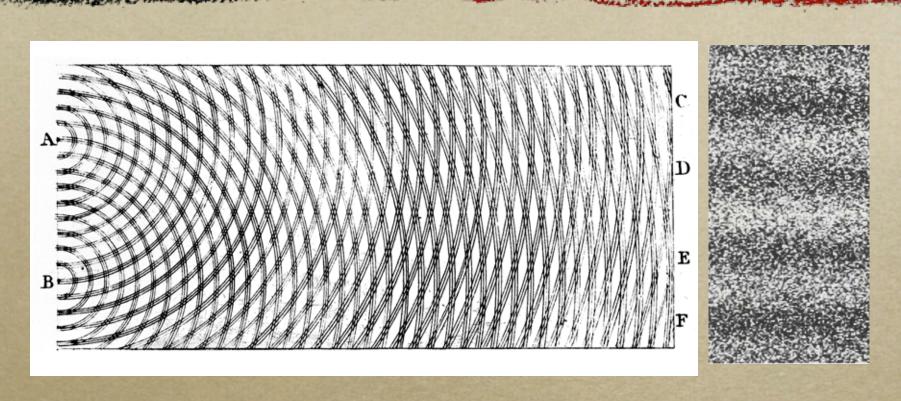
# Fearful Symmetries: An Introduction to Quantum Algorithms



Cristopher Moore, Santa Fe Institute

#### Physics and Computation

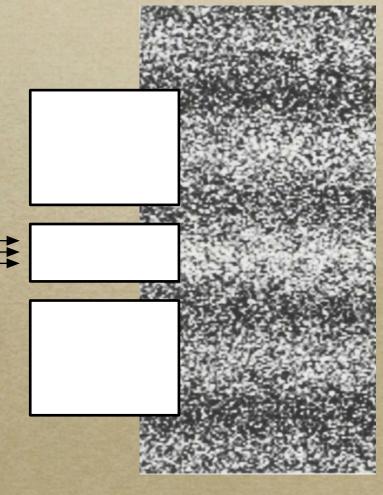
- Physical Church-Turing Thesis: any physical computing device is at most as powerful as a Turing machine
- Any physical system can be simulated by a standard computer
- Strong version: we can simulate a system in polynomial time (as a function of spacetime)

