

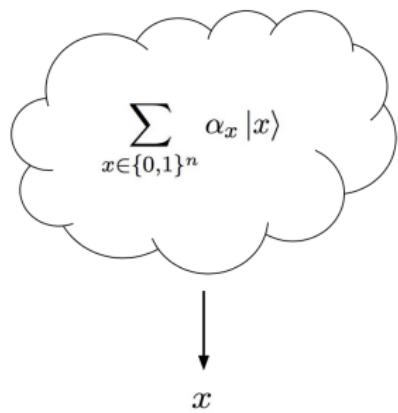
# Classical Verification of Quantum Computations

Urmila Mahadev  
*UC Berkeley*

September 12, 2018

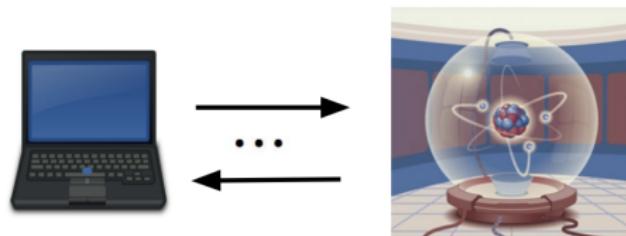
# Classical versus Quantum Computers

- Can a classical computer verify a quantum computation?
  - ▶ Classical output (decision problem)
- Quantum computers compute in superposition
  - ▶ Classical description is exponentially large!
- Classical access is limited to measurement outcomes
  - ▶ Only  $n$  bits of information

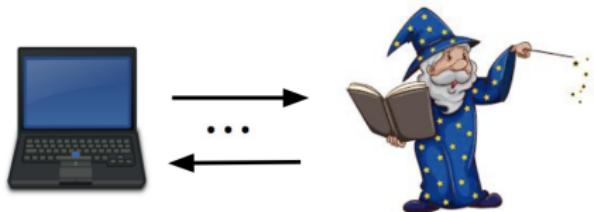


# Verification through Interactive Proofs

Can a classical computer verify the result of a quantum computation through interaction (Gottesman, 2004)?

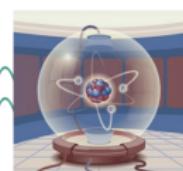
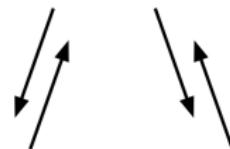


# Verification through Interactive Proofs



- Classical complexity theory:  $\text{IP} = \text{PSPACE}$  [Shamir92]
- $\text{BQP} \subseteq \text{PSPACE}$ : Quantum computations can be verified, but only through interaction with a much more powerful prover
- Scaled down to an efficient quantum prover?

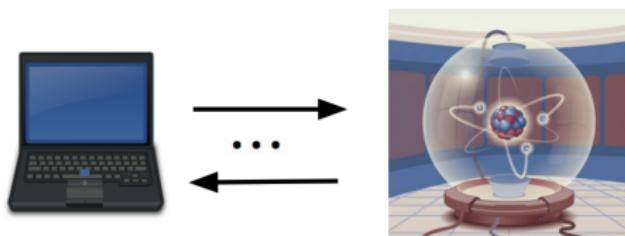
# Relaxations



Error correcting codes  
[BFK08][ABE08][FK17][ABEM17]

Bell inequalities  
[RUV12]

# Verification with Post Quantum Cryptography



- In this talk: use post quantum classical cryptography to control the BQP prover
- To do this, require a specific primitive: trapdoor claw-free functions

- Trapdoor claw-free functions  $f$ :
  - ▶ Two to one
  - ▶ Trapdoor allows for efficient inversion: given  $y$ , can output  $x_0, x_1$  such that  $f(x_0) = f(x_1) = y$
  - ▶ Hard to find a claw  $(x_0, x_1)$ :  $f(x_0) = f(x_1)$
  - ▶ Approximate version built from learning with errors in [BCMVV18]
- Quantum advantage: sample  $y$  and create a superposition over a random claw

$$\frac{1}{\sqrt{2}}(|x_0\rangle + |x_1\rangle)$$

which allows sampling of a string  $d \neq 0$  such that

$$d \cdot (x_0 \oplus x_1) = 0$$

# Core Primitive

$$\frac{1}{\sqrt{2}}(|x_0\rangle + |x_1\rangle) \quad \text{or} \quad d \cdot (x_0 \oplus x_1) = 0$$

