#### Quantum Proofs for Classical Theorems

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 Based on a survey co-written with Ronald de Wolf (CWI, Netherlands).

### Surprising proof methods



• Often "import" unexpected objects or concepts.

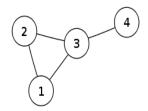
## Surprising proof methods

• Celebrated example: the probabilistic method (Erdős et al.)



## Example: maximum edge cut

• Given: an undirected graph G = (V, E).



#### Claim

There exists a partition V = (A, B) such that

$$|E(A,B)| \ge |E|/2.$$

### Example: maximum edge cut

#### Claim

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$$|E(A,B)| \ge |E|/2.$$

**Proof:** Send each vertex to A or B randomly! Each  $e \in E$  lands in E(A, B) with probability 1/2, so

$$\mathbb{E}[|E(A,B)|] = |E|/2.$$

## An objection

- Do we really need randomness here?
- "Just" a counting argument.

#### However...

- Language of probability theory brings intuitions and tools:
- Concentration of measure; martingales; Lovasz local lemma;

### A 'quantum method'?

- Past 10+ years: quantum concepts and tools used as a proof-tool for *classical* math and CS.
- Used either directly, or as inspiration.
   [DdW] surveys many examples. (No quantum background needed!)

## A 'quantum method'?

- Aren't quantum arguments 'just' linear algebra (+ matrix analysis, etc.)?
- Yes, but...
- Quantum concepts and intuitions seem to help!

### A 'quantum method'?

- Area is still young...
- In most cases, alternate 'classical proofs' are available.
- Room for growth and new ideas!

## What is quantum?

- Our perspective: QM is a framework for describing systems and changes they undergo.
- A strange, distinctive framework... that's the point!
- Not a full physical theory!

## What is quantum?

- Similar situation in classical theoretical CS—bits, logic, TMs, etc.:
- Studied independently of its physical realization.
- Most of the quantum systems we'll describe cannot yet be realized!

## What is quantum?

 Can use quantum proof tools, even if QM turns out to be wrong!



### Quantum basics

• A quantum state (for us) is just a unit vector

$$|\psi\rangle \in \mathbb{C}^d$$

- (we only use *pure*, finite-dimensional states)
- "m-qubit state":  $d = 2^m$ , basis vectors  $|x\rangle$ ,  $x \in \{0, 1\}^m$ :

$$|\psi\rangle = \sum_{\mathbf{x}} \alpha_{\mathbf{x}} |\mathbf{x}\rangle$$

### Quantum basics

Product states:

$$|\alpha\rangle \in \mathbb{C}^d, |\beta\rangle \in \mathbb{C}^{d'} \Rightarrow |\alpha\rangle |\beta\rangle \in \mathbb{C}^{d \cdot d'} :$$
  
$$(|\alpha\rangle |\beta\rangle)_{i,j} = \alpha_i \beta_j$$

• "independent subsystems"

## (Discrete-time) quantum evolution

Two things we can do with a quantum state:

- Transform it "unitarily"
- Measure it

## Unitary transformations

$$|\psi\rangle \longmapsto U|\psi\rangle$$
,

where  $U \in \mathbb{C}^{d \times d}$  is **unitary** (norm-preserving)

#### Measurements

• Projective measurement M defined by orthogonal projectors  $P_1, \ldots, P_k \in \mathbb{C}^{d \times d}$ , with

$$\sum_{i} P_{i} = I_{d \times d}$$

- Applied to  $|\psi\rangle$ : observe outcome  $i \in [k]$  with probability  $p_i = ||P_i|\psi\rangle||^2$ .
- ullet  $|||\psi\rangle||=1$ , so probs. sum to 1
- After outcome i, state "collapses" to  $\frac{P_i|\psi\rangle}{||P_i|\psi\rangle||}$ .

### First quantum insight

• Quantum states can't store too much accessible information.

### Theorem (Holevo, CDNT—informal)

Suppose Alice wants to send Bob n bits of information. Then the two parties must exchange  $\Omega(n)$  qubits of communication.