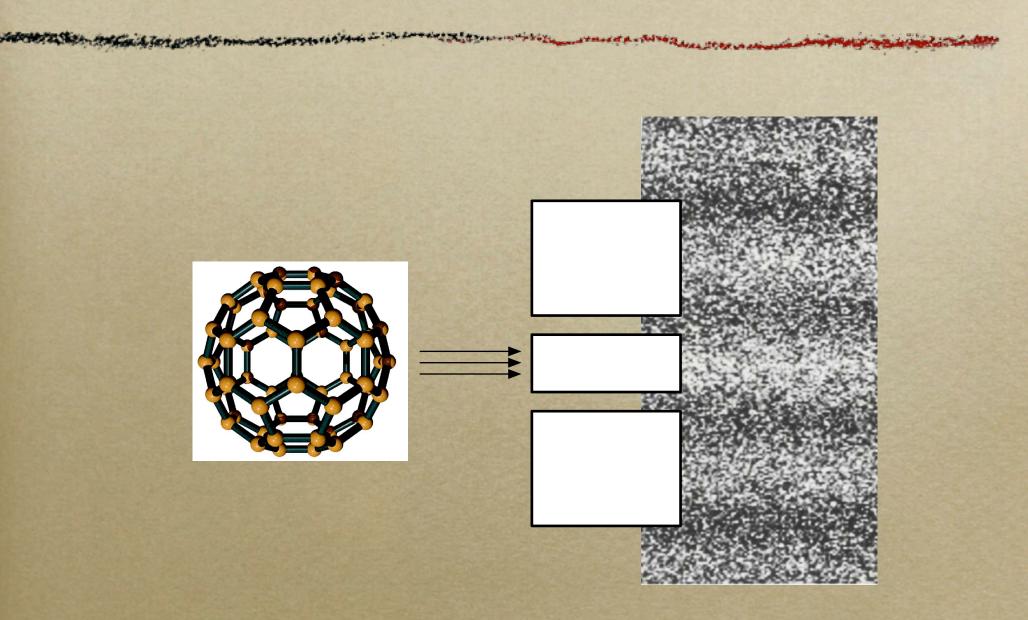


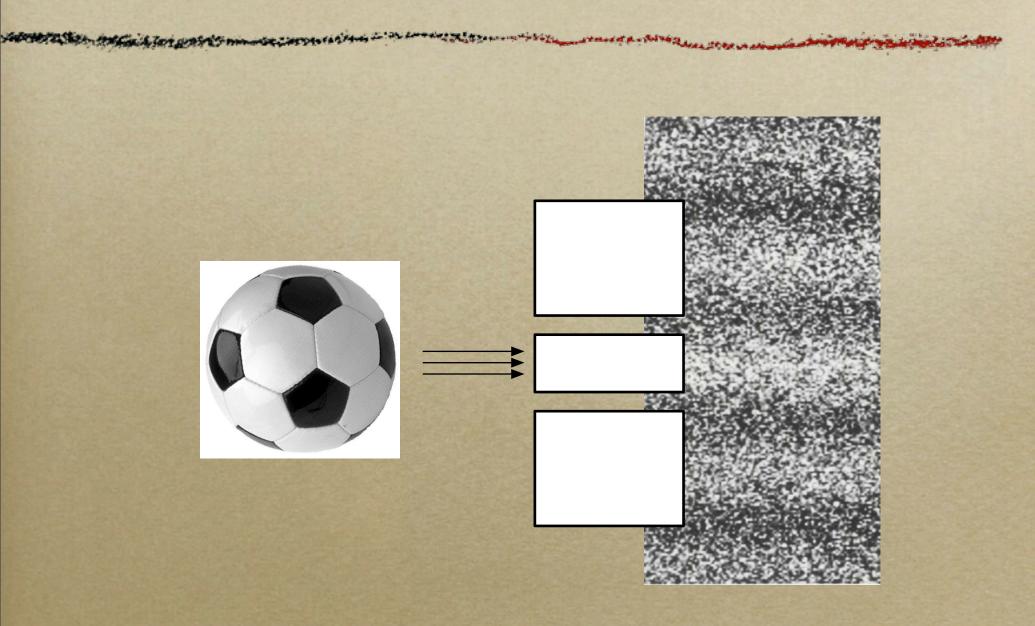
• Thomas Young, 1801: light is possessed of opposite qualities, capable of neutralising or destroying each other.

- Double-slit experiment
- Instead of two bright spots, an interference pattern...

• ...even when there is only one electron at a time!

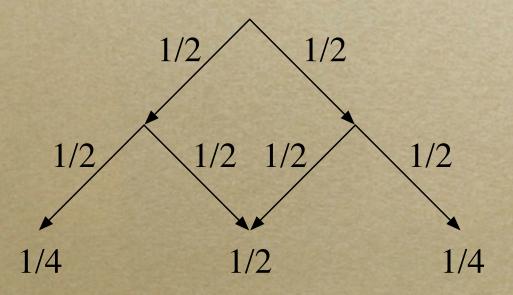






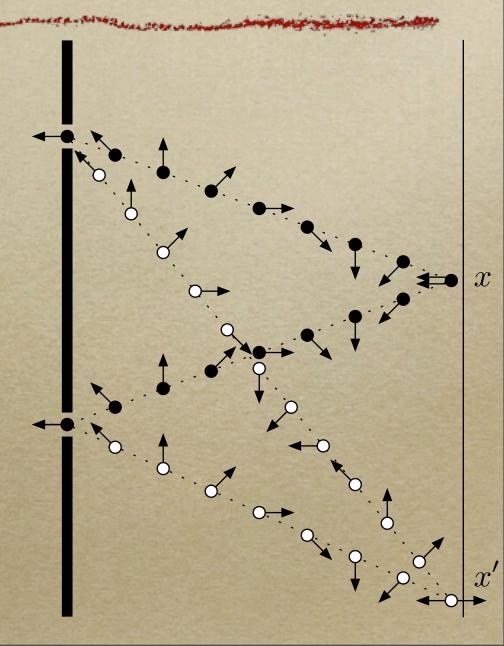
#### Probabilities Add

- Each path has a probability:
   product of probability of each step
- Total probability = sum over paths



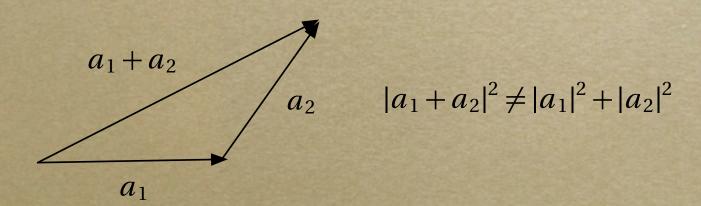
#### Amplitudes Interfere

- Probabilities don't add!
- Quantum states have phases, which can add constructively or destructively.
- Quantum algorithms:
   wrong answers cancel,
   right ones add up