- Classical verifier can challenge quantum prover
  - ▶ Verifier selects  $f$  and asks for  $y$
  - ▶ Verifier has leverage through the trapdoor: can compute  $x_0, x_1$
- First challenge: ask for preimage of  $y$
- Second challenge: ask for  $d$

$$\frac{1}{\sqrt{2}}(|x_0\rangle + |x_1\rangle) \quad \text{or} \quad d \cdot (x_0 \oplus x_1) = 0$$

- In [BCMVV18], used to generate randomness:
  - ▶ Hardcore bit: hard to hold both  $d$  and either  $x_0, x_1$  at the same time
  - ▶ Prover must be probabilistic to pass

$$\frac{1}{\sqrt{2}}(|x_0\rangle + |x_1\rangle) \quad \text{or} \quad d \cdot (x_0 \oplus x_1) = 0$$

- Verification:
  - ▶ TCFs are used to constrain prover
  - ▶ Use extension of approximate TCF family built in [BCMVV18]
    - Require [BCMVV18] hardcore bit property: hard to hold both  $d$  and either  $(x_0, x_1)$
    - Require one more hardcore bit property: there exists  $d$  such that for all claws  $(x_0, x_1)$ ,  $d \cdot (x_0 \oplus x_1)$  is the same bit and is hard to compute

# How to Create a Superposition Over a Claw

$$\frac{1}{\sqrt{2}}(|x_0\rangle + |x_1\rangle)$$

- ① Begin with a uniform superposition over the domain:

$$\frac{1}{\sqrt{|\mathcal{X}|}} \sum_{x \in \mathcal{X}} |x\rangle$$

- ② Apply the function  $f$  in superposition:

$$\frac{1}{\sqrt{|\mathcal{X}|}} \sum_{x \in \mathcal{X}} |x\rangle |f(x)\rangle$$

- ③ Measure the last register to obtain  $y$

$$\frac{1}{\sqrt{2}}(|x_0\rangle + |x_1\rangle)$$

- Performing a Hadamard transform on the above state results in:

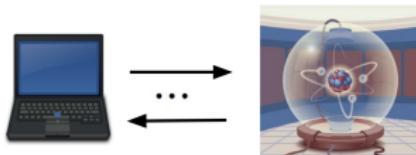
$$\frac{1}{\sqrt{|\mathcal{X}|}} \sum_d ((-1)^{d \cdot x_0} + (-1)^{d \cdot x_1}) |d\rangle$$

- By measuring, obtain a string  $d$  such that

$$d \cdot (x_0 \oplus x_1) = 0$$

# Verification Outline

Goal: classical verification of quantum computations through interaction



- Define a *measurement protocol*
  - ▶ The prover constructs an  $n$  qubit state  $\rho$  of his choice
  - ▶ The verifier chooses 1 of 2 measurement bases for each qubit
  - ▶ The prover reports the measurement result of  $\rho$  in the chosen basis
- Link measurement protocol to verifiability
- Construct and describe soundness of the measurement protocol

# Hadamard and Standard Basis Measurements

$$|\psi\rangle = \alpha_0 |0\rangle + \alpha_1 |1\rangle$$

- Standard: obtain  $b$  with probability  $|\alpha_b|^2$
- Hadamard:

