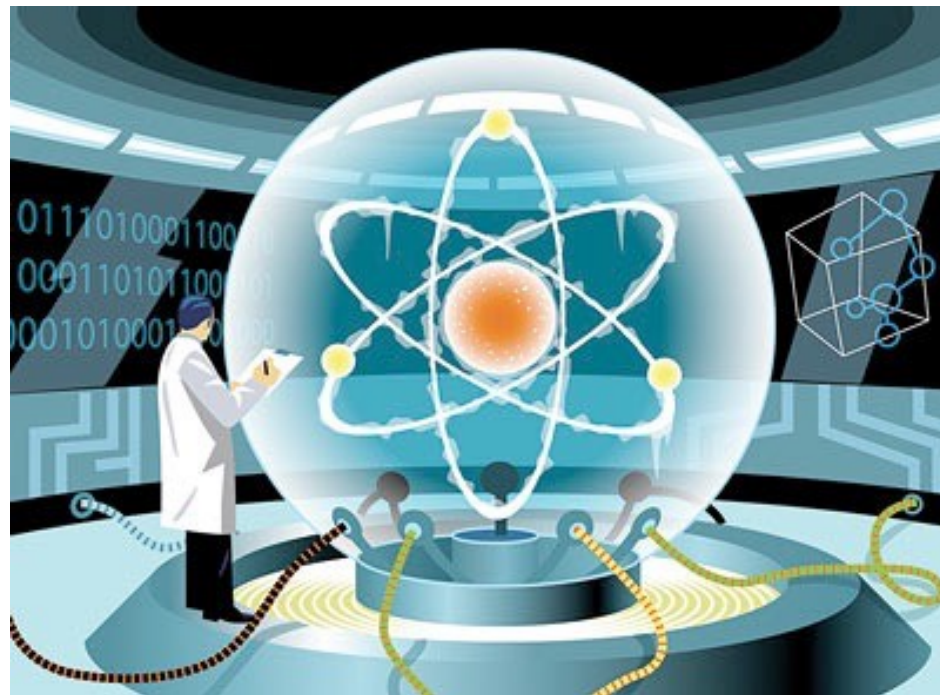


# 15-251

## Great Ideas in Theoretical Computer Science

Lecture 28:  
A Gentle Introduction to Quantum Computation



*May 1st, 2018*

# **Announcements**

Please fill out the Faculty Course Evaluations (FCEs).

<https://cmu.smartevals.com>

# Announcements

You can vote to eliminate 2 topics from the final exam:

Stable Matchings

Boolean Circuits

NP and Logic (Descriptive Complexity)

Transducers

Presburger Arithmetic

# Announcements

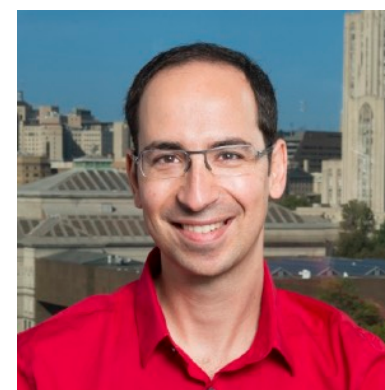
## The Last Lecture on Thursday



Daniel Sleator



Mor Harchol-Balter



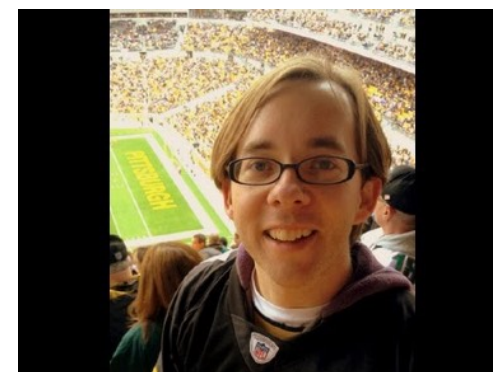
Ariel Procaccia



Rashmi Vinayak



Anupam Gupta



Ryan O'Donnell

# Announcements

## **The Last Lecture on Thursday**



# **Quantum Computation**

# The plan

Classical computers and classical theory of computation

Quantum physics (what the fuss is all about)

Quantum computation  
(practical, scientific, and philosophical perspectives)