• (even with prior entanglement)

# Application: Communication Complexity of Inner Product

**Alice:** *x* **Bob:** *y* 
$$(|x| = |y| = n)$$

Want to compute:

$$IP(x, y) = x \cdot y \mod 2$$

- Known that  $\Omega(n)$  (qu)bits of communication are necessary
- (even with prior entanglement)

# Application: Communication Complexity of Inner Product

- Result is nontrivial even for classical randomized case ("discrepancy method").
- Quantum techniques give a novel, elegant proof. [Cleve, van Dam, Nielsen, Tapp]

- Say  $\mathcal{P}$  is a c-bit classical protocol computing IP (exactly, for simplicity). WTS  $c = \Omega(n)$ .
- First step: Convert  $\mathcal{P}$  to a clean quantum protocol
- Clean protocol: of form

$$|x\rangle|y\rangle \longmapsto^{\mathcal{P}} |x\rangle(-1)^{x\cdot y}|y\rangle$$

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• Here's how:

$$|x\rangle|y\rangle\longmapsto^{\mathcal{P}}|\Phi_{x,y}\rangle$$

$$\longmapsto^{(Bob)}(-1)^{x\cdot y}|\Phi_{x,y}\rangle$$

$$\longmapsto^{\mathcal{P}^{-1}}(-1)^{x\cdot y}|x\rangle|y\rangle$$

•  $\mathcal{P}$  communicates c bits  $\implies \mathcal{P}'$  communicates 2c qubits.

- **Second step:** Run clean protocol in superposition over all y:
- Start state:  $|x\rangle \left(\frac{1}{\sqrt{2^n}}\sum_y |y\rangle\right)$  $\longmapsto^{\mathcal{P}'} |x\rangle \left(\frac{1}{\sqrt{2^n}}\sum_y (-1)^{x\cdot y} |y\rangle\right)$

• Third step: Bob performs Hadamard transformation:

$$|x\rangle\left(\frac{1}{\sqrt{2^n}}\sum_{y}(-1)^{x\cdot y}|y\rangle\right)\longmapsto^{H^{\otimes n}}|x\rangle|x\rangle$$

- **SO:** Alice transmits x to Bob in 2c qubits!
- Holevo  $\Longrightarrow 2c = \Omega(n)$ .

# Application: Coding theory lower bounds

• Locally decodable codes:

$$C: \{0,1\}^n \to \{0,1\}^m$$

- Want to recover any desired bit  $x_i$ , using  $q \ll n$  queries to C(x) (nonadaptive)
- Tolerate a .01 fraction of errors in transmitted codeword  $\tilde{C}(x)$ ....
- Still succeed with 2/3 probability (for any i)
- How large must codelength *m* be?

## Application: Coding theory lower bounds

- **Open:** Achieve m = poly(n) for some constant q = O(1)?
- q = 3:  $m = 2^{n^{o(1)}}$  is possible [Yekhanin, Efremenko]
- [Kerenedis, de Wolf]: if q = 2, need  $m = 2^{\Omega(n)}$
- Proof in **[KdW]** is quantum
- Later classical proof [Ben-Aroya, Regev, de Wolf]; modeled on quantum

## Application: Coding theory lower bounds

Proof idea: Convert C into quantum encoding:

$$x \longmapsto |\phi_x\rangle := \sum_{j=1}^m (-1)^{C(x)_j} |j\rangle$$

- Only log m qubits!
- [KdW]: If q=2,  $\{|\phi_x\rangle\}$  is a quantum random access code (QRAC) for n bits
- (can recover desired  $x_i$  with prob.  $\frac{1}{2} + \Omega(1)$  over random x)
- Variant of Holevo's theorem for QRACs [Nayak] implies  $\log m = \Omega(n)$ .

## Second quantum insight

• Quantum algorithms useful to construct polynomials.

## Quantum query algorithms

Unknown input  $y \in \{0,1\}^n$ ; want to compute some function f(y).

basis state: 
$$\underbrace{|i,b\rangle}_{\substack{\text{index register}\\i\in[n],b\in\{0,1\}}}\underbrace{|z\rangle}_{\substack{\text{aux. register}\\\text{aux. register}}}$$

• Query step:  $|\psi\rangle \longmapsto {\cal O}_{{\sf y}}|\psi\rangle$ 

$$|i,b\rangle|z\rangle\longmapsto^{O_y}|i,b\oplus y_i\rangle|z\rangle$$

(Indirect access to input y)

## Quantum query algorithms

- Unitary step:  $|\psi\rangle \to U|\psi\rangle$
- (Independent of *y*)

## Quantum query algorithms

#### T-query quantum algorithm:

$$|\psi_0\rangle \longmapsto U_T O_y U_{T-1} O_y \dots U_1 O_y U_0 |\psi_0\rangle$$

ullet Final measurement step, yields a value  $v \in \mathbb{R}$ 

## The polynomial connection

#### T-query quantum algorithm A:

$$|\psi_0\rangle \longmapsto U_T O_y U_{T-1} O_y \dots U_1 O_y U_0 |\psi_0\rangle$$

Theorem (BBCMdW)

For any  $v \in \mathbb{R}$ , the quantity

$$p_{v}(y) = \Pr_{\mathcal{A}}[\mathcal{A}(y) \text{ outputs } v]$$

is a degree-2T multilinear polynomial in  $y_1, \ldots, y_n$ .