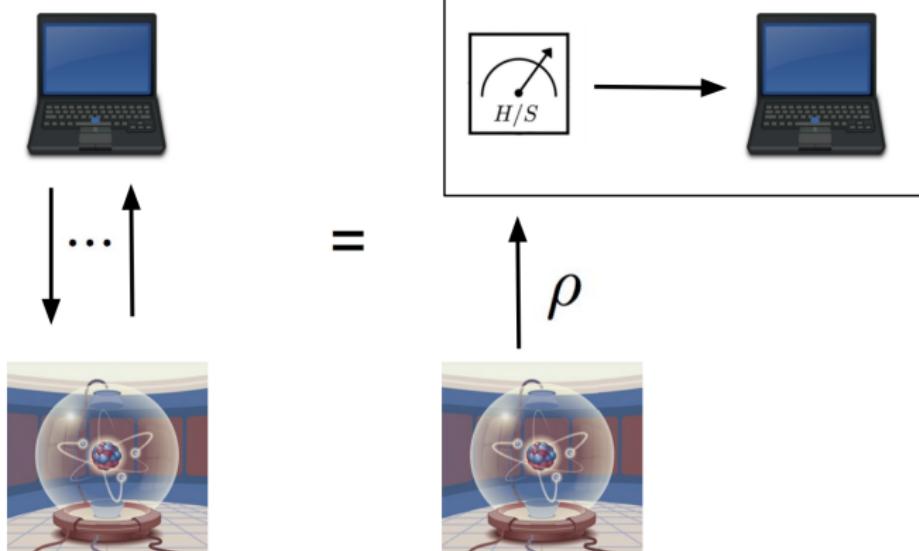
$$H = \frac{1}{\sqrt{2}} \begin{pmatrix} 1 & 1 \\ 1 & -1 \end{pmatrix}$$

$$H|\psi\rangle = \frac{1}{\sqrt{2}}(\alpha_0 + \alpha_1)|0\rangle + \frac{1}{\sqrt{2}}(\alpha_0 - \alpha_1)|1\rangle$$

Obtain  $b$  with probability  $\frac{1}{2}|\alpha_0 + (-1)^b \alpha_1|^2$

# Measurement Protocol Definition

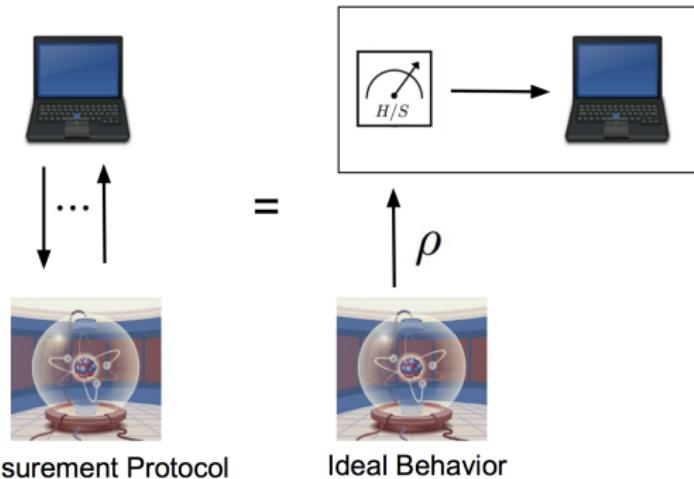
*Measurement protocol:* interactive protocol which forces the prover to behave as the verifier's trusted measurement device