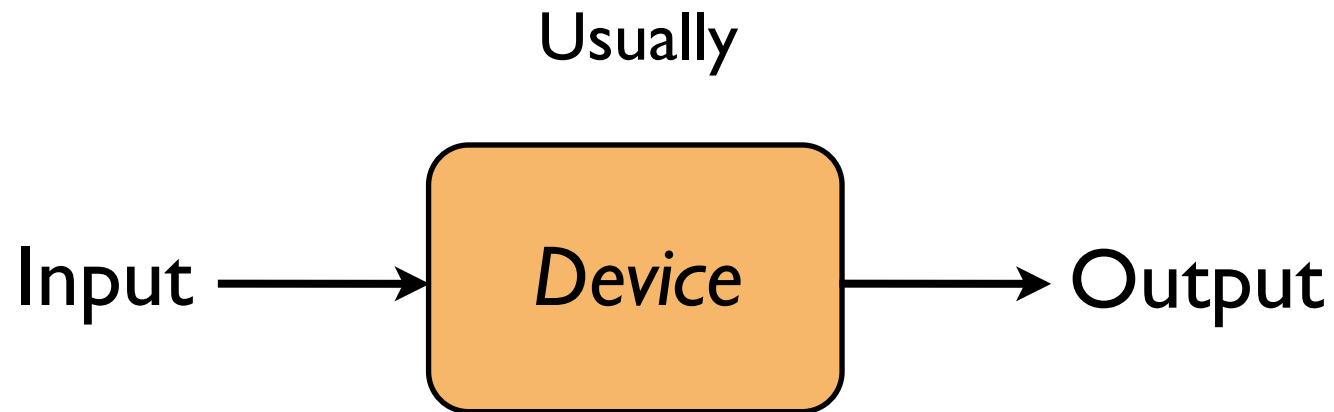
# The plan

Classical computers and classical theory of computation



# What is computer/computation?

A device that **manipulates data** (information)



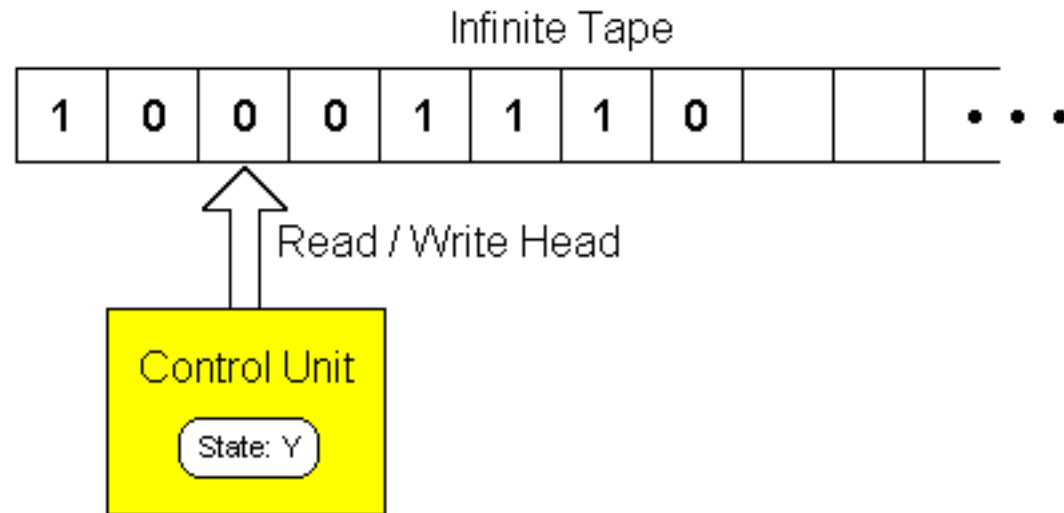
# Theory of computation

Mathematical model of a computer:

**Turing Machines**  $\sim$  <sup>(uniform)</sup> **Boolean Circuits**

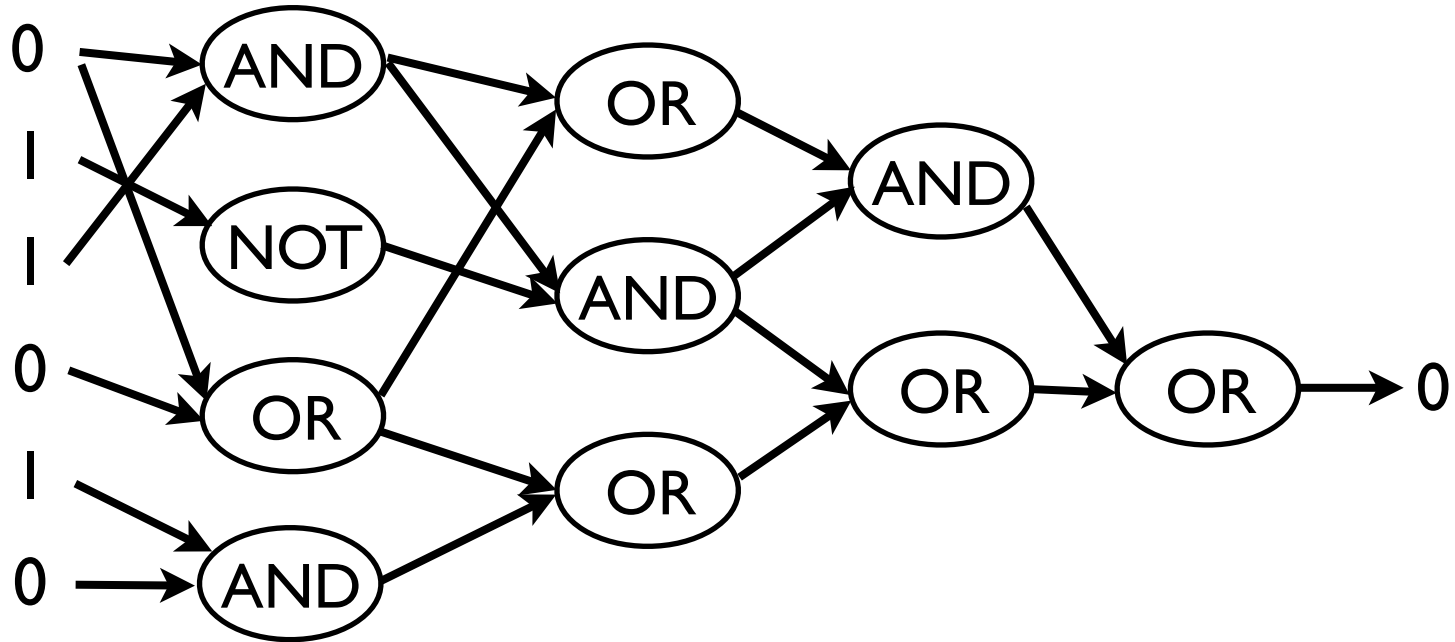
# Theory of computation

## Turing Machines



# Theory of computation

## Boolean Circuits



gates



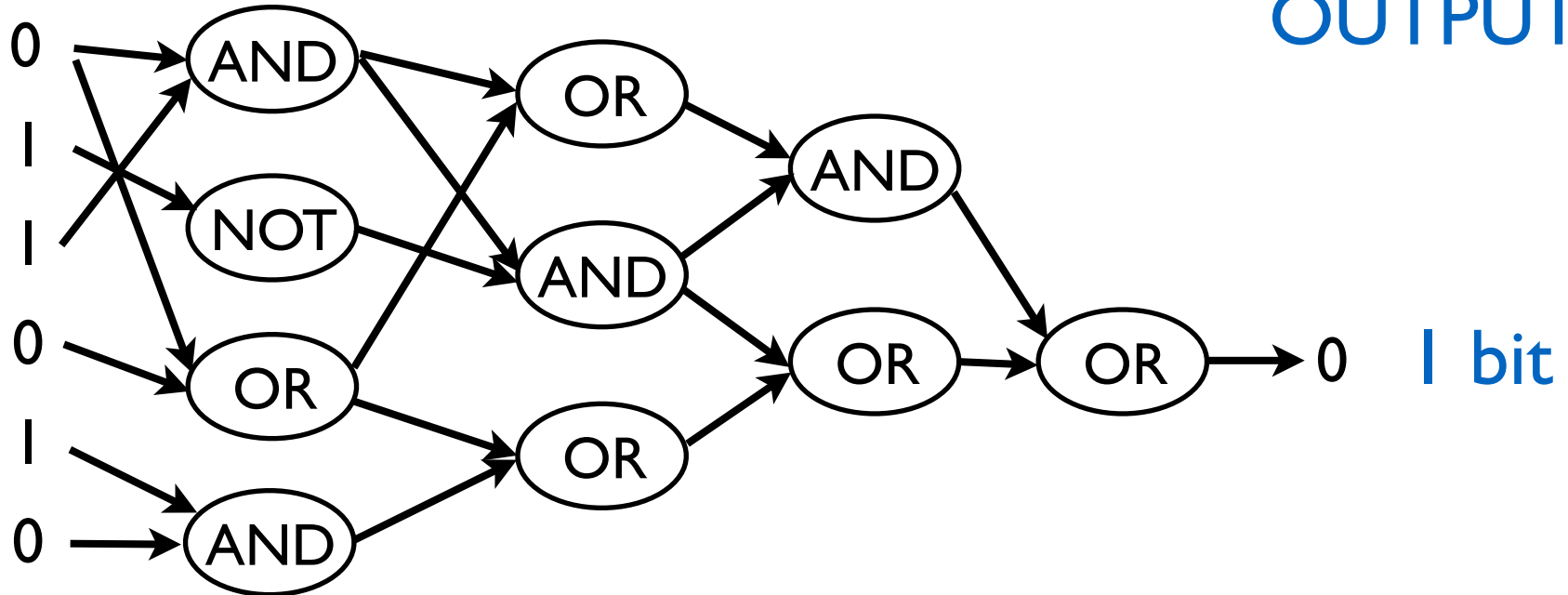
# Theory of computation

## Boolean Circuits

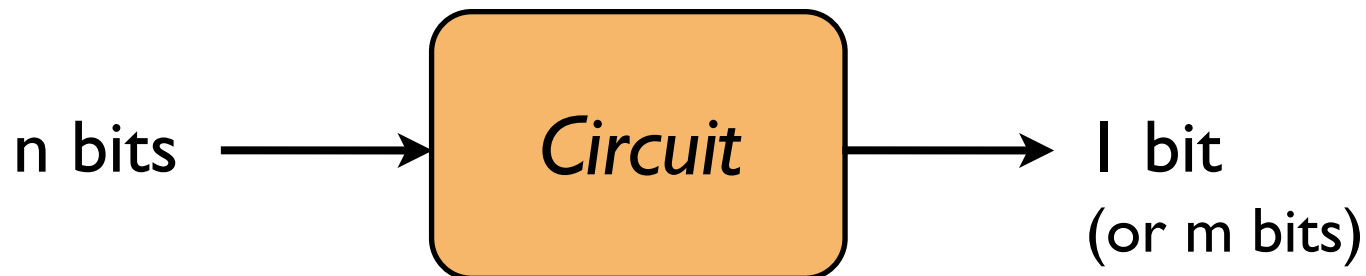
