



# Quantum Computing

---

John A Clark  
Dept. of Computer Science  
University of York, UK

[jac@cs.york.ac.uk](mailto:jac@cs.york.ac.uk)

York CS Seminar 19 February 2003



# Motivation

---

- To present some important quantum mechanical concepts and illustrate their application to communication and computing
- To summarise important differences with classical computing
- To suggest an avenue for symbiosis
  - Not physics
  - Not philosophy
    - “I’ve got some grad student. He’s thinking about the meaning of quantum mechanics. He’s doomed!”

— John McCarthy (quoted in Williams and Clearwater  
*Explorations in Quantum Computing*, chapter 3)



# Feature

---

**Qubits can exist in superpositions of states**

**Is it a bird? Is it is a bee? Neither, but it's got potential.**



# Qubits – Black and White

---

- In classical computing bits have value 0 or 1. **Eigenstates** of quantum systems are the states you can find yourself in if you look.
- Electrons: 0-1 ness encoded using the electron spin:

$|0\rangle$       **Spin down**       $|\downarrow\rangle$

$|1\rangle$       **Spin up**       $|\uparrow\rangle$

- Whenever you choose **to look** you will always find yourself in one of the **eigenstates** of the system



# Superposition: Gray Qubits

---

- But quantum systems can simultaneously exist in a *superposition* of different states at the same time
- Technically, this is represented as a mixture (with complex coefficients  $a$  and  $b$ )

$$|\Psi\rangle = a|0\rangle + b|1\rangle$$

$$|a|^2 + |b|^2 = 1$$

Will represent in matrix form

$$a|0\rangle + b|1\rangle \quad \begin{pmatrix} a \\ b \end{pmatrix}$$



# Superposition- Walsh Hadamard

- The Walsh Hadamard is a crucially important operation that forms a mixtures according to:

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

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

- Can apply to n individual qubits to get superposition of all  $2^n$  states

$$H^n (|000\dots 0\rangle) = \frac{1}{\sqrt{2^n}} (|0\rangle + |1\rangle) \otimes \dots \otimes (|0\rangle + |1\rangle) = \frac{1}{\sqrt{2^n}} \sum_{x=0}^{2^n-1} |x\rangle = \frac{1}{\sqrt{2^n}} \sum_{x=0}^{2^n-1} x$$



# Multiple Qubits

---

- The idea generalises to several qubits. We can now find ourselves in any of  $2^n$  eigenstates.
- 2-qubit example ( $a, b, c, d$  complex as before)

$$|\Psi\rangle = a|00\rangle + b|01\rangle + c|10\rangle + d|11\rangle$$

$$|a|^2 + |b|^2 + |c|^2 + |d|^2 = 1$$

- As the number of qubits increases linearly, the number of states increases exponentially. Matrix representation much as before

$$\begin{pmatrix} a \\ b \\ c \\ d \end{pmatrix}$$



# Multiple Qubits

---

- 2-qubit example

$$|\Psi\rangle = \frac{1}{2} (|00\rangle + |01\rangle + |10\rangle + |11\rangle)$$

$$a = b = c = d = \frac{1}{2}$$

$$|a|^2 + |b|^2 + |c|^2 + |d|^2 = 1$$





# Multiple Qubits

---

- In 2-qubit example – could think of the combined states as the (direct) product of two qubits states

$$|\Psi\rangle = \frac{1}{\sqrt{2}}(|0\rangle + |1\rangle) \otimes \frac{1}{\sqrt{2}}(|0\rangle + |1\rangle)$$

$$|\Psi\rangle = \frac{1}{\sqrt{2}}|0\rangle \frac{1}{\sqrt{2}}|0\rangle + \frac{1}{\sqrt{2}}|0\rangle \frac{1}{\sqrt{2}}|1\rangle + \frac{1}{\sqrt{2}}|1\rangle \frac{1}{\sqrt{2}}|0\rangle + \frac{1}{\sqrt{2}}|1\rangle \frac{1}{\sqrt{2}}|1\rangle$$

$$|\Psi\rangle = \frac{1}{2}(|00\rangle + |01\rangle + |10\rangle + |11\rangle)$$



# Feature

---

**Quantum systems act differently when they are observed. They collapse.**

**Teaching quality assessment may be closer than you think.**



# Measurements

---

- A measurement of the system gives a random result. When the system is measured it is found to be in one of its eigenstates.
- The probability of being observed in one of the states depends on the coefficients in the superposition
- We find our system in

$|0\rangle$     **With probability  $|a|^2$**

$|1\rangle$     **With probability  $|b|^2$**



# Multiple Measurement

- On previous system measure qubit 1. If you witness a  $|0\rangle$  then the state space of qubit 1 collapses to  $|0\rangle$  and the overall state space becomes

$$|\Psi_{0X}\rangle = \frac{1}{\sqrt{2}} (|00\rangle + |01\rangle)$$

Only 0s now

- Note that there has been some readjustment of the probabilities – *renormalisation*.
- We can now observe qubit 2 and see a  $|0\rangle$  with probability  $1/2$  and a  $|1\rangle$  with probability  $1/2$ .



# Feature

---

**Applying a quantum transformation to a superposition gives a superposition of applying the transformation to its constituent states.**

**Buy 1, get  $2^n - 1$  free.**



# Unitary Transformations

---

- The stuff quantum computations are (mostly) made of (you will make observations too).
- Physically reversible operations.
- Essentially they take amplitude vectors (points in  $\mathbf{C}^{2^n}$ ) and park them elsewhere.
- If we can compute a function  $f$  then we can find a reversible variant of  $f$  too, e.g. by keeping the inputs

$$|x\rangle|0\rangle \rightarrow |x\rangle|f(x)\rangle$$



# Linearity of Transformations

---

- NOT N maps

$$\begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix} \begin{pmatrix} 1 \\ 0 \end{pmatrix} = \begin{pmatrix} 0 \\ 1 \end{pmatrix} \quad \begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix} \begin{pmatrix} 0 \\ 1 \end{pmatrix} = \begin{pmatrix} 1 \\ 0 \end{pmatrix}$$
$$\mathbf{N} |0\rangle = |1\rangle \quad \mathbf{N} |1\rangle = |0\rangle$$

$$\begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix} \begin{pmatrix} a \\ b \end{pmatrix} = \begin{pmatrix} b \\ a \end{pmatrix}$$

$$\mathbf{N} (a|0\rangle + b|1\rangle) = a\mathbf{N}|0\rangle + b\mathbf{N}|1\rangle = a|1\rangle + b|0\rangle$$



# Registers and Unitary Transformations

---

- So far we have worked on a single qubit
  - Multiple qubit registers are used for serious computations
  - An n-bit register can hold  $2^n$  states in superposition
  - Unitary transformations can be applied to all superposition states in one go.

$$U \left( \frac{1}{\sqrt{2^n}} \sum_{x=0}^{2^n-1} x \right) = \frac{1}{\sqrt{2^n}} \sum_{x=0}^{2^n-1} Ux$$





# Feature

---

**Qubits can get themselves into such a tangle.**

**You say tomato, I say tomato.**



# Entanglement

---

- Now consider the following superposition

$$|\Psi\rangle = \frac{1}{\sqrt{2}} (|01\rangle + |10\rangle)$$

- What qubit product would give rise to this?

$$|\Psi\rangle = \frac{1}{\sqrt{2}} (|01\rangle + |10\rangle) = (a|0\rangle + b|1\rangle) \otimes (c|0\rangle + d|1\rangle)?$$