Measurement Protocol

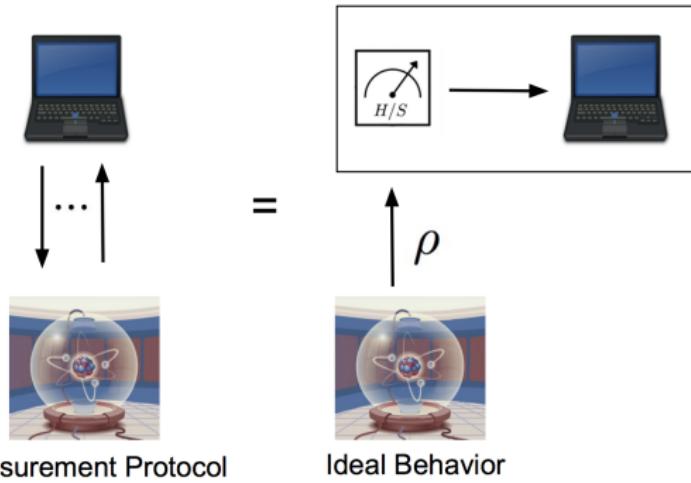
Ideal Behavior

# Measurement Protocol Definition



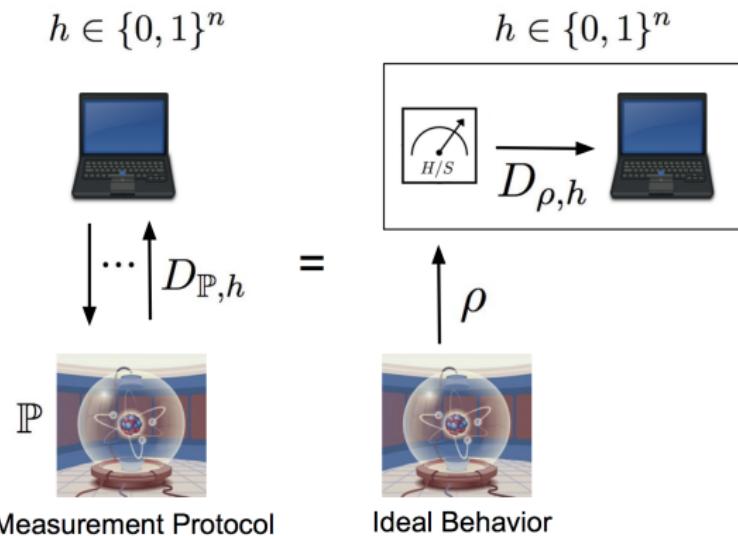
- Key issue: adaptivity; what if  $\rho$  changes based on measurement basis?
  - ▶ Maybe the prover never constructs a quantum state, and constructs classical distributions instead

# Measurement Protocol Soundness



- Soundness: if the verifier accepts, there exists a quantum state *independent of the verifier's measurement choice* underlying the measurement results

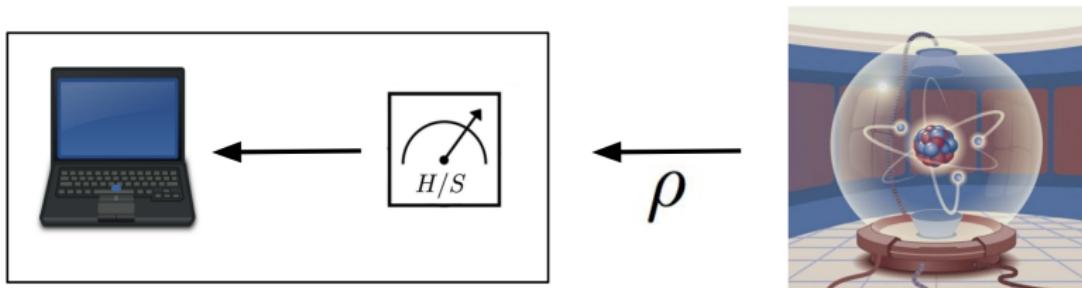
# Measurement Protocol Soundness



- Soundness: if  $\mathbb{P}$  is accepted with high probability, there exists a state  $\rho$  such that for all  $h$ ,  $D_{\rho,h}$  and  $D_{\mathbb{P},h}$  are computationally indistinguishable.

# Using the Measurement Protocol for Verification

- The measurement protocol implements the following model:



- Prover sends qubits of state  $\rho$  and verifier measures
- Next: show that quantum computations can be verified in the above model

# Quantum Analogue of NP

- To verify an efficient classical computation, reduce to a 3-SAT instance, ask for satisfying assignment and verify that it is satisfied

$$3\text{-SAT} \iff \text{Local Hamiltonian}$$

$$n \text{ bit variable assignment } x \iff n \text{ qubit quantum state}$$

$$\text{Number of unsatisfied clauses} \iff \text{Energy}$$

- To verify an efficient quantum computation, reduce to a local Hamiltonian instance  $H$ , ask for ground state and verify that it has low energy
  - If the instance is in the language, there exists a state with low energy

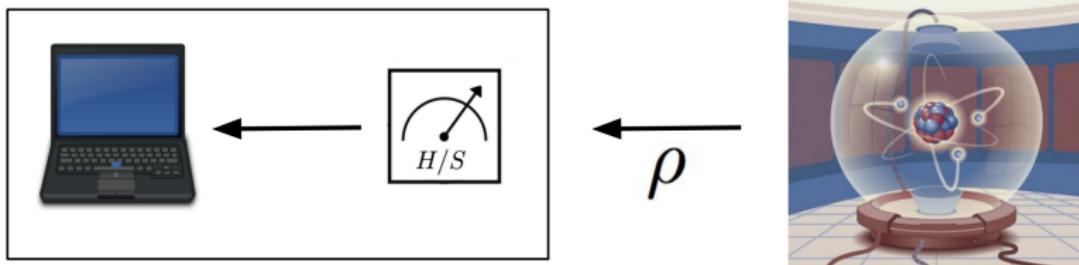
# Quantum Analogue of NP

$$\begin{array}{lll} 3 \text{ SAT} & \iff & \text{Local Hamiltonian} \\ \text{Assignment} & \iff & \text{Quantum state} \\ \text{Number of unsatisfied clauses} & \iff & \text{Energy} \end{array}$$