# The polynomial connection

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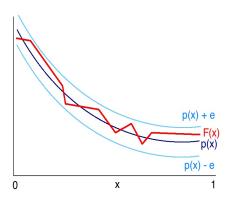
- Often used to prove lower bounds on the quantum query complexity of specific functions, via lower bounds on polynomial degree...
- But here we use it to build explicit polynomials.

#### Application: uniform approximation

Theorem (Weierstrass, 1885)

Say  $F:[0,1]\to\mathbb{R}$  is continuous. Given  $\varepsilon>0$ , there exists a polynomial p(x) such that

$$\sup_{x \in [0,1]} |p(x) - F(x)| \le \varepsilon.$$



Andrew Drucker, Quantum Proofs for Classical Theorems 37/60

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• Fix F; suppose we require  $deg(p) \le n$ . How low can  $\varepsilon$  be?

#### Bernstein's proof

- ullet Bernstein,  $\sim$ 1910: proof of W.'s Theorem by "probabilistic method"!
- Gives bounds on error of degree-*n* polynomial approximations.

# Bernstein's proof

- Fix  $F, n, \text{ and } x \in [0, 1].$
- Experiment A(x):

-Flip n coins  $c_1, \ldots, c_n$  with bias x;

-Let 
$$k = \text{number of 1s seen}$$
; -Output  $F\left(\frac{k}{n}\right)$ .

• Idea:  $\frac{k}{n} \approx x \pm \frac{1}{\sqrt{n}}$ , so

$$\mathbb{E}_{c_1,\ldots,c_n}[\mathcal{A}(x)] \approx F(x \pm 1/\sqrt{n})$$
.

## Bernstein's proof

•  $\sup_{x \in [0,1]} |\mathbb{E}[A(x)] - F(x)| \le$ 

 $O(\max \text{ fluctuation of } F \text{ on any interval of length } 1/\sqrt{n}))$ 

- ullet  $\to$  0 as  $n \to \infty$
- Observation:  $\mathbb{E}[A(x)]$  is a degree-n polynomial in x!
- Because, e.g.,  $\Pr[(c_1,\ldots,c_n)=\text{all-zero}]=(1-x)^n$

#### Jackson's theorem

- ullet Jackson, also  $\sim$ 1910: proof of Weierstrass's Theorem by trigonometric tools
- Better error bounds for fixed n:

#### Theorem (Jackson)

If  $F:[0,1]\to\mathbb{R}$  is continuous, there exists a degree-n polynomial  $J_n$  such that

$$\sup_{x\in[0,1]}|J_n(x)-F(x)|\leq$$

 $O(\max fluctuation of F on any interval of length 1/n)$ 

- [D., de Wolf]: Prove Jackson's Theorem, using Bernstein's elegant technique.
- Idea: Replace the classical algorithm  ${\mathcal A}$  with a quantum algorithm!

#### Quantum estimation

#### Claim

There is a quantum algorithm  $QEst(c_1, ..., c_N)$ , which:

- makes  $\sqrt{N}$  quantum queries to  $(c_1, \ldots, c_N)$ ;
- outputs an estimate  $\tilde{x}$  satisfying

$$\mathbb{E}\left[\left|\tilde{x}-\frac{c_1+\ldots+c_N}{N}\right|\right]=O\left(\frac{1}{\sqrt{N}}\right).$$

• Proof idea: Apply a known quantum estimation algorithm [Brassard, Høyer, Mosca, Tapp] 3 times; take the median value.