#### Amplitudes interfere

- Each path has a complex-valued amplitude
- Amplitudes can add constructively or destructively
- Probability is lamplitudel<sup>2</sup>



#### **Transitions**

- Each step of a probabilistic algorithm is a stochastic matrix: columns sum to 1
- e.g. if heads, leave it alone; if tails, flip

$$\begin{pmatrix} 1 & 1/2 \\ 0 & 1/2 \end{pmatrix} \begin{pmatrix} 1 \\ 0 \end{pmatrix} = \begin{pmatrix} 1 \\ 0 \end{pmatrix} \qquad \begin{pmatrix} 1 & 1/2 \\ 0 & 1/2 \end{pmatrix} \begin{pmatrix} 0 \\ 1 \end{pmatrix} = \begin{pmatrix} 1/2 \\ 1/2 \end{pmatrix}$$

#### **Transitions**

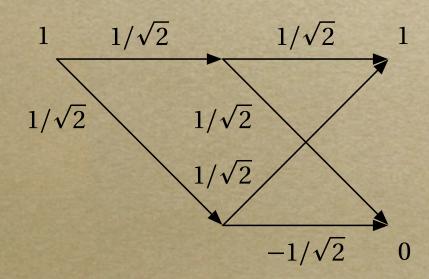
- Each step of a quantum algorithm is a *unitary* matrix: it rotates the state, preserving the Euclidean length (sum of squares)
- e.g. the Hadamard matrix produces two superpositions which are not the same!

$$\begin{pmatrix} 1/\sqrt{2} & 1/\sqrt{2} \\ 1/\sqrt{2} & -1/\sqrt{2} \end{pmatrix} \begin{pmatrix} 1 \\ 0 \end{pmatrix} = \begin{pmatrix} 1/\sqrt{2} \\ 1/\sqrt{2} \end{pmatrix} \qquad \begin{pmatrix} 1/\sqrt{2} & 1/\sqrt{2} \\ 1/\sqrt{2} & -1/\sqrt{2} \end{pmatrix} \begin{pmatrix} 0 \\ 1 \end{pmatrix} = \begin{pmatrix} 1/\sqrt{2} \\ -1/\sqrt{2} \end{pmatrix}$$

#### **Transitions**

Sum over paths = matrix product

$$\begin{pmatrix} 1/\sqrt{2} & 1/\sqrt{2} \\ 1/\sqrt{2} & -1/\sqrt{2} \end{pmatrix} \begin{pmatrix} 1/\sqrt{2} & 1/\sqrt{2} \\ 1/\sqrt{2} & -1/\sqrt{2} \end{pmatrix} = \begin{pmatrix} 1 & 0 \\ 0 & 1 \end{pmatrix}$$



#### Entanglement

- A two-qubit system has a 4-dimensional state
- If they are independent, a tensor product:

$$a_{00} = b_0 c_0$$
  
$$a_{01} = b_0 c_1$$

$$a_{10} = b_1 c_0$$

$$a_{11} = b_1 c_1$$

#### Entanglement

- A joint state, not a product of independent ones
- Like classical correlation, except...

$$a_{00} = 1/\sqrt{2}$$
  $p_{00} = 1/2$   
 $a_{01} = 0$   $p_{01} = 0$   
 $a_{10} = 0$   $p_{10} = 0$   
 $a_{11} = 1/\sqrt{2}$   $p_{11} = 1/2$ 