To verify that a state has low energy with respect to  $H = \sum_i H_i$ :

- Each  $H_i$  acts on at most 2 qubits
- To measure with respect to  $H_i$ , only Hadamard/ standard basis measurements are required [BL08]

# Verification with a Quantum Verifier



- Prover sends each qubit of  $\rho$  to the quantum verifier
- The quantum verifier chooses  $H_i$  at random and measures, using only Hadamard/ standard basis measurements [MF2016]
- Measurement protocol can be used in place of the measurement device to achieve verifiability

# Measurement Protocol Construction

- Use a TCF with more structure: pair  $f_0, f_1$  which are injective with the same image
- Given  $f_0, f_1$ , the honest quantum prover entangles a single qubit of his choice with a claw  $(x_0, x_1)$  ( $y = f_0(x_0) = f_1(x_1)$ ).

$$|\psi\rangle \rightarrow \sum_{b \in \{0,1\}} \alpha_b |b\rangle |x_b\rangle = \text{Enc}(|\psi\rangle)$$

- Once  $y$  is sent to the verifier, the verifier now has leverage over the prover's state: he knows  $x_0, x_1$  but the prover does not

# Measurement Protocol Construction

- The verifier generates a TCF  $f_0, f_1$  and the trapdoor
- Given  $f_0, f_1$ , the honest quantum prover entangles a single qubit of his choice with a claw  $(x_0, x_1)$  ( $y = f_0(x_0) = f_1(x_1)$ ).

$$\begin{aligned} |\psi\rangle &= \sum_{b \in \{0,1\}} \alpha_b |b\rangle \quad \rightarrow \quad \sum_{x \in \mathcal{X}} \sum_{b \in \{0,1\}} \alpha_b |b\rangle |x\rangle |f_b(x)\rangle \\ &\xrightarrow{f_b(x) = y} \sum_{b \in \{0,1\}} \alpha_b |b\rangle |x_b\rangle = \text{Enc}(|\psi\rangle) \end{aligned}$$

- Given  $y$ , the verifier uses the trapdoor to extract  $x_0, x_1$

# Measurement Protocol Testing

- Upon receiving  $y$ , the verifier chooses either to test or to delegate measurements
- If a test round is chosen, the verifier requests a preimage  $(b, x_b)$  of  $y$
- The honest prover measures his encrypted state in the standard basis:

$$\text{Enc}(|\psi\rangle) = \sum_{b \in \{0,1\}} \alpha_b |b\rangle |x_b\rangle$$

- Point: the verifier now knows the prover's state must be in a superposition over preimages

# Delegating Hadamard Basis Measurements

- Prover needs to apply a Hadamard transform:

$$\text{Enc}(|\psi\rangle) = \sum_{b \in \{0,1\}} \alpha_b |b\rangle |x_b\rangle \longrightarrow H(\sum_{b \in \{0,1\}} \alpha_b |b\rangle) = H|\psi\rangle$$

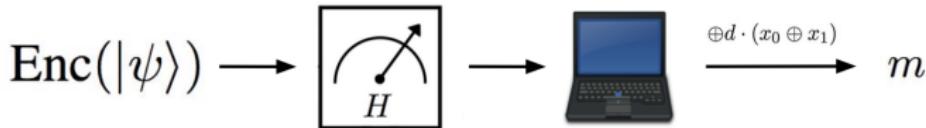
- Issue:  $x_0, x_1$  prevent interference, and prevent the application of a Hadamard transform
- Solution: apply the Hadamard transform to the entire encoded state, and measure the second register to obtain  $d$