# Entanglement

---

- There isn't one! And this has consequences!
- Suppose we now choose to measure Qubit 1 and get a  $|0\rangle$  say (which we obtain with probability  $1/2$ ). As before the state space collapses

$$|\Psi\rangle = \frac{1}{\sqrt{2}} (|01\rangle + |10\rangle) \xrightarrow{\text{Observe } Q1=0} |01\rangle$$

- If we now measure Qubit 2 we see a  $|1\rangle$  with probability 1.
- Similarly, if we had observed a  $|1\rangle$  for Qubit 1 we would now be certain to see a  $|0\rangle$  for Qubit 2.

$$|\Psi\rangle = \frac{1}{\sqrt{2}} (|01\rangle + |10\rangle) \xrightarrow{\text{Observe } Q1=1} |10\rangle$$



# Entanglement

---

- So the observational results on Qubit 1 effect the observational results on Qubit 2.
- Question....
  - What if Qubit 1 were on earth and Qubit 2 were on Pluto, or worse, in London?
  - Odd huh?
- We say that the qubits are **entangled**
- Possibly the strangest phenomenon in physics.
- We cannot explain the overall system state in terms of the two individual systems states.



Feature

---

**Qubits cannot be  
cloned.**

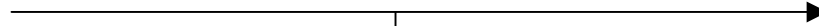
**When Alice met Bob.....**

# When Alice met Bob

- Communicants will (following tradition) be Alice and Bob, trying to communicate their love...



Alice



Eve



Bob

- Eve isn't happy about this. She wants to listen in and interfere

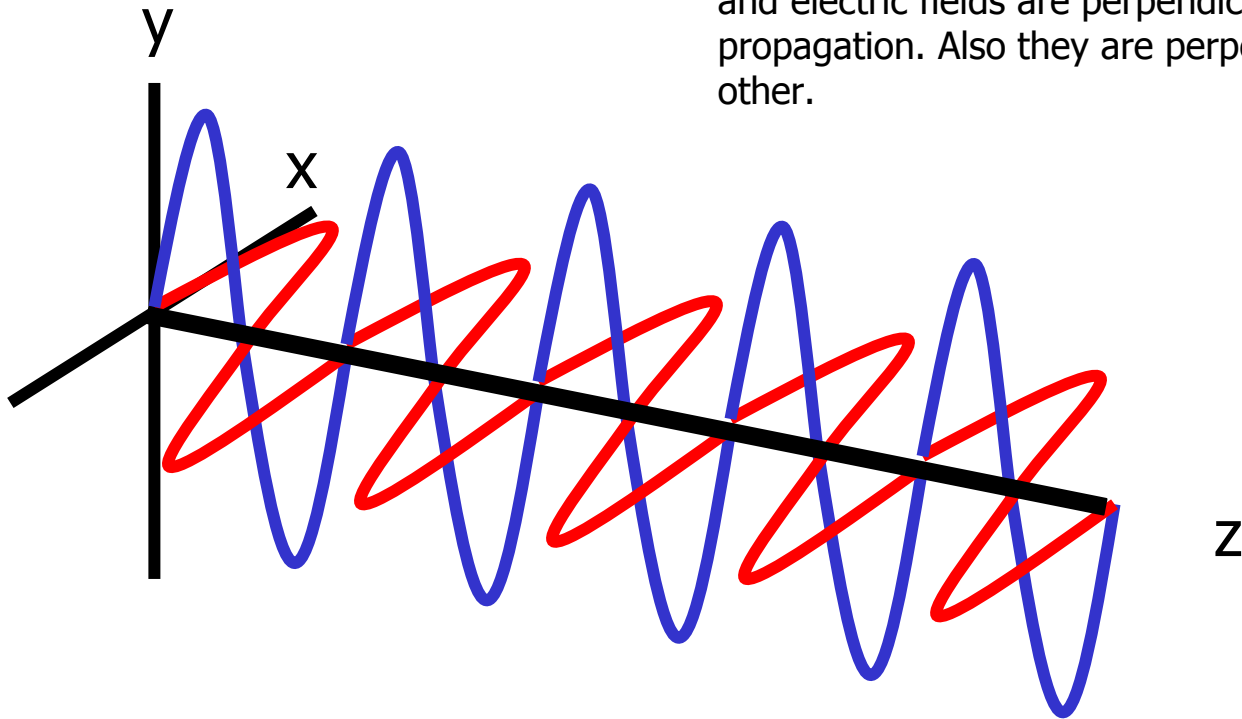


# Basic Scheme

---

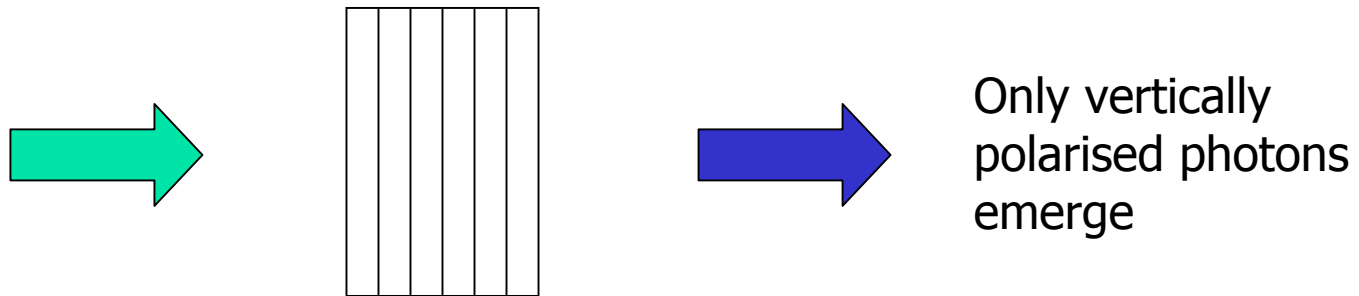
- Basic scheme based on polarisation of photons

Photons are transverse magnetic waves – magnetic and electric fields are perpendicular to the direction of propagation. Also they are perpendicular to each other.



# Photons

- We will assume that we are dealing with linearly polarised light but other schemes are possible.
- We need to create photons that with an electric field oscillating in the desired magnetic plane.
- One way to do this is by passing light through an appropriate polariser

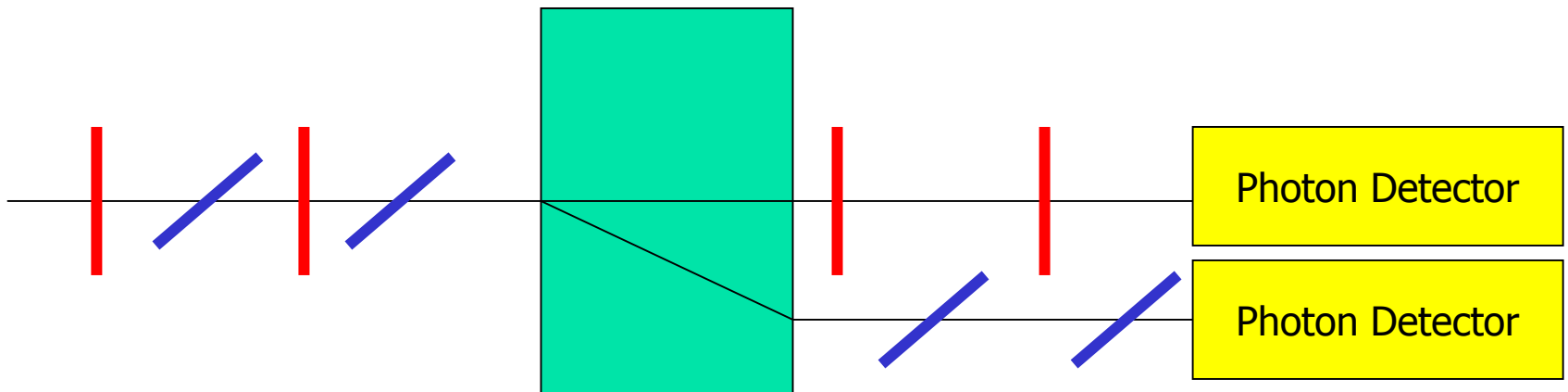


- More sophisticated way is to use a Pockels Cell.



