World

- If you want to check that ANY computation is being performed correctly, you need A LOT of qubits
- To be totally sure, you might need a small quantum computer of your own



# What Can We Expect From Verification?

#### You Might Just About Get...

- Is my device doing anything quantum at all?
- Is the noise level reasonable?
- Is the distribution of outputs close to what it was meant to be?



## **Hypothesis Testing** Is my device doing anything quantum at all?

### The Setting



















#### **Superiority Null Hypothesis**

*The set of samples which I have in my possession were drawn from a distribution produced by a classical computer in polynomial time* 

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*The set of samples which I have in my possession were drawn from a distribution produced by a classical computer in polynomial time* 

If not, then they must have been implemented by a quantum computer

#### A Proposal





























#### What Can We Recover From This Failure



#### Some Components of the Hypothesis Test to Extract

- 1. A reason Chad must use a quantum computer
  - Hard computational problem
- 2. Property of the outcome, which is "highly correlated" to the outcome, to check
  - $\circ$  The small hidden problem should be solvable and indicative of the larger problem
- 3. A backdoor that helps us check property
  - $\circ$   $\,$  A smaller problem should be hard to uncover
- 4. Means to implement on NISQ devices
  - Let's figure something out for IQP... Why not?


# **IQP** as **NISQ Device**

# Circuit Model IQP



# Circuit Model IQP



$$\exp\Bigl\{i hetaigotimes_{i:q_i=1}X_i\Bigr\}, q\in\{0,1\}^n, heta\in[0,1]$$

#### **Usually Not True For Quantum Circuits**







"Output qubits"

"Gate qubits"

 $\bullet$   $\bullet$   $\bullet$   $\bullet$   $\bullet$   $|+\rangle$ 

"Output qubits"



"Gate qubits"

 $cZ \dots cZ \bigotimes \ket{+}$ 

"Output qubits"

"Gate qubits"



Measurements and classically controlled corrections

"Output qubits"













#### Measurements

 $(\widehat{\bigcirc})$ 

#### Advantages And Disadvantages

Advantages:

- Can be implemented on NISQ technology
- Believed not be reproducible by a classical computer

Disadvantages:

• Not capable of implementing all computations



# **IQP Hypothesis Test**











#### It Meets The Requirements?

#### 1. A reason Chad must use a quantum computer

- It looks like a big IQP computation to him
- Cannot reproduce classically as hiding is good
- 2. Property of the outcome, which is "highly correlated" to the outcome, to check
  - The property of the hidden graph is fixed so can be checked
  - $\circ$  Its embedding in the larger graph makes it highly correlated
- 3. A backdoor that helps us check property
  - You know where the small problem is!
- 4. Means to implement on NISQ devices
  - IQP is easier to implement than BQP



# **Benchmarking** Is The Noise Level Reasonable

# **Random Circuit**

Cycle of Hadamard gates
For d clock cycles:
Apply CZs
If no CZ applied
If no random gate acted yet
Apply T
Else
Apply gate different from previous

•	•	•	•	•	•
•	•	•	•	•	•
•	•	•	•	•	•
•	•	•	•	•	•
•	•	•	•	•	•

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#### Advantages

• Designed for Google's Bristlecone device



• Also thought to be hard to reproduce on a classical computer

### Sampling Problem



#### **Sampling Problem**

1110010101000101

#### Sampling Problem











#### Heavy Output Generation

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

Can be verified in classical exponential time by calculating ideal probabilities

## Quantum Volume

- Can a quantum device produce heavy outputs?
- For what size of circuits can the device produce heavy outputs?
- Roughly a measure of number of good qubits

#### **Quantum Volume With Circuit Size**



## **Advantages and Disadvantages**

Advantages:

- Global property of device
- Measurable on NISQ devices
- Requires only few sample from the device

Disadvantages:

- Requires exponential resources on a classical computer
- Does not relate to more common complexity results
- While the task is thought to be hard, the grounds for this belief are not as stable

#### **Cross Entropy Difference**

Measure quality as the difference from uniform classical sampler

$$\Delta H\left(p_{A}
ight)=\sum_{j}\left(rac{1}{N}-p_{A}\left(x_{j}|U
ight)
ight)lograc{1}{p_{U}\left(x_{j}
ight)}$$

- Unity for ideal implementation
- Zero for uniform distribution

Achiever supremacy in range:



#### **Cross-Entropy With Circuit Size**





# **Conclusions**
## What Have We Learned

- Hypothesis tests are used to prove "quantumness"
- Benchmarking used to test noise levels

## **Open Problems**

- Does not seem to be a reason to restrict to Random Circuits
  - Or maybe...
  - Random circuits are very flexible
- Can we use these hypothesis tests as a kind of *"meaningful"* verification
- What do hypothesis test teach us about limits of classical computers
  - Where will we see superiority
- Can we benchmark in polynomial time



## **Thanks!**