# Delegating Hadamard Basis Measurements

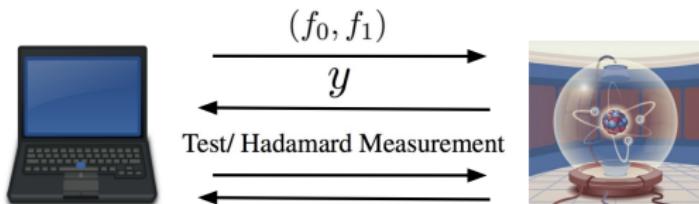
- This results in a different encoding ( $X$  is the bit flip operator):

$$\text{Enc}(|\psi\rangle) \xrightarrow{H} X^{d \cdot (x_0 \oplus x_1)} H |\psi\rangle$$

- Verifier decodes measurement result  $b$  by XORing  $d \cdot (x_0 \oplus x_1)$
- Protocol with honest prover:



# Measurement Protocol So Far



- Soundness: there exists a quantum state *independent of the verifier's measurement choice* underlying the measurement results
- Necessary condition: messages required to delegate standard basis must be computationally indistinguishable
- To delegate standard basis measurements: only need to change the first message

# Delegating Standard Basis Measurements

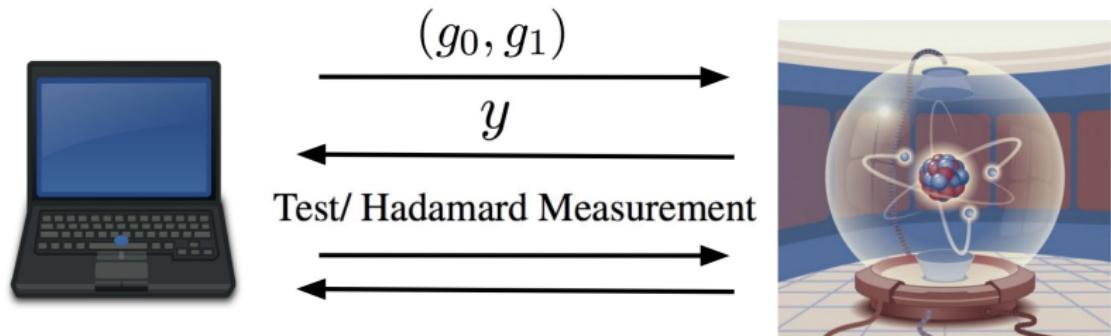
- Let  $g_0, g_1$  be trapdoor injective functions: the images of  $g_0, g_1$  do not overlap
  - ▶ The functions  $(f_0, f_1)$  and  $(g_0, g_1)$  are computationally indistinguishable
- If prover encodes with  $g_0, g_1$  rather than  $f_0, f_1$ , this acts as a standard basis measurement:

$$\sum_{b \in \{0,1\}} \alpha_b |b\rangle \rightarrow \sum_{b \in \{0,1\}, x} \alpha_b |b\rangle |x\rangle |g_b(x)\rangle$$

- With use of trapdoor, standard basis measurement  $b$  can be obtained from  $y = g_b(x)$

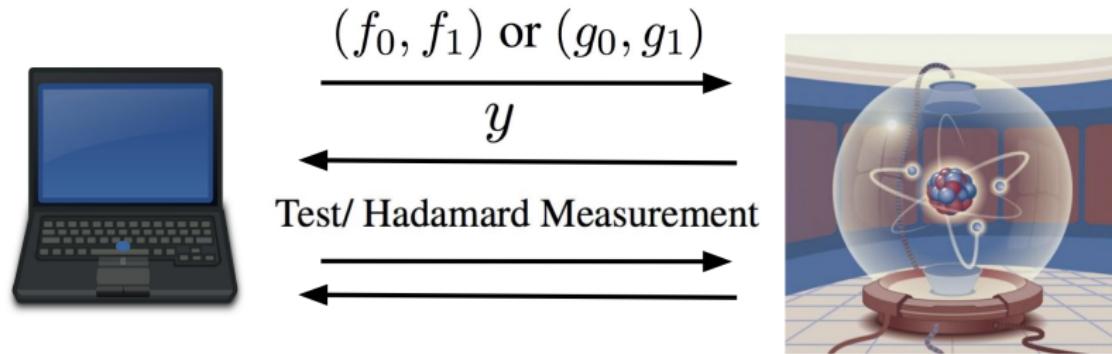
# Delegating Standard Basis Measurements