#### Alice and Bob

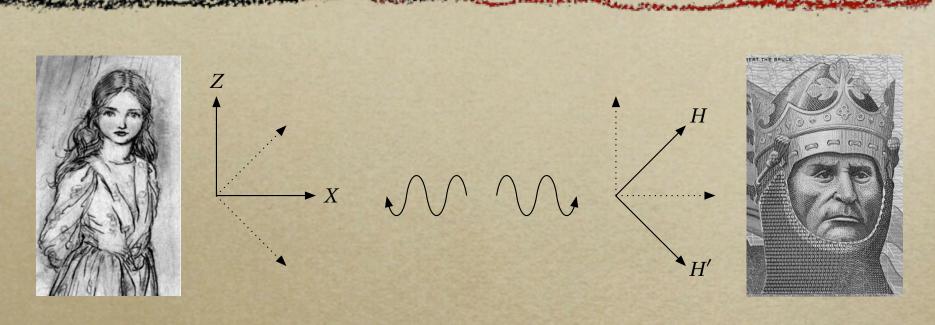
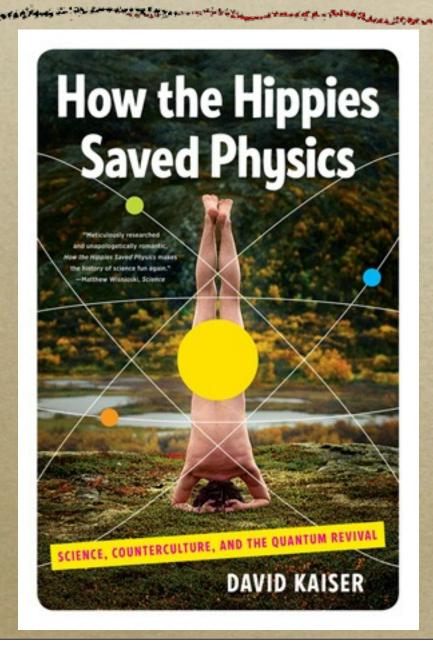


FIGURE 15.4: Alice and Bob. Alice can measure her qubit in either the Z-basis or the X-basis, and Bob can measure his in the H-basis or the H'-basis. The resulting measurements are more correlated than any classical probability distribution, correlated or not, can account for.

• But (sadly) we can't use this to communicate faster than light!

#### Alice and Bob and the Hippies



#### Physics



Fig. 1: Nature

#### Problems:

- come from Nature
- have solutions that are as simple, symmetric, and beautiful as possible (far more so than we have any right to expect)

#### Computer Science

#### Problems:

- are artificial
- are maliciously designed to be the worst possible
- may or may not have elegant solutions

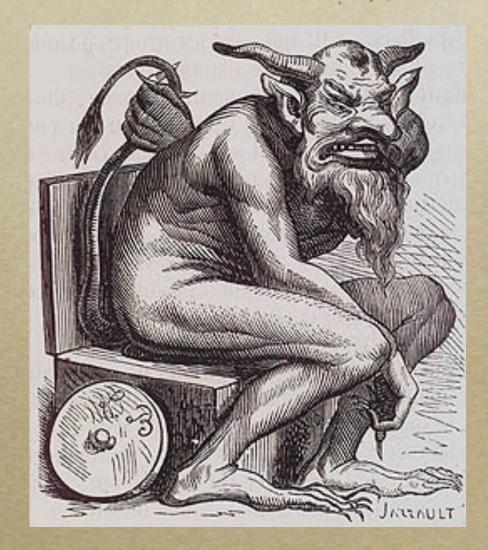
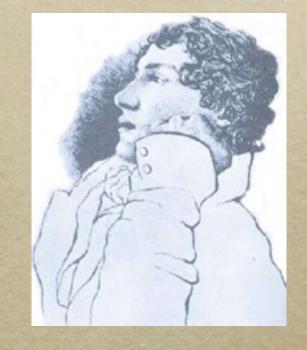
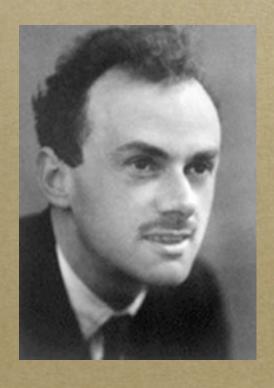


Fig. 2: The Adversary

## Beauty is Truth, Truth Beauty

In 1928, Dirac saw that the simplest, most beautiful equation for the electron has *two* solutions.





Four years later, the positron was found in the laboratory.

## Conservation is Symmetry

$$\frac{dx}{dt} = \frac{\partial \mathcal{H}}{\partial p} \quad , \quad \frac{dp}{dt} = -\frac{\partial \mathcal{H}}{\partial x}$$

perhaps you are more familiar with p = mvand F = ma; try with  $\mathcal{H} = (1/2)mv^2 + V(x)$ 

Conservation of momentum follows from translation invariance: moving entire world by dx  $\frac{dp}{dt} = -\frac{\partial \mathcal{H}}{\partial x} = 0$  doesn't change energy

# Conservation is Symmetry



Noether's Theorem: symmetry implies conservation

$$\frac{d\theta}{dt} = \frac{\partial \mathcal{H}}{\partial J} \quad , \quad \frac{dJ}{dt} = -\frac{\partial \mathcal{H}}{\partial \theta}$$

Conservation of angular momentum follows from symmetry under rotation! In classical and quantum mechanics, *all* conservation laws are of this form.