# Detecting Photons

- Possible to detect absorption by using a Calcite crystal

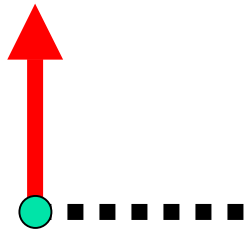




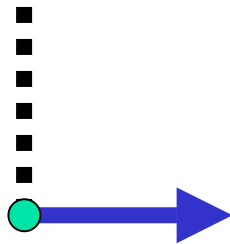
# Basic Scheme

---

- Basic scheme assumes that the polarisation of photons can be arranged. For example



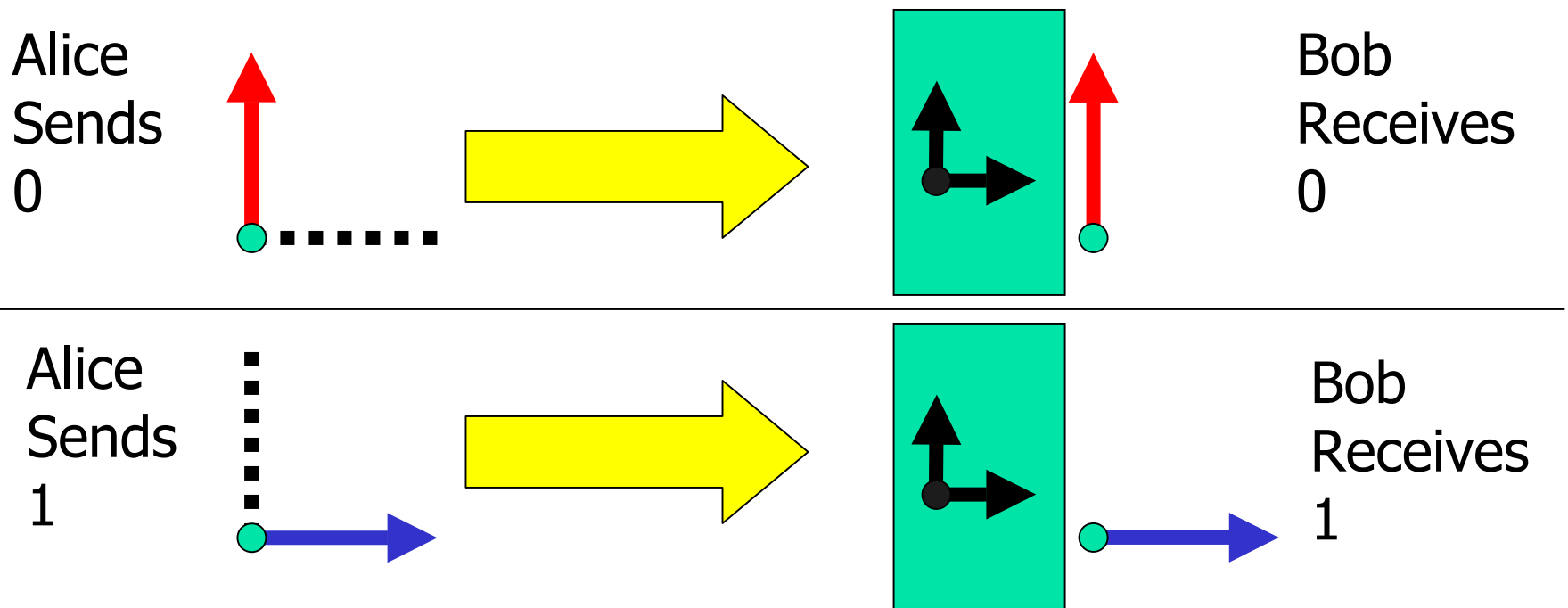
Vertical Polarisation  
denotes 0



Horizontal Polarisation  
denotes 1

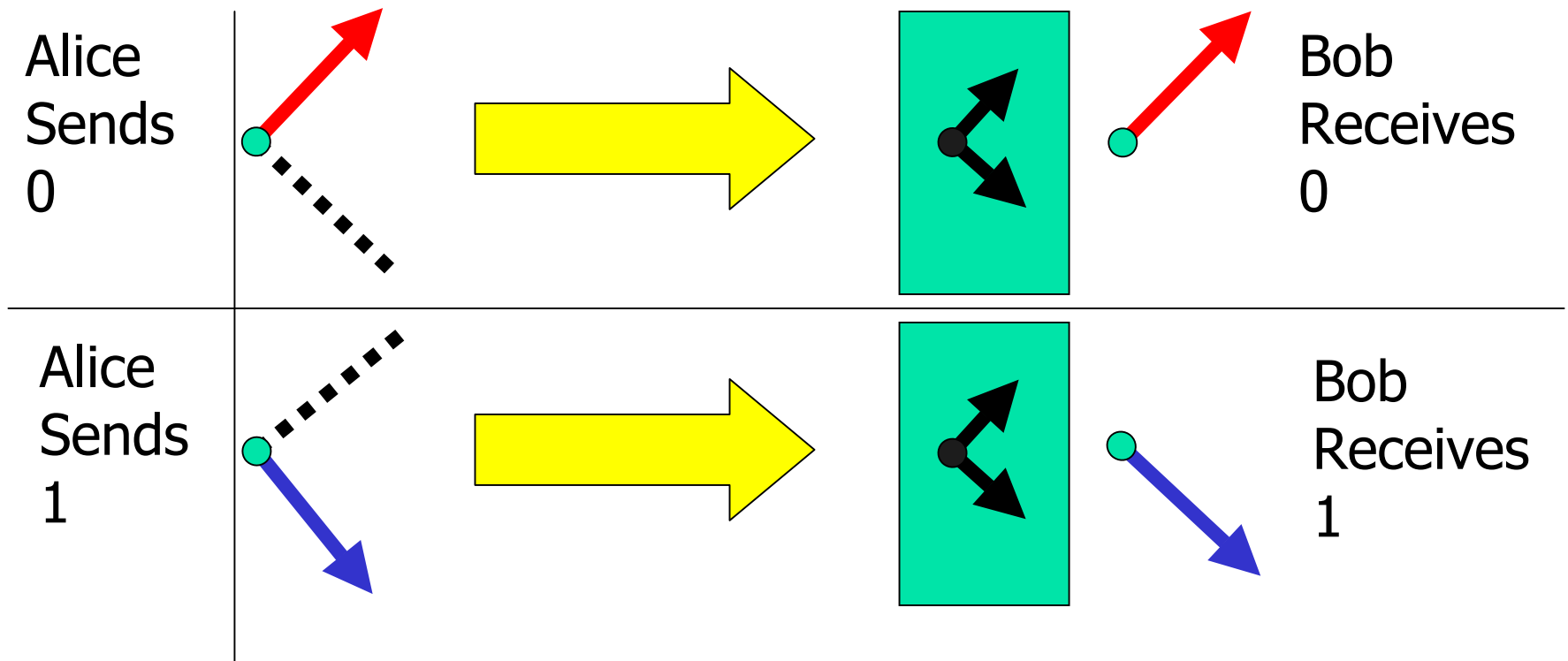
# Rectilinear Basis

- Suppose now that Alice sends a 0 in this scheme and that Bob uses a photon detector with the same basis.