- Protocol is almost the same, except  $f_0, f_1$  is replaced with  $g_0, g_1$



- Verifier ignores Hadamard measurement results; only uses  $y$  to recover standard basis measurement

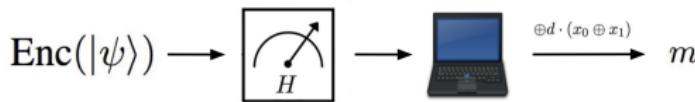
# Measurement Protocol Recap



- Goal: use the prover as a blind, verifiable measurement device
- Verifier selects basis choice; sends claw free function for Hadamard basis and injective functions for standard basis
- Verifier either tests the structure of the state or requests measurement results

# Soundness Intuition: Example of Cheating Prover

- Recall adaptive cheating strategy: prover fixes two bits,  $b_H$  and  $b_S$ , which he would like the verifier to store as his Hadamard/ standard basis measurement results
- Assume there is a claw  $(x_0, x_1)$  and a string  $d$  for which the prover knows both  $x_{b_S}$  and  $d \cdot (x_0 \oplus x_1)$



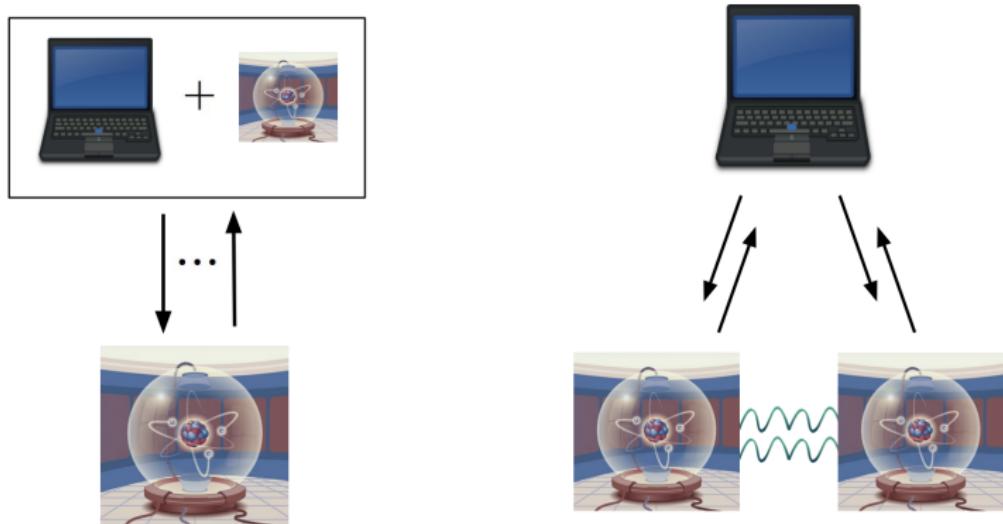
- How to cheat:
  - ▶ To compute  $y$ : prover evaluates received function on  $x_{b_S}$  ( $y = g_{b_S}(x_{b_S})$  or  $y = f_{b_S}(x_{b_S})$ ).
  - ▶ When asked for a Hadamard measurement: prover reports  $d$  and  $b_H \oplus d \cdot (x_0 \oplus x_1)$

# Hardcore Bit Properties

Soundness rests on two hardcore bit property of TCFs:

- 1 For all  $d \neq 0$  and all claws  $(x_0, x_1)$ , it is computationally difficult to compute both  $d \cdot (x_0 \oplus x_1)$  and either  $x_0$  or  $x_1$ .
- 2 There exists a string  $d$  such that for all claws  $(x_0, x_1)$ , the bit  $d \cdot (x_0 \oplus x_1)$  is the same and computationally indistinguishable from uniform.