INPUT

OUTPUT

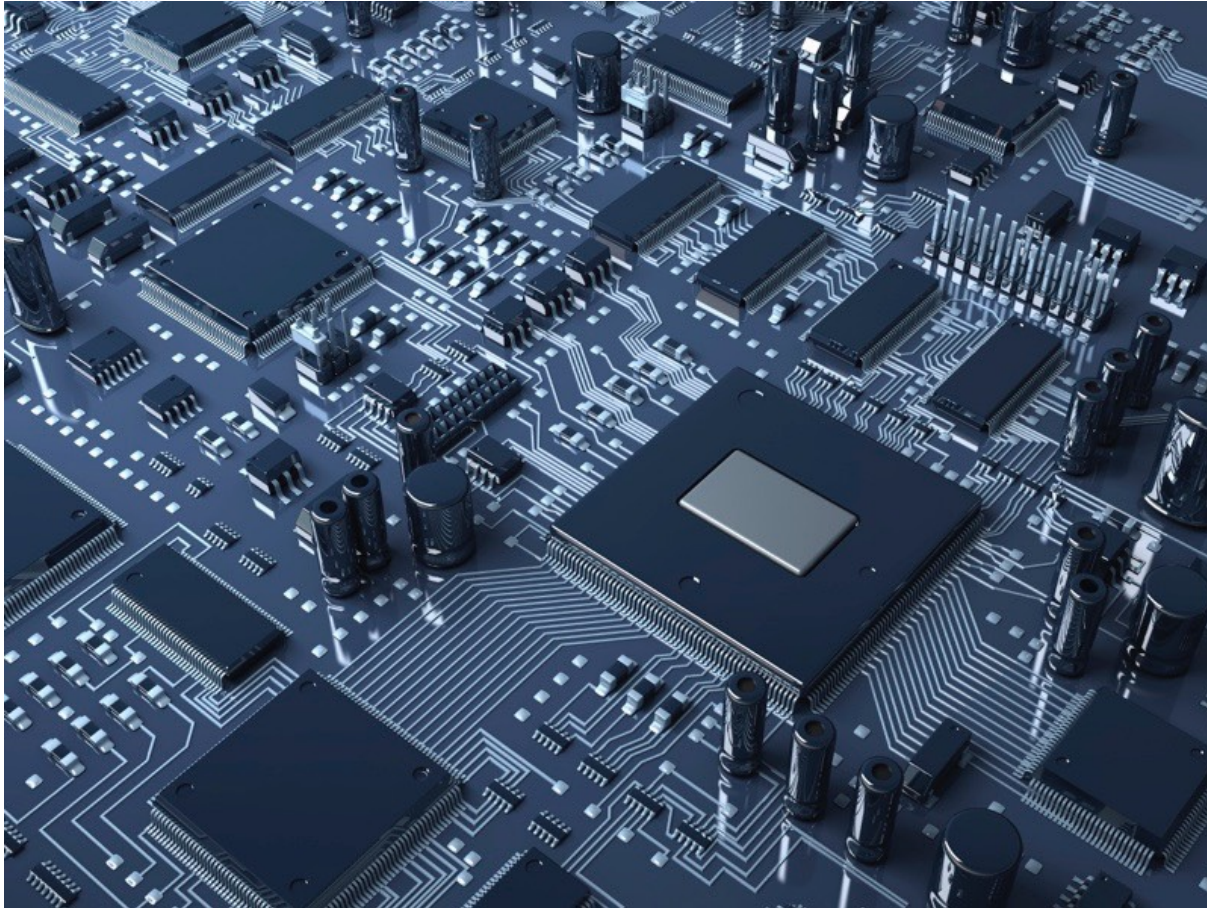
n bits



1 bit



# Physical Realization

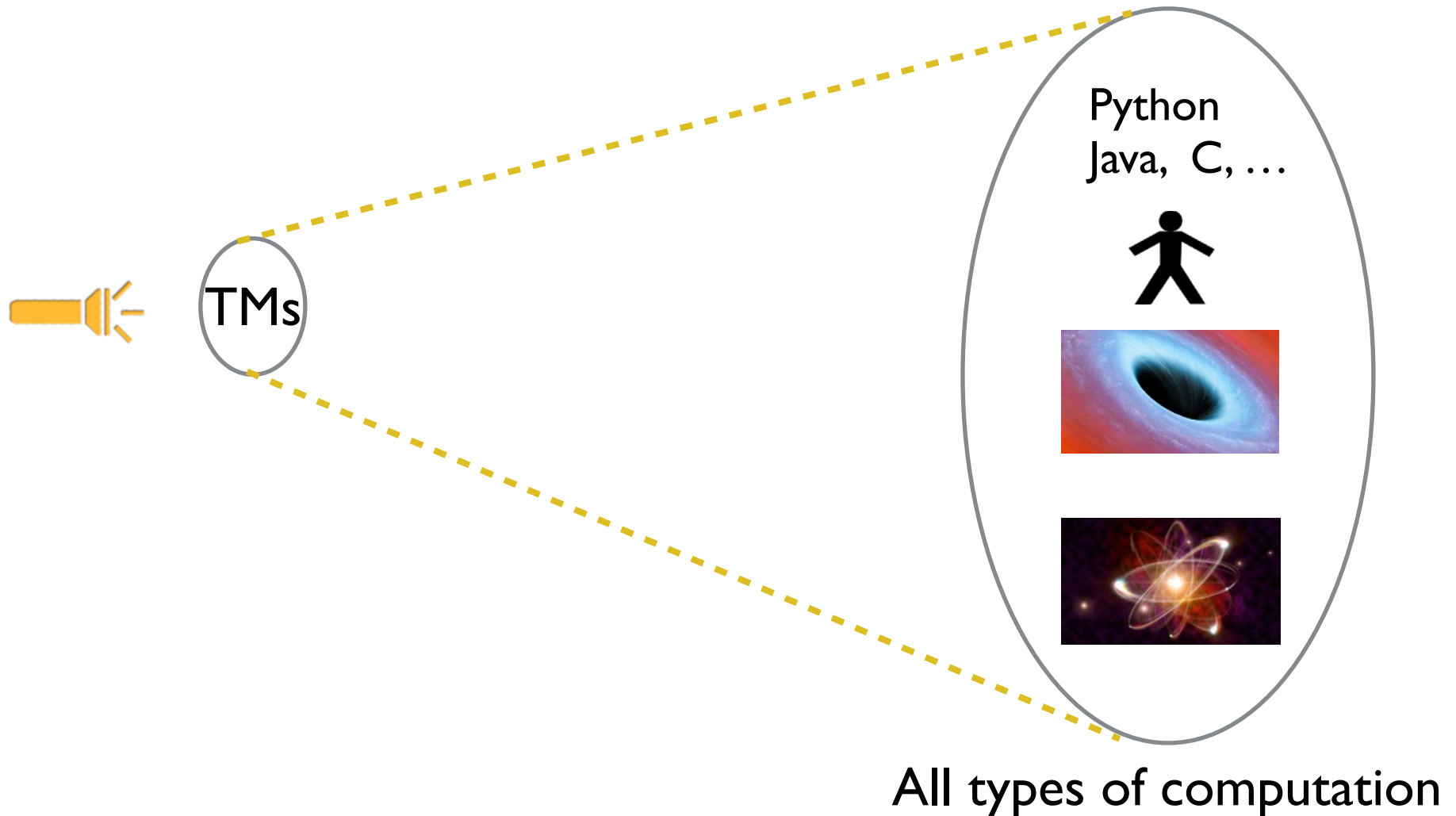


Circuits implement  
basic operations /  
instructions.

**Everything  
follows classical  
laws of physics!**

# (Physical) Church-Turing Thesis

**Turing Machines**  $\sim$  (uniform) **Boolean Circuits**  
universally capture all of computation.



# (Physical) Church-Turing Thesis

**Turing Machines**  $\sim$  (uniform) **Boolean Circuits**  
universally capture all of computation.

## (Physical) Church Turing Thesis

Any computational problem that can be solved by a physical device, can be solved by a Turing Machine.