# Diagonal Basis

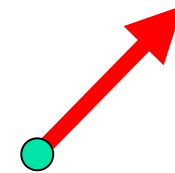
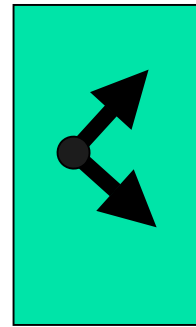
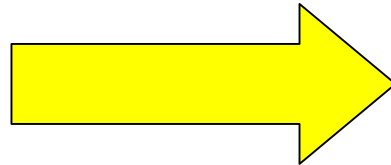
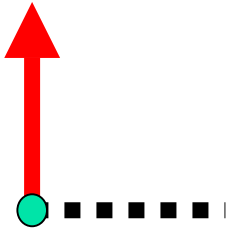
- Can also arrange this with a diagonal basis



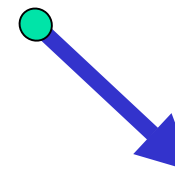
# Basis Mismatch

- What if Alice and Bob choose different bases?

Alice Sends  
0



Bob  
Receives  
0



Bob  
Receives  
1

Each result with probability  $1/2$



# Use of Basis Summary

---

- A sender can encode a 0 or a 1 by choosing the polarisation of the photon with respect to a basis
  - Vertical  $\Rightarrow$  0 Horizontal  $\Rightarrow$  1; or
  - 45 degrees  $\Rightarrow$  0, 135°  $\Rightarrow$  1
- The receiver Bob can observe (measure) the polarisation with respect to either basis.
  - If same basis then bits are correctly received
  - If different basis then only 50% of bits are correctly received.
- This notion underpins one of the basic quantum cryptography key distribution schemes.



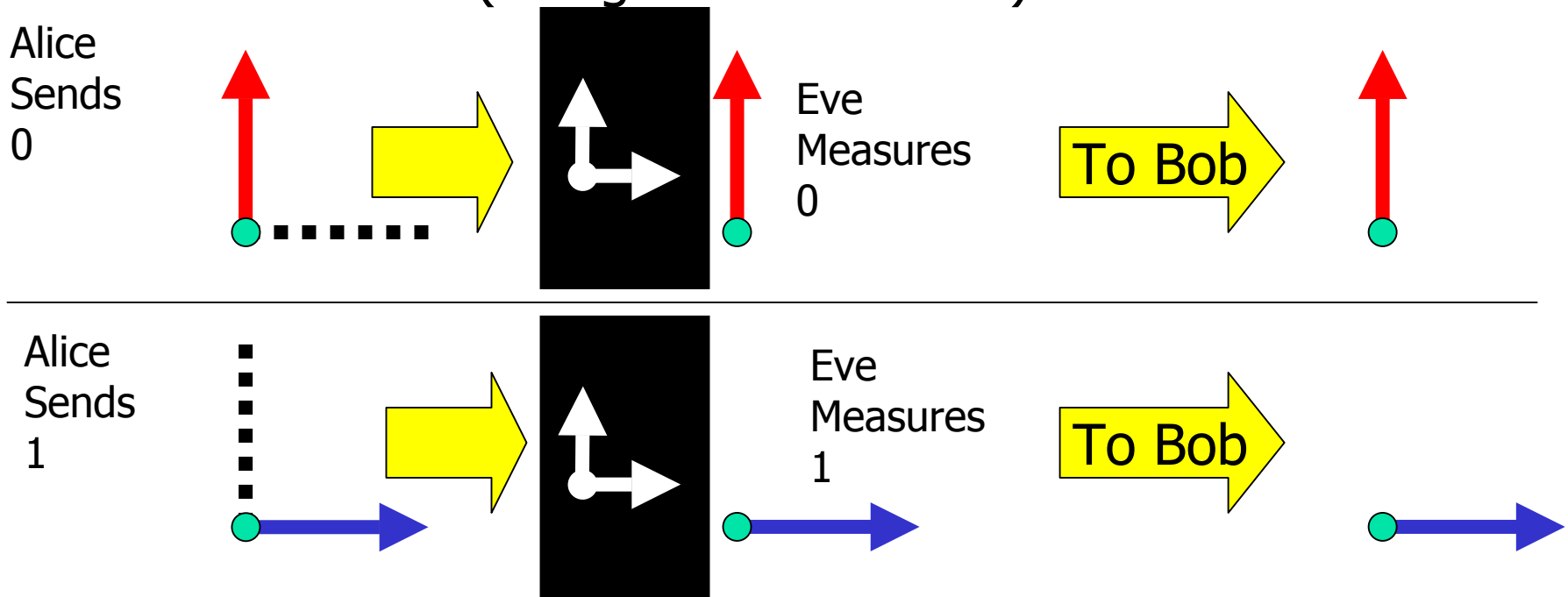
# What's Eve up To?

---

- Now Eve gets in on the act and chooses to measure the photon against some basis and then retransmit to Bob.

# Eve's Dropping In

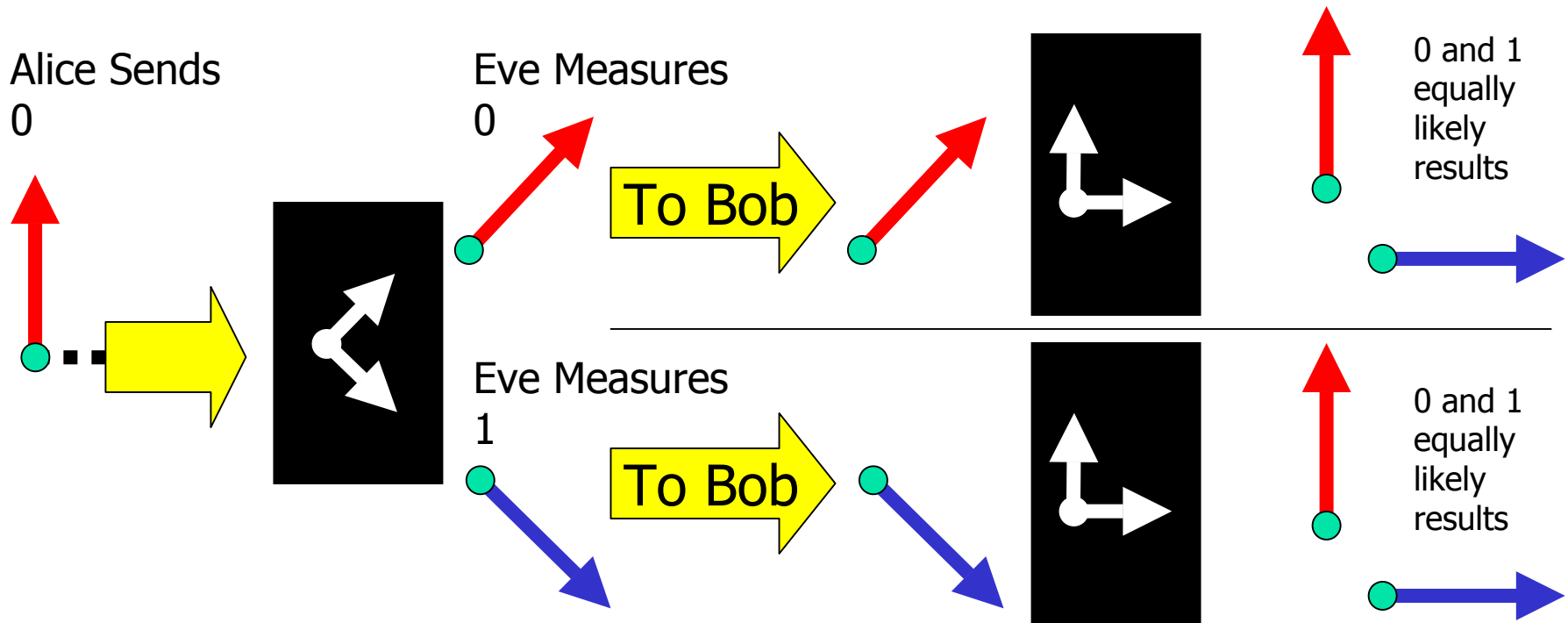
- Suppose Eve listens in using the same basis as Alice, measures the photon and retransmits a photon as measured (she goes undetected)