# How to Prove Soundness

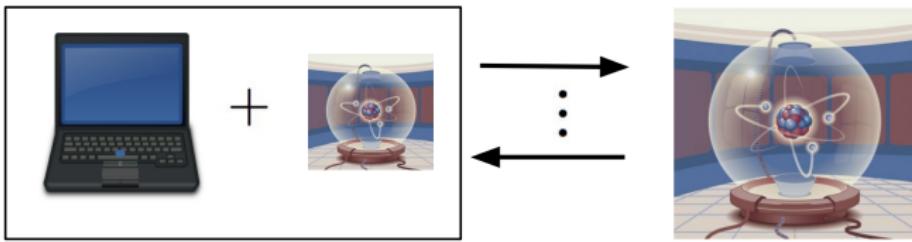


[BFK08][ABE08][FK17][ABEM17]

[RUV12]

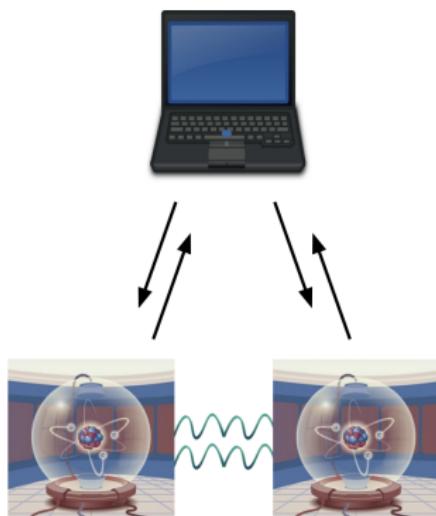
Key step: enforcing structure in prover's state

# How to Prove Soundness: Quasi Classical Verifier



Verifier sends qubits encoded with secret error correcting code to the prover.

# How to Prove Soundness: Two Provers

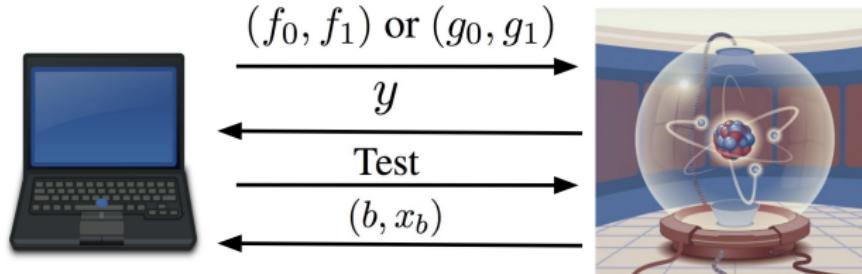


Verifier plays CHSH with the provers and checks for a Bell inequality violation. If prover passes, he must be holding Bell pairs.

# How to Prove Soundness: Measurement Protocol

Enforcing structure?

- No way of using previous techniques
- Use test round of measurement protocol as starting point



At some point in time, prover's state must be of the form:

$$\sum_{b \in \{0,1\}} \alpha_b |b\rangle |x_b\rangle |\psi_{b,x_b}\rangle \quad \text{or} \quad |b\rangle |x_b\rangle |\psi_{b,x_b}\rangle$$

# How to Prove Soundness: Measurement Protocol

Why is this format useful in proving the existence of an underlying quantum state?

$$\sum_{b \in \{0,1\}} \alpha_b |b\rangle |x_b\rangle |\psi_{b,x_b}\rangle \quad \text{or} \quad |b\rangle |x_b\rangle |\psi_{b,x_b}\rangle$$

- Can be used as starting point for prover, followed by deviation from the protocol, measurement and decoding by the verifier
  - ▶ Deviation is an arbitrary unitary operator  $U$
  - ▶ Verifier's decoding is  $d \cdot (x_0 \oplus x_1)$
- The part of the unitary  $U$  acting on the first qubit is therefore *computationally randomized*, by both the initial state and the verifier's decoding
  - ▶ Pauli twirl technique?

# How to Prove Soundness: Measurement Protocol

Why is this format useful in proving the existence of an underlying quantum state?

$$\sum_{b \in \{0,1\}} \alpha_b |b\rangle |x_b\rangle |\psi_{b,x_b}\rangle \quad \text{or} \quad |b\rangle |x_b\rangle |\psi_{b,x_b}\rangle$$

- Difficulty in using Pauli twirl: converting this computational randomness into a form which can be used to simplify the prover's deviation
  - ▶ Rely on hardcore bit properties regarding  $d \cdot (x_0 \oplus x_1)$

# Conclusion

- Verifiable, secure delegation of quantum computations is possible with a classical machine
- Rely on quantum secure trapdoor claw-free functions (from learning with errors)
  - ▶ Use TCF to characterize the initial space of the prover
  - ▶ Strengthen the claw-free property to complete the characterization and prove the existence of a quantum state

# Thanks!