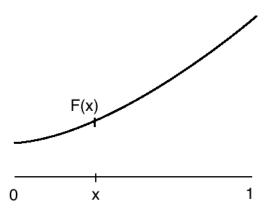
- Fix F, n, and  $x \in [0, 1]$ .
- Experiment  $\mathcal{A}'(x)$ :

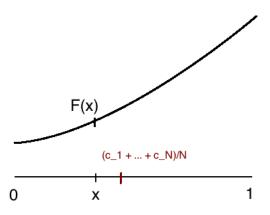
-Flip 
$$N = n^2$$
 coins  $c_1, \ldots, c_N$  with bias  $x$ ;

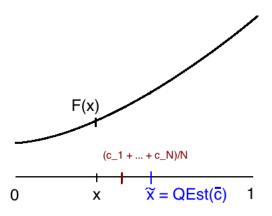
-Let 
$$\tilde{x} = \mathbf{QEst}(\overline{c})$$
;

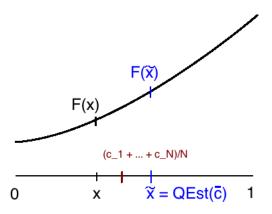
-Output  $F(\tilde{x})$ .

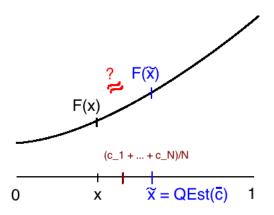
• Let  $J_n(x) = \mathbb{E}[\mathcal{A}'(x)] = \mathbb{E}[F(\tilde{x})].$ 











Recall  $N = n^2$ .

#### Analysis idea:

$$\frac{c_1 + \ldots + c_N}{N} \approx x \pm \frac{1}{n}$$
 (by Chernoff bounds);

$$\widetilde{x} pprox rac{c_1 + \ldots + c_N}{N} \;\; \pm \;\; rac{1}{n} \;\;\;\;\; ext{(by properties of } \mathbf{QEst}(\overline{c}));$$

So:

$$J_n(x) = \mathbb{E}[F(\tilde{x})] \approx F(x \pm 1/n \pm 1/n)$$
,

i.e., 
$$|J_n(x) - F(x)| \le$$

 $O(\max \text{ fluctuation of } F \text{ on an interval of length } 1/n)$  .

- So,  $J_n$  is the desired approximation to F.
- Claim: it's a polynomial in x of degree 2n.
- Easy proof, using [BBCMdW]:

$$J_n(x) = \mathbb{E}[F(\tilde{x})] = \mathbb{E}_{\overline{c}}[\mathbb{E}[F(\tilde{x})|\overline{c}]]$$

$$= \mathbb{E}[(\text{degree-}2n \text{ poly in } c_1, \dots, c_n)] \quad (\text{by [BBCMdW]})$$

$$= (\text{degree-}2n \text{ poly in } x)$$

- Noisy queries: each query gives wrong answer with some small probability  $\varepsilon_i \leq 1/4$ .
- (Models use of probabilistic subroutines)

Classical query algorithms: Require  $\Omega(n \log n)$  noisy queries to compute  $y_1 \oplus \ldots \oplus y_n$ . [Feige, Raghavan, Peleg, Upfal]

Theorem (Buhrman, Newman, Röhrig, de Wolf)

**Any** Boolean function can be computed with bounded error using O(n) noisy quantum queries.

**Proof Idea:** Maintain guesses of  $y_1, \ldots, y_n$ ; repeatedly use variant of Grover search to reduce number of errors.

• Using their result, **[BNRdW]** give a new kind of polynomial approximations of Boolean functions.

• Let  $p: \mathbb{R}^n \to \mathbb{R}$  be a polynomial, f a Boolean function. p robustly approximates f if for all  $y \in \{0,1\}^n$ , and all  $z \in [0,1]^n$ ,

$$||z-y||_{\infty} \leq 1/4 \quad \Rightarrow \quad |p(z)-f(y)| \leq 1/4$$
.

#### Theorem (BNRdW)

For any Boolean function f, there is a polynomial p of degree O(n) that robustly approximates f.

#### Third quantum insight

Quantum mechanics is inspiring.

### Third quantum insight

- [Aharonov, Regev]: Classical proof systems for approximate shortest vector problem, inspired by their earlier quantum proof systems.
- [Aaronson]: New lower bounds on classical query complexity of "local search", inspired by Ambainis' quantum adversary method.

#### What's next?

- More classical applications of quantum proof tools? Seems likely.
- One avenue: compare quantum proofs with "linear algebra method" in combinatorics [Babai, Frankl]
- Looking forward to more surprising proofs!

#### What's next?

# Thanks!