# Eve's Dropping In

- Suppose Eve listens in using a different basis to Alice



- Similarly if Alice sends a 1 (or if Alice uses diagonal basis and Eve uses rectilinear one)



# Summary of Eve's Droppings

---

- If Eve gets the basis wrong, then even if Bob gets the same basis as Alice his measurements will only be 50 percent correct.
- If Alice and Bob become aware of such a mismatch they will deduce that Eve is at work.
- A scheme can be created to exploit this.



# Deutsch's Algorithm

---





# Deutsch's Algorithm


---


- The first real quantum algorithm that showed that things can be done more efficiently on a Quantum Computer than on a classical one.

You have a function  $f: \{0,1\} \rightarrow \{0,1\}$  and you want to know whether it is balanced or not (it is balanced if  $f(0) \neq f(1)$ )

$f_1 : f(0) = f(1) = 0$        **Not Balanced**

$f_2 : f(0) = f(1) = 1$       

$f_3 : f(0) = 0, f(1) = 1$        **Balanced**

$f_4 : f(0) = 1, f(1) = 0$       

How many function evaluations do this require?



# Deutsch's Algorithm

---

- Start with two qubit register in the state  $|01\rangle$  and apply the Walsh Hadamard Transformation to each qubit

$$H^{(2)}|01\rangle = \frac{1}{\sqrt{2}}(|0\rangle + |1\rangle) \otimes \frac{1}{\sqrt{2}}(|0\rangle - |1\rangle)$$

$$H^{(2)}|01\rangle = \frac{1}{2}(|00\rangle + |10\rangle - |01\rangle - |11\rangle)$$

- Now apply the unitary (reversible) transformation defined by

$$U|i, j\rangle = |i, j \oplus f(i)\rangle$$

$$U|00\rangle = |0, 0 \oplus f(0)\rangle$$

$$U|01\rangle = |0, 1 \oplus f(0)\rangle$$

$$U|10\rangle = |1, 0 \oplus f(1)\rangle$$

$$U|11\rangle = |1, 1 \oplus f(1)\rangle$$



# Deutsch's Algorithm

---

- Applying the transformation to the superposition

$$\begin{aligned} U\left(\frac{1}{2}(|00\rangle + |10\rangle - |01\rangle - |11\rangle)\right) &= \frac{1}{2}(U|00\rangle + U|10\rangle - U|01\rangle - U|11\rangle) \\ &= \frac{1}{2}(|0,0 \oplus f(0)\rangle + |1,0 \oplus f(1)\rangle - |0,1 \oplus f(0)\rangle - |1,1 \oplus f(1)\rangle) \end{aligned}$$

- Depending on which particular  $f$  we have this gives

$$\text{For } f_1: \quad \frac{1}{2}(|0,0\rangle + |1,0\rangle - |0,1\rangle - |1,1\rangle)$$

$$\text{For } f_2: \quad \frac{1}{2}(|0,1\rangle + |1,1\rangle - |0,0\rangle - |1,0\rangle)$$

$$\text{For } f_3: \quad \frac{1}{2}(|0,0\rangle + |1,1\rangle - |0,1\rangle - |1,0\rangle)$$

$$\text{For } f_4: \quad \frac{1}{2}(|0,1\rangle + |1,0\rangle - |0,0\rangle - |1,1\rangle)$$

# Deutsch's Algorithm

- But if we now apply the Walsh Hadamard Transformation to both qubits we get (depending on which particular  $f$  we have)

$$\text{For } f_1: \quad W\left(\frac{1}{2}(|0,0\rangle + |1,0\rangle - |0,1\rangle - |1,1\rangle)\right) = |0,1\rangle$$

$$\text{For } f_2: \quad W\left(\frac{1}{2}(|0,1\rangle + |1,1\rangle - |0,0\rangle - |1,0\rangle)\right) = -|0,1\rangle$$

$$\text{For } f_3: \quad W\left(\frac{1}{2}(|0,0\rangle + |1,1\rangle - |0,1\rangle - |1,0\rangle)\right) = |1,1\rangle$$

$$\text{For } f_4: \quad W\left(\frac{1}{2}(|0,1\rangle + |1,0\rangle - |0,0\rangle - |1,1\rangle)\right) = -|1,1\rangle$$

Not Balanced

Balanced

- But we can now simply measure the first qubit and we are guaranteed to see a 0 if the function  $f$  is balanced and a 1 if it isn't.
- Note we have learned a **global** property about the system: we don't actually know the value of any of  $f(0)$  or  $f(1)$ ; just that they are (or are not) the same.



# Another View

---

- The following is a perfectly well defined unitary transformation

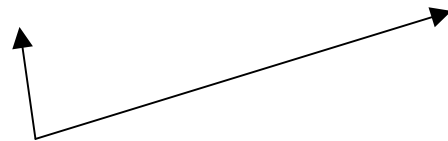
$$|x\rangle \otimes \frac{1}{\sqrt{2}} (|0\rangle - |1\rangle) \rightarrow |x\rangle \otimes (-1)^{f(x)} \frac{1}{\sqrt{2}} (|0\rangle - |1\rangle)$$

$$|0\rangle \otimes \frac{1}{\sqrt{2}} (|0\rangle - |1\rangle) \rightarrow |0\rangle \otimes (-1)^{f(0)} \frac{1}{\sqrt{2}} (|0\rangle - |1\rangle)$$

$$|1\rangle \otimes \frac{1}{\sqrt{2}} (|0\rangle - |1\rangle) \rightarrow |1\rangle \otimes (-1)^{f(1)} \frac{1}{\sqrt{2}} (|0\rangle - |1\rangle)$$

**Superposition gives (followed by WH)**

$$\begin{aligned} \frac{1}{\sqrt{2}} (|0\rangle + |1\rangle) \otimes \frac{1}{\sqrt{2}} (|0\rangle - |1\rangle) &\rightarrow \frac{1}{\sqrt{2}} ((-1)^{f(0)}|0\rangle + (-1)^{f(1)}|1\rangle) \otimes \frac{1}{\sqrt{2}} (|0\rangle - |1\rangle) \\ &\rightarrow \frac{1}{\sqrt{2}} [((-1)^{f(0)} + (-1)^{f(1)})|0\rangle + ((-1)^{f(0)} - (-1)^{f(1)})|1\rangle] \otimes \frac{1}{\sqrt{2}} (|0\rangle - |1\rangle) \end{aligned}$$



**Constructive or destructive interference to give result**





# Grover's Algorithm

---



# Grover's Algorithm

---

- Grover's algorithm is probably the most important general search algorithm to date.
- It searches a database of  $2^N$  values of  $x$  to find the element  $v$  satisfying a particular predicate, represented below by  $C(x)$

$$x : [0, 2^N - 1]$$

$$(x = v) \Rightarrow C(v) = 1$$

$$(x \neq v) \Rightarrow C(v) = 0$$

- A classical search would require on average  $2^{(N-1)}$  tests of values of  $x$ .