## Relativity is Symmetry

Physics is invariant under changes of coordinates to a moving frame:

$$\begin{pmatrix} x \\ ct \end{pmatrix} \to \gamma \begin{pmatrix} 1 & -v/c \\ -v/c & 1 \end{pmatrix} \begin{pmatrix} x \\ ct \end{pmatrix}$$

at small velocities, Galileo:

$$x \to x - vt$$
,  $t \to t$ 



#### Groups

#### A group is a mathematical structure with:

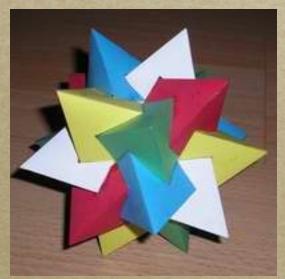
- associativity:  $a \cdot (b \cdot c) = (a \cdot b) \cdot c$
- identity:  $a \cdot 1 = 1 \cdot a = a$
- inverses:  $a \cdot a^{-1} = a^{-1} \cdot a = 1$
- but not necessarily  $a \cdot b \neq b \cdot a$

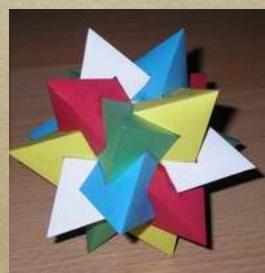
(these are non-Abelian groups)



#### Some Common Groups

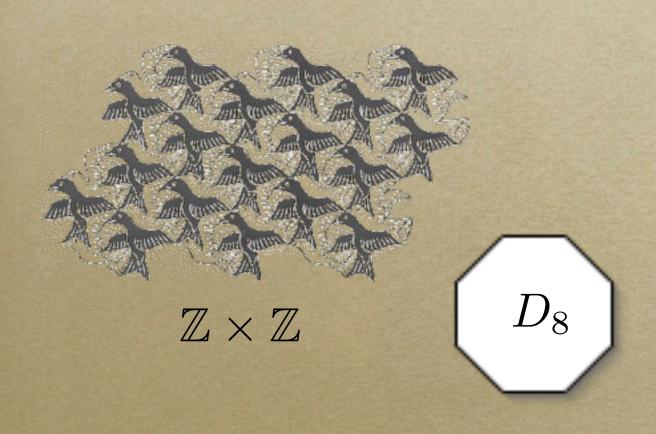
- cyclic:  $\mathbb{Z}_n$  (addition mod n),  $\mathbb{Z}_n^*$  (multiplication)
- symmetric group (permutations):  $S_n, A_n$
- invertible matrices
- $\circ$  rotations: O(3)
- $\circ O(3)$  contains  $A_5!$





# Symmetry Groups

Transformations that leave an object fixed:





## When Symmetry is Periodicity

• Given a function  $f: \mathbb{Z}_n \to S$  we can ask for which h we have

$$f(x) = f(x+h)$$

for all x.

- These h are multiples of the periodicity r.
- The set of all such h forms a subgroup.

#### Periodicity Gives Factoring!

- To factor n, let  $f(x) = c^x \mod n$ .
- Find smallest r such that f(x) = f(x+r) i.e.,  $c^r \equiv 1 \bmod n$ . Suppose r is even:

$$c^{r} - 1 = kn = (c^{r/2} + 1)(c^{r/2} - 1)$$

- Now take g.c.d. of n with both factors (easy).
- Works at least 1/2 the time with random c!

## Factoring: An Example

• Let's factor 15. Choose c=2:

$$x: 0 1 2 3 4 5 6 7 8$$
  
 $2^x: 1 2 4 8 1 2 4 8 1$ 

$$2^4 - 1 = 15 = (2^2 - 1)(2^2 + 1) = 3 \times 5$$

Bad news: in general r could be as large as n, exponentially big as a function of #digits.

#### Quantum Measurements

Measure f(x), and "collapse" to a superposition

x: 0 1 2 3 4 5 6 7 8 $2^x: 4 4$ 

This is a random *coset* of the subgroup *H*.

But, if we simply measure x, all we see is a random value! This is the wrong measurement.