### Strong version

Any computational problem that can be solved **efficiently** by a physical device, can be solved **efficiently** by a TM.



# The plan

Classical computers and classical theory of computation

Quantum physics (what the fuss is all about)

Quantum computation  
(practical, scientific, and philosophical perspectives)

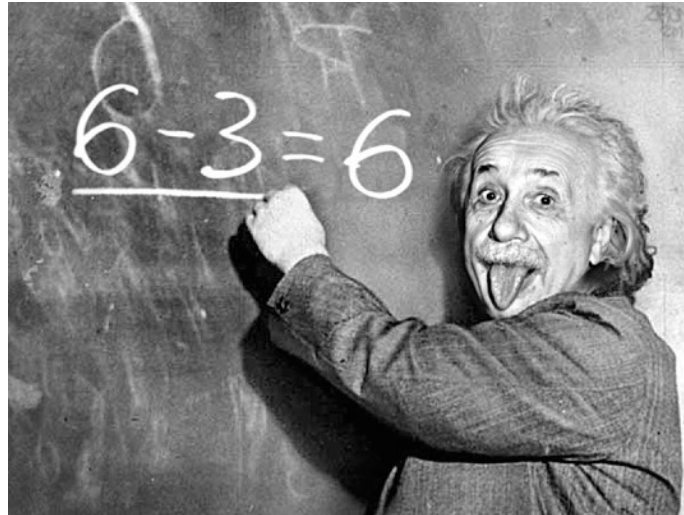
# The plan

Quantum physics (what the fuss is all about)