# Grover's Algorithm

---

- Start with the register of  $N$  qubits as all zeroes and place that register into a superposition of all possible states using the Hadamard transformation on the register

$$H^{(N)}|0\rangle = \frac{1}{\sqrt{2^N}} \sum_x |x\rangle$$

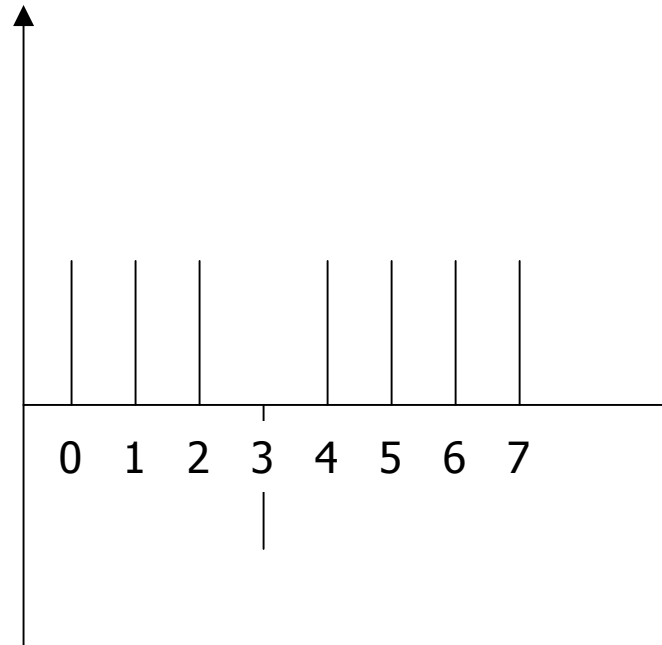
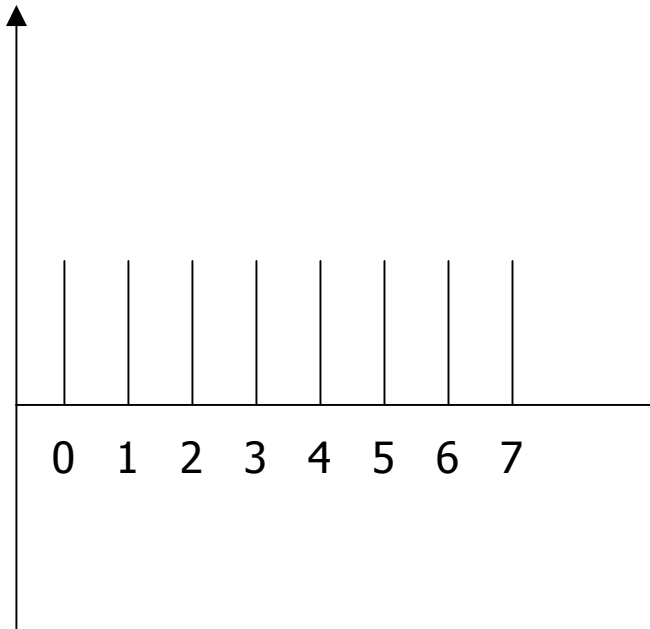
- Apply the following loop  $O(\sqrt{N})$  times
  - Negate the phase of the state component of  $v$  (leaving everything else the same)
  - Invert about the average
- Measure register. There is a 50% chance of obtaining a result  $z = v$ .

In practice a bit more complex to form the amplification step



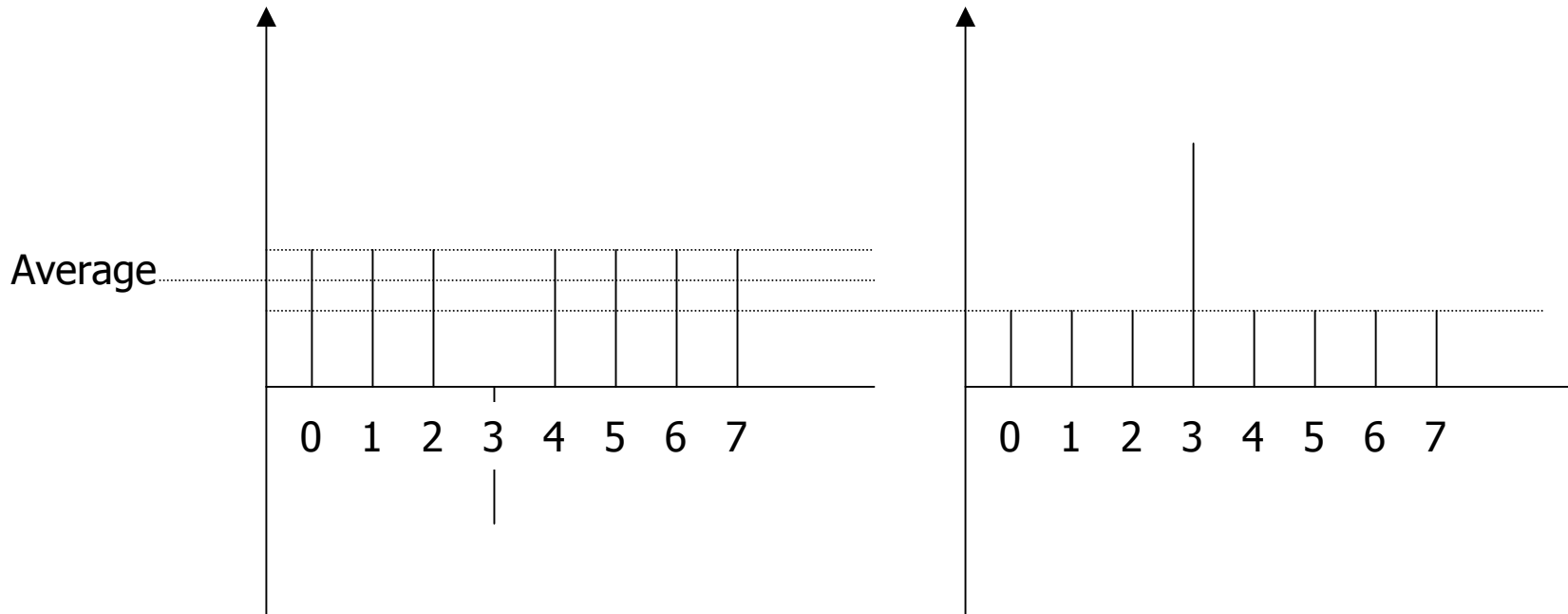
# Amplitude Negation

- Negation of the amplitude of  $v$ . Suppose we have 8 values of  $x$  and  $C(3)=1$



# Inversion About Average

- Invert about the new average amplitude



- We can see that the magnitude of the amplitude for 3 is getting bigger (more likely to be observed)



# Inversion About Average

- The inversion operator is given formally by (with  $E$  the average of the  $a_i$ )

$$D_N : \sum_{i=0}^{2^N-1} a_i |i\rangle \rightarrow \sum_{i=0}^{2^N-1} (2E - a_i) |i\rangle$$

- This has matrix

$$\begin{pmatrix} -1 + \frac{2}{2^N} & \frac{2}{2^N} & \cdots & \frac{2}{2^N} \\ \frac{2}{2^N} & -1 + \frac{2}{2^N} & \cdots & \frac{2}{2^N} \\ \vdots & \vdots & \ddots & \vdots \\ \frac{2}{2^N} & \frac{2}{2^N} & \cdots & -1 + \frac{2}{2^N} \end{pmatrix}$$



# Going Too Far

---

- After some point applying another loop body iteration actually lowers the amplitude of the desired state to be measured.
- It is possible to 'overcook' it.