#### The Fourier Transform

Periodicities are peaks in  $\hat{f}$ , where  $(\omega = e^{2\pi i/n})$ 

$$f(x) = \frac{1}{\sqrt{n}} \sum_{k} \hat{f}(k) \,\omega^{kx} \,, \ \hat{f}(k) = \frac{1}{\sqrt{n}} \sum_{x} f(x) \,\omega^{-kx}$$

Change of basis  $Q_{x,k} = \frac{1}{\sqrt{n}} \omega^{kx}$ 

from x to k. This transformation is unitary:  $Q^{-1} = Q^{\dagger}$ 

#### Shor's Algorithm

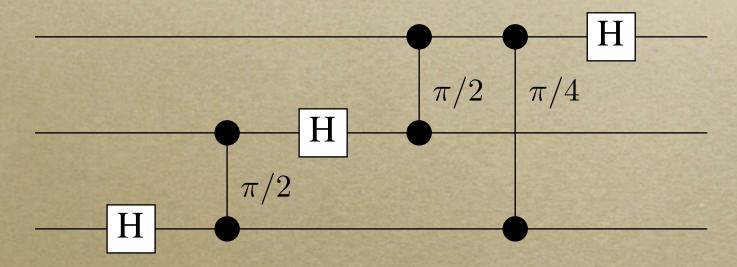
• Quantum mechanics allows us to perform unitary transformations.

- We can "do" the Fourier transform  $\mod n$  with only  $O(\log^2 n)$  elementary quantum operations.
- We then measure the frequency, this gives us the periodicity of f(x).



#### Efficient Circuits for the QFT

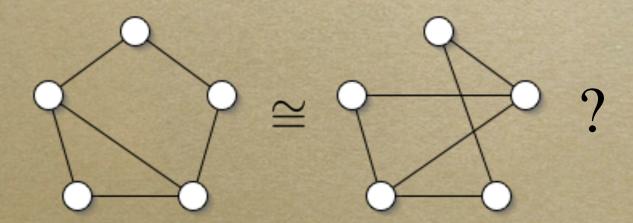
• We can break down the QFT recursively (like the FFT) into elementary gates:



- Quadratic in the number of qubits
- Thus n can be exponentially large!

#### Graph Isomorphism

- Factoring appears to be outside P, but not NP-complete. (Indeed, we believe that BQP does not contain all of NP.)
- Another candidate problem like this:



# Solving with Symmetry

- Take the union of the two graphs. Permuting the 2n vertices defines a function f on  $S_{2n}$ . What is its symmetry subgroup H?
- Assume no internal symmetries. Then either f is 1-1 and  $H = \{1\}$ , or f is 2-1 and

$$H = \{1, m\}$$

for some m that exchanges the two graphs.

#### The Permutation Group

• The set of n! permutations of n things forms the permutation group  $S_n$ :

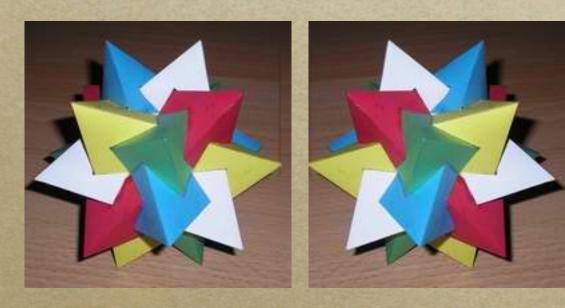
• A richly non-Abelian group  $(ab \neq ba)$ 

#### The Hidden Subgroup Problem

- We have a function  $f: G \to X$
- We want to know its symmetries  $H \subseteq G$
- Essentially all quantum algorithms that are exponentially faster than classical are of this form:
  - $\mathbb{Z}_n^*$  = factoring
  - $S_n$  = Graph Isomorphism
  - $D_n$  = some cryptographic lattice problems

#### Non-Abelian Fourier Transforms

- For non-Abelian G, we need representations:
- Geometric pictures of G in d-dimensional space



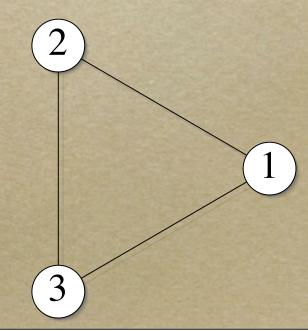
• A<sub>5</sub> has a three-dimensional representation: permute the colors by rotating.