# One slide course on physics



Classical  
Physics



General Theory  
of Relativity

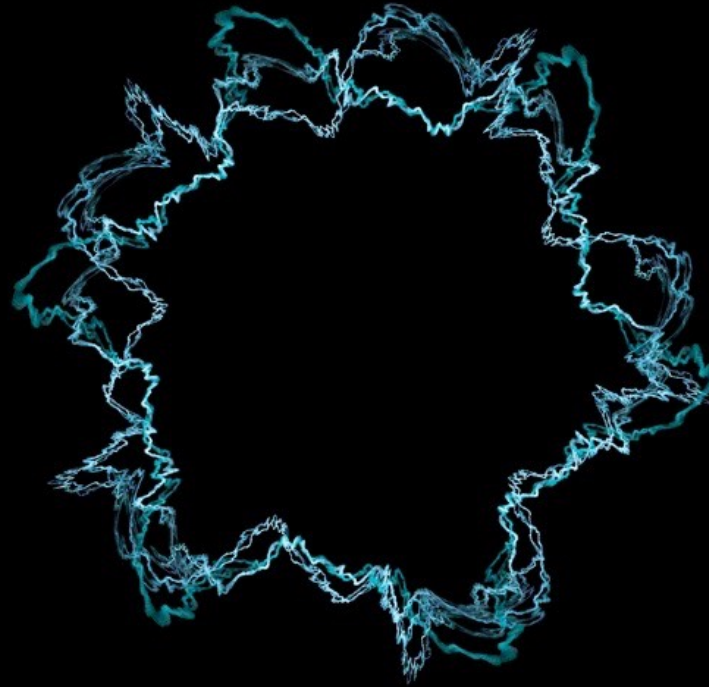


Quantum  
Physics

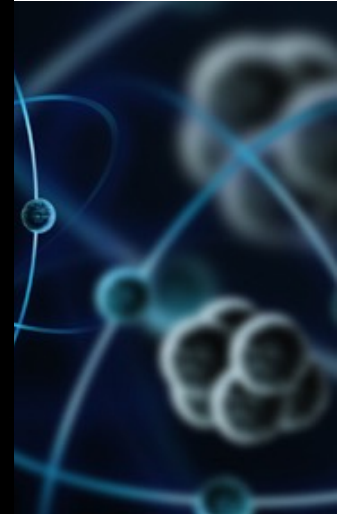
# One slide course on physics



Classical  
Physics



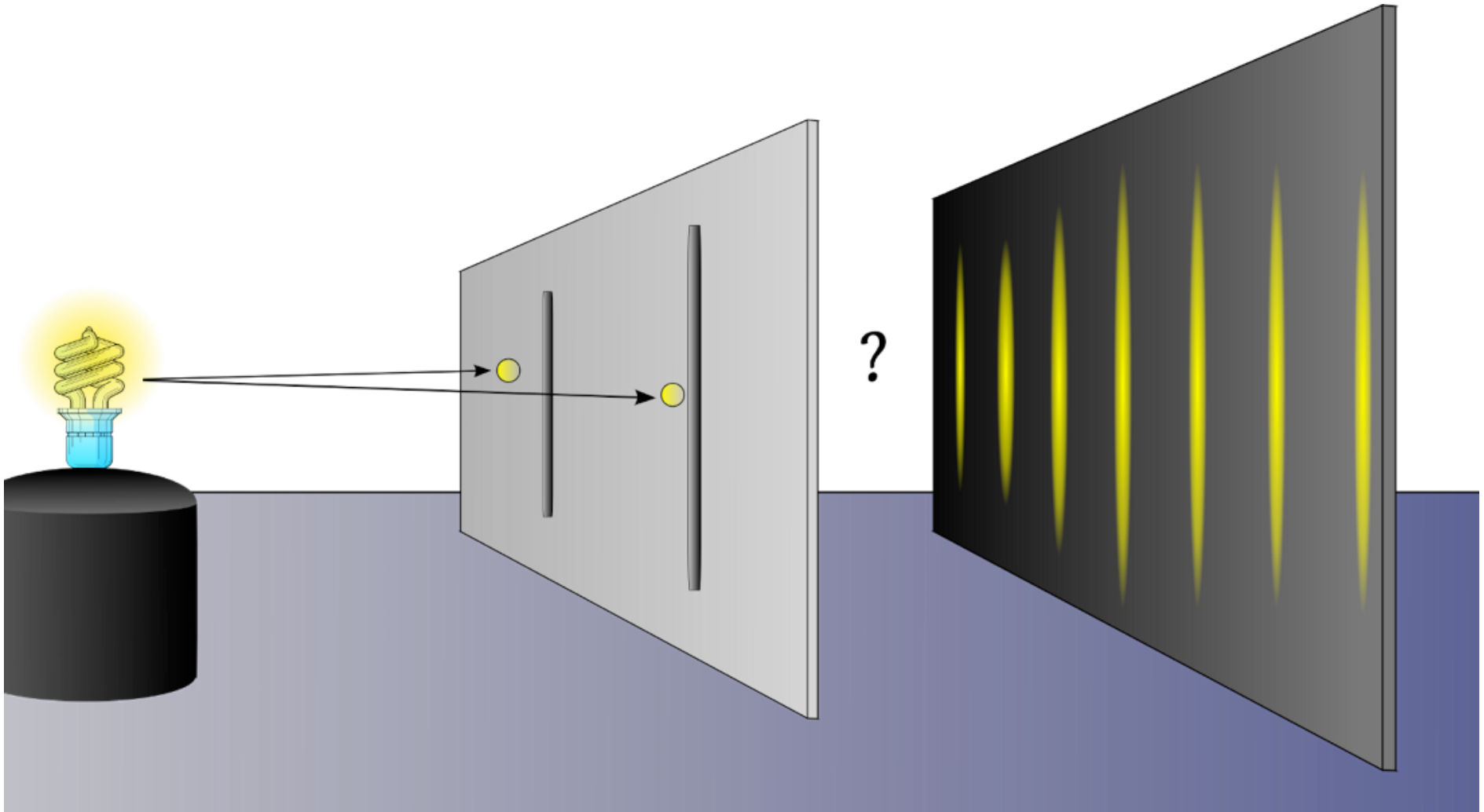
String Theory (?)



Quantum  
Physics

# Video: Double slit experiment

<http://www.youtube.com/watch?v=DfPeprQ7oGc>



Nature has no obligation to conform to your intuitions.

# Video: Double slit experiment





# 2 interesting aspects of quantum physics

## 1. Having multiple states “simultaneously”

e.g.: electrons can have states  
spin “up” or spin “down”:  $|up\rangle$  or  $|down\rangle$

In reality, they can be in a **superposition** of two states.

## 2. Measurement

Quantum property is **very** sensitive/fragile !

If you measure it (interfere with it), it “collapses”.

So you either see  $|up\rangle$  or  $|down\rangle$  .

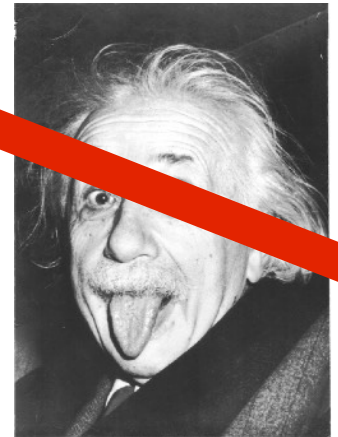


# It must be just our ignorance

- There is no such thing as *superposition*.
- We don't know the state, so we say it is in *superposition*.
- In reality, it is always in one of the two states.
- This is why when we measure/observe the state, we find it in one state.