# Generalising

---

- Grover's search is very important. The original result has been generalised to the case where there are  $R$  marked states (i.e. states satisfying the search predicate).
- Not surprisingly, if there are more possible states to find the algorithm one of them can be found quicker. Order of search is now

$$O\left(\sqrt{\frac{N}{R}}\right)$$

- Also similar results concerning non-uniform starting states.
- But what if you do not know how many states satisfy the predicate?





# Question

---

- What meaningful problems can be addressed using this technique?



# Shor's Algorithm

---



# Shor's Algorithm

---

- Probably the most high profile of all quantum algorithms.
- Shor made news all over the world when he announced an algorithm that can factor effectively products into primes.

$$n = p \times q$$

- **Problem: given n find p and q**
- Basis of a great deal of cryptographic security, e.g. RSA



# Preliminaries

---

- Shor's factoring algorithm based on finding periodicity of a function  $f$ .
- Suppose we want to factor 15. We pick a value  $a$  relatively prime to 15, e.g. 7 and look at values of

$$7^x \bmod 15$$



# Preliminaries

---

- These are given by

$$\begin{array}{ll} 7^0 \bmod 15 = 1 & 7^4 \bmod 15 = 1 \\ 7^1 \bmod 15 = 7 & 7^5 \bmod 15 = 7 \quad \bullet \bullet \bullet \\ 7^2 \bmod 15 = 4 & 7^6 \bmod 15 = 4 \\ 7^3 \bmod 15 = 13 & 7^7 \bmod 15 = 13 \end{array}$$

- The period  $R=4$  here.
- But we can use this to factor 15

$$7^{\frac{4}{2}} = 49 \quad \gcd(7^{\frac{4}{2}} + 1, 15) = 5 \quad \gcd(7^{\frac{4}{2}} - 1, 15) = 3$$

- More generally

$$\gcd(a^{\frac{R}{2}} + 1, N) \quad \gcd(a^{\frac{R}{2}} - 1, N)$$



# Shor's Algorithm

---

- Using the usual superposition and quantum computation we can calculate all values of  $f(x)$  in parallel.

$$\frac{1}{\sqrt{2^n}} \sum_{x=0}^{2^n-1} |x\rangle |a^x \bmod N\rangle$$

- Now we can observe the second register and then the first to obtain particular values of  $(x, a^x \bmod N)$



# Shor's Algorithm

---

- If we observe the second register then the state collapses to give a superposition in the first register of those values of  $x$  consistent with the result obtained.
- Thus if we observed a 4 then the first register is now in a superposition of 3, 7, 11,...
- If we could reliably observe a result of 4 then simply sampling the first register to obtain a value (and repeating the process) would be enough to allow us to obtain the period.
  - E.g. 0,8,12 would allow us to deduce that  $R=4$
- But we cannot reliably observe the same value for the second register when we repeat.

$$(|0\rangle + |4\rangle + |8\rangle + \dots)|1\rangle$$

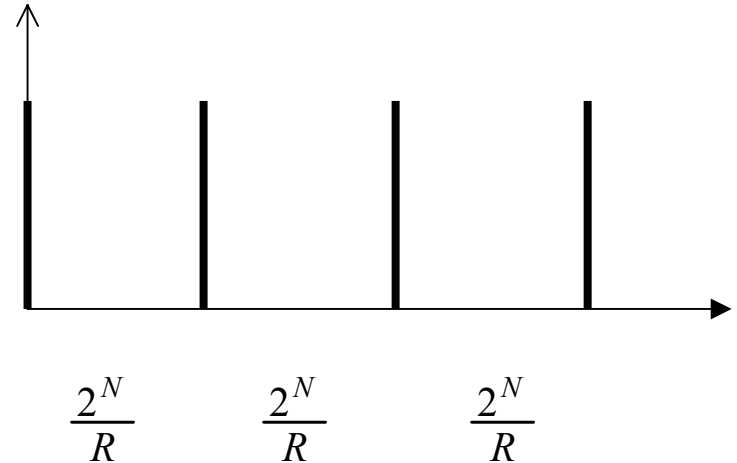
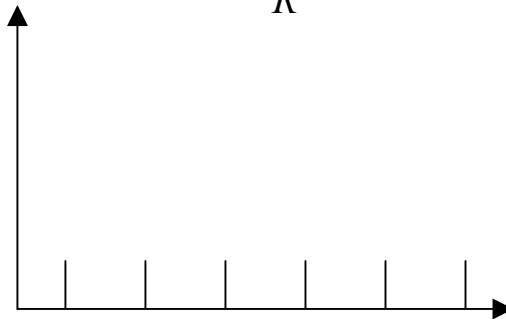
$$(|3\rangle + |7\rangle + |11\rangle + \dots)|4\rangle$$

$$(|1\rangle + |5\rangle + |9\rangle + \dots)|7\rangle$$

$$(|2\rangle + |6\rangle + |10\rangle + \dots)|13\rangle$$

# Shor's Algorithm

- Shor's algorithm gets round this problem by applying a Quantum Fourier Transform
- Essentially this encodes the offsets as a phase and you can derive a final state for the  $x$  where the  $x$  are in superposition but with very high amplitudes at periods of  $\frac{2^N}{R}$







# Phenomena Exploited

---

- Used superposition as usual but have severely exploited problem structure (periodicity) to break a hugely difficult problem.
- Interference via QDFT.
- And of course, entanglement for collapsing.



# Other Algorithms

---

- Minimum finding algorithm
- Maximum finding algorithm
- Quantum counting algorithm
- Collision detection
- SAT problems



# Summary

---

- Various algorithms have been found.
  - But they are not that great in number.
- Basic notion of finding appropriate transformations in order to increase the amplitudes of what we actually want to see.
- Deutch's promise algorithm showed the why we should care.
- Grover's and Shor's algorithms the most influential
  - Many new algorithms to be found?????



# Where Now?

---



# Where Now?

---

- Grover's search may give us square root speed in the state space but is still very limited (it is known to be optimal).
- But it is a search over an *unstructured* database
- So we really need to exploit ***problem structure*** effectively.
- Need to ask smarter questions.



# Pointcheval's Perceptron Schemes

- Interactive identification protocols based on NP-complete problem.
- **Perceptron Problem.**

**Given**

$$A_{m \times n}$$

$$\begin{pmatrix} a_{11} & a_{12} & \dots & \dots & a_{1n} \\ a_{21} & a_{22} & \dots & \dots & a_{2n} \\ \dots & \dots & \dots & \dots & \dots \\ a_{m1} & a_{m2} & \dots & \dots & a_{mn} \end{pmatrix}$$

$$a_{ij} = \pm 1$$

**Find**

$$S_{n \times 1}$$

$$\begin{pmatrix} s_1 \\ s_2 \\ \vdots \\ s_n \end{pmatrix}$$

$$s_j = \pm 1$$

**So That**

$$A_{m \times n} S_{n \times 1}$$

$$\begin{pmatrix} w_1 \\ w_2 \\ \vdots \\ w_m \end{pmatrix} \geq \begin{pmatrix} 0 \\ 0 \\ \vdots \\ 0 \end{pmatrix}$$

# Pointcheval's Perceptron Schemes

- Permuted Perceptron Problem (PPP). Make Problem harder by imposing extra constraint.