#### Non-Abelian Fourier Transforms

•  $S_3$  has 1 (trivial),  $\pi = \pm 1$  (parity), and rotations of three points in the plane:

$$\rho((1\,2)) = \begin{pmatrix} 1 & 0 \\ 0 & -1 \end{pmatrix}, \ \rho((1\,2\,3)) = \begin{pmatrix} -1/2 & \sqrt{3}/2 \\ -\sqrt{3}/2 & -1/2 \end{pmatrix}$$

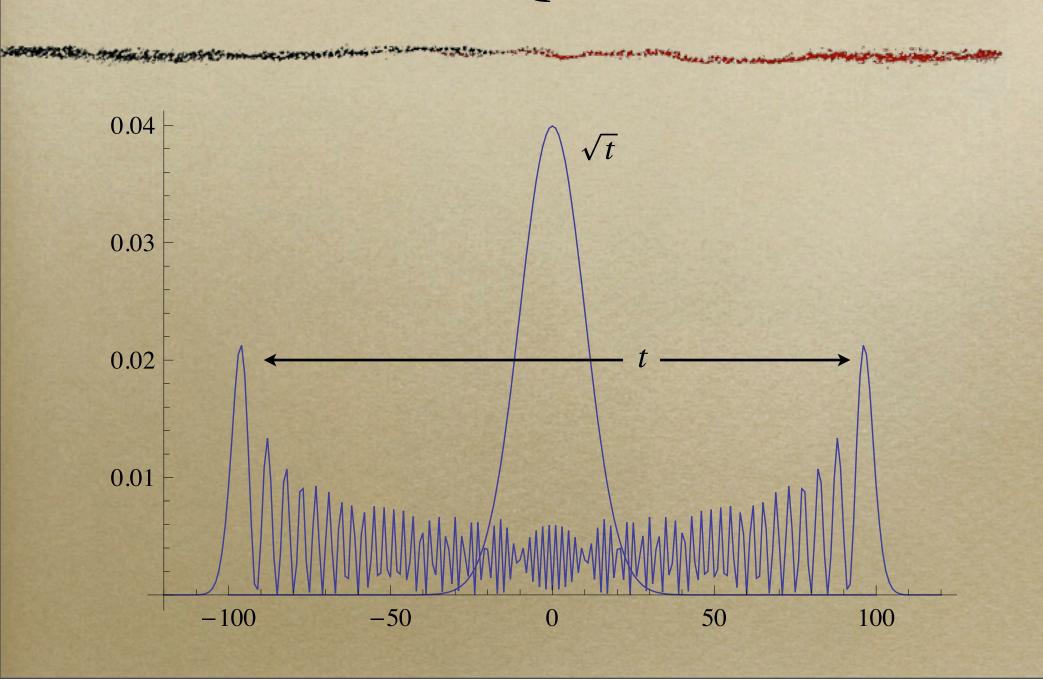
• Gives 1+1+4 = 6 "frequencies," just enough. Coincidence?



#### The Story So Far...

- It turns out that this naïve generalization of Shor's algorithm doesn't work: the permutation group  $S_n$  is "too non-Abelian."
- Tantalizingly, we know a *measurement* exists, but we don't know if we can do it efficiently.
- How much can quantum computing really do? How "special" is factoring?

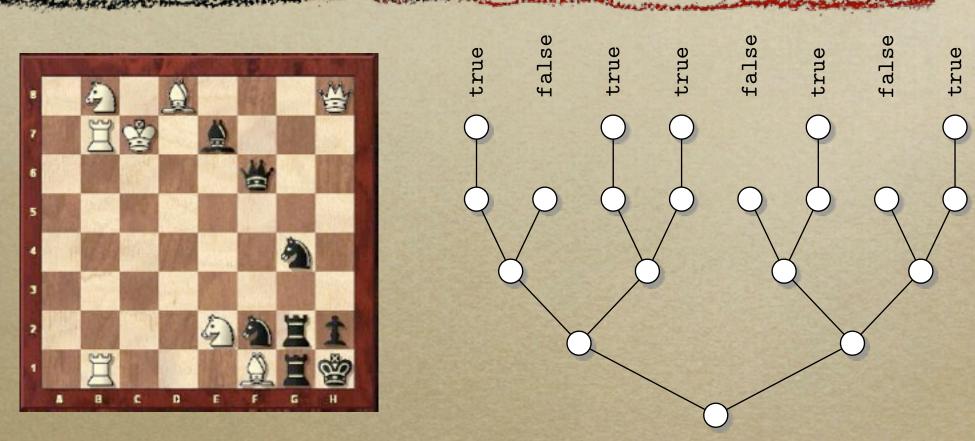
#### Classical and Quantum Walks



## Classical and Quantum Walks

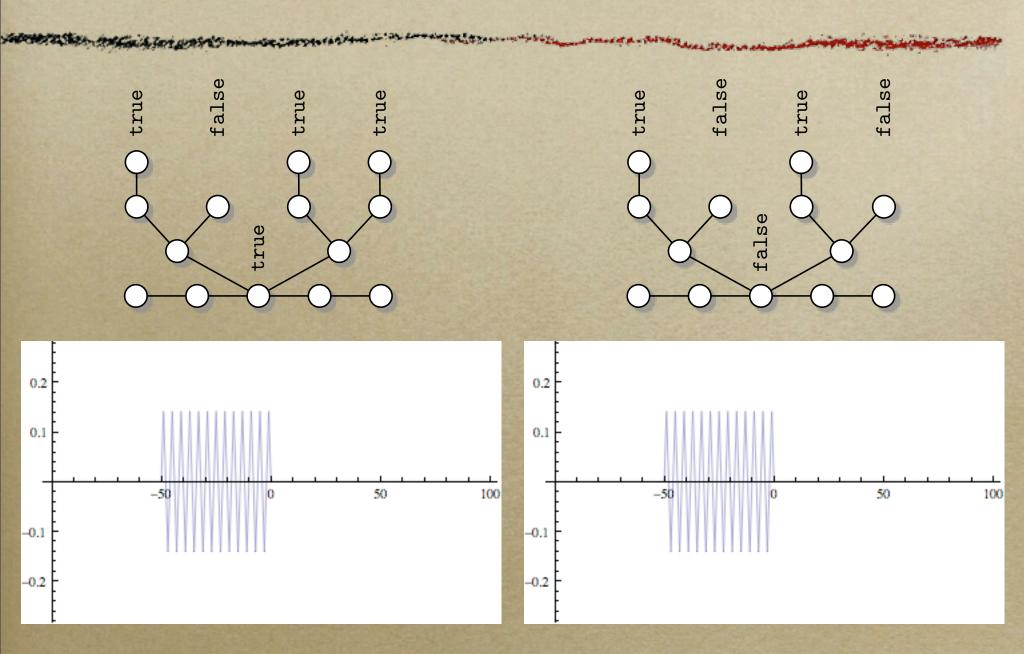


#### Evaluating a Game Tree



• You have a winning strategy if at least one move is a loss for your opponent: a NAND gate

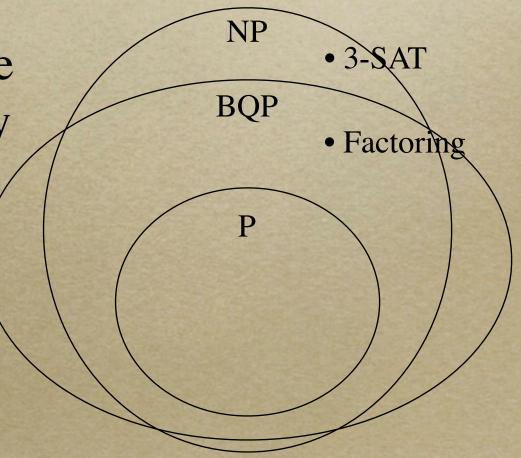
# Scattering Algorithms



#### How Powerful is Quantum?

 We believe that they can't solve NP-complete problems

 But solutions can require quantum proofs to verify



#### Shameless Plug

This book rocks! You somehow manage to combine the fun of a popular book with the intellectual heft of a textbook.

— Scott Aaronson

A treasure trove of information on algorithms and complexity, presented in the most delightful way.

— Vijay Vazirani

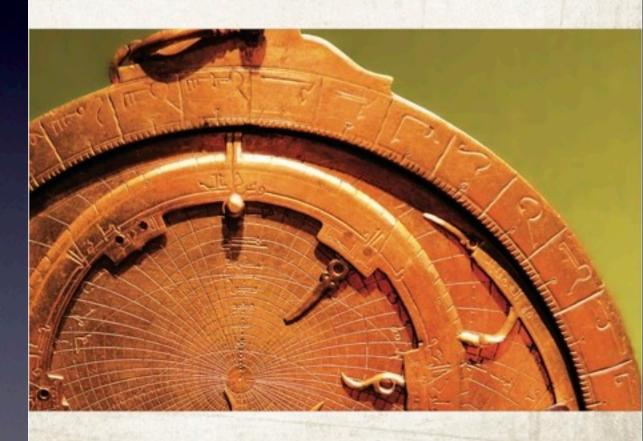
A creative, insightful, and accessible introduction to the theory of computing, written with a keen eye toward the frontiers of the field and a vivid enthusiasm for the subject matter.

— Jon Kleinberg

Oxford University Press, 2011

OXFORD

# THE NATURE of COMPUTATION



Cristopher Moore & Stephan Mertens