**Given**

$$A_{m \times n}$$

$$\begin{pmatrix} a_{11} & a_{12} & \dots & \dots & a_{1n} \\ a_{21} & a_{22} & \dots & \dots & a_{2n} \\ \dots & \dots & \dots & \dots & \dots \\ a_{m1} & a_{m2} & \dots & \dots & a_{mn} \end{pmatrix}$$

$$a_{ij} = \pm 1$$

**Find**

$$S_{n \times 1}$$

$$\begin{pmatrix} s_1 \\ s_2 \\ \vdots \\ s_n \end{pmatrix}$$

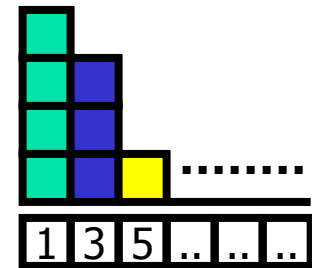
$$s_j = \pm 1$$

**So That**

$$A_{m \times n} S_{n \times 1}$$

$$\geq \begin{pmatrix} w_1 \\ w_2 \\ \vdots \\ w_m \end{pmatrix}$$

**Has particular histogram H of positive values**



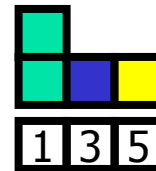
# Example: Pointcheval's Scheme

- PP and PPP-example
- Every PPP solution is a PP solution.

$$\begin{pmatrix} 1 & -1 & -1 & 1 & -1 \\ 1 & -1 & -1 & 1 & -1 \\ -1 & 1 & 1 & 1 & -1 \\ 1 & 1 & -1 & 1 & -1 \end{pmatrix} \begin{pmatrix} 1 \\ 1 \\ -1 \\ 1 \\ -1 \end{pmatrix} = \begin{pmatrix} 3 \\ 1 \\ 1 \\ 5 \end{pmatrix}$$

$$\begin{aligned} H &= (h(1), h(3), h(5)) \\ &= (2, 1, 1) \end{aligned}$$

**Has particular  
histogram H of  
positive values**







# Evolutionary Techniques

---

- You can throw your usual evolutionary techniques at this problem.
- In some cases you can get very good results:
  - E.g. for  $(101,117)$  matrices, simulated annealing attacks have so far produce instances with 108 bits correct.
  - In practice we wouldn't know which 9 bits were incorrect.

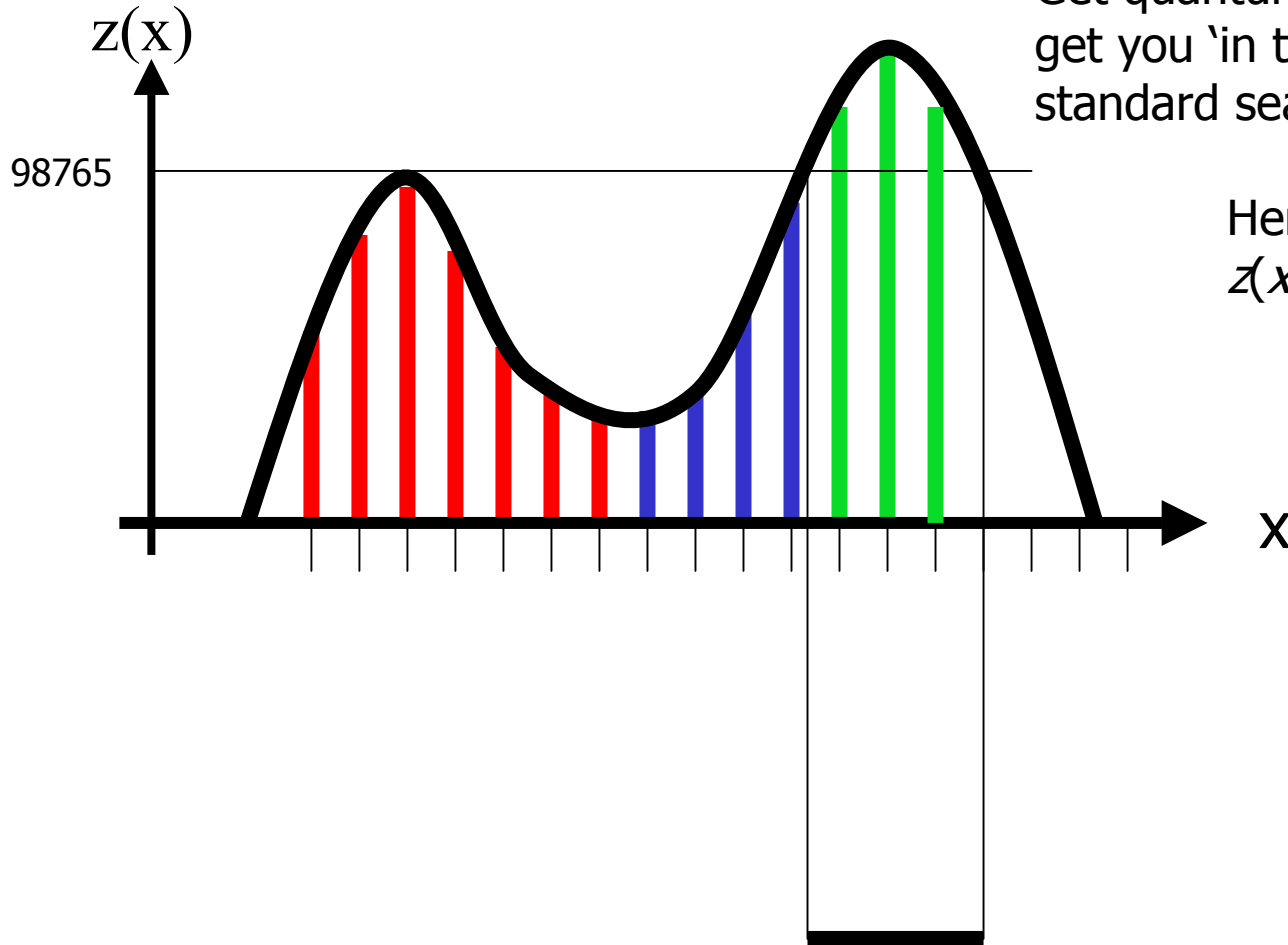


# Evolutionary Techniques

---

- However, what if we now ask the question:
  - “Which 9 indices have wrong values?”
- Can form a superposition of all possible wrong indices
  - $|\text{index1}, \text{index2}, \dots, \text{index8}, \text{index9}\rangle$
- Of the order  $7*9=63$  bits.
- And now use Grover-like search to find the correct one with order  $2^{32}$  iterations (will require a good number of scratch qubits).
- In general, use standard crunching techniques to get in the right area and use quantum to give the correcting delta.
  - Note: the real first stage problem is to obtain a quantum solvable problem.
  - Perhaps directing the initial search with this aim would be useful (i.e. quantum gets quality leftovers, not just leftovers).

# Seeding Standard Techniques



Get quantum (or other technique) to get you 'in the right area' for a more standard search.

Here find an  $x$  such that  $z(x) > 98765$



# Summary

---

- Features
- Quantum ideas:
  - superposition,
  - unitary transforms,
  - interference,
  - state collapse,
  - entanglement,
- Exploiting structure.
- What further algorithms are there and what are the smarter questions?