God does not play dice with the world.

- *Albert Einstein*



Einstein, don't tell God what to do.

- *Niels Bohr*

How should we fix our intuitions  
to put it in line with experimental results ?

# Removing physics from quantum physics

mathematics underlying quantum physics

=

generalization/extension of probability theory

(allow “negative probabilities”)

Probabilistic states and evolution  
vs  
Quantum states and evolution

# Probabilistic states

Suppose an object can have  $n$  possible states:

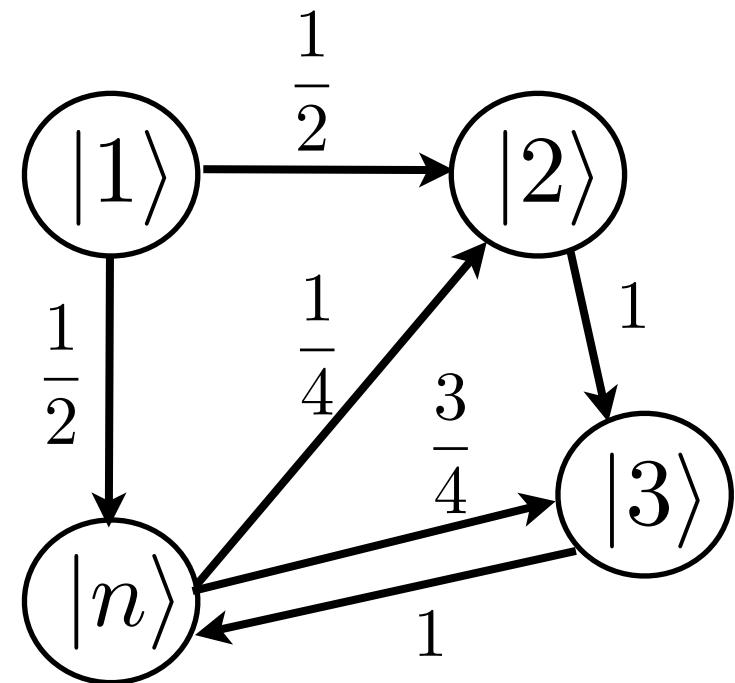
$$|1\rangle, |2\rangle, \dots, |n\rangle$$

At each time step, the state can change probabilistically.

What happens if we start at state  $|1\rangle$  and evolve?

Initial state:

$$\begin{array}{l} |1\rangle \\ |2\rangle \\ |3\rangle \\ \vdots \\ |n\rangle \end{array} \begin{bmatrix} 1 \\ 0 \\ 0 \\ \vdots \\ 0 \end{bmatrix}$$



# Probabilistic states

Suppose an object can have  $n$  possible states:

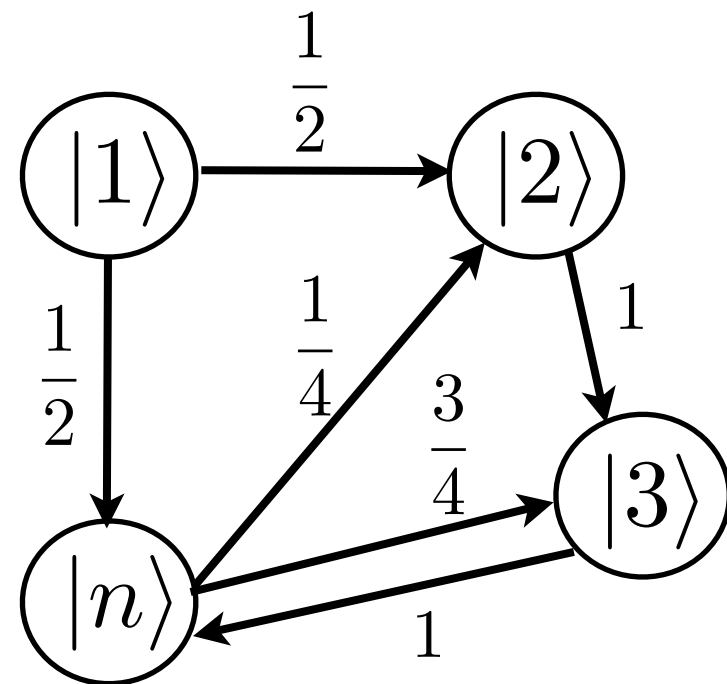
$$|1\rangle, |2\rangle, \dots, |n\rangle$$

At each time step, the state can change probabilistically.

What happens if we start at state  $|1\rangle$  and evolve?

After one time step:

$$\left[ \begin{array}{c} \text{Transition} \\ \text{Matrix} \end{array} \right] \begin{array}{c} |1\rangle \\ |2\rangle \\ |3\rangle \\ \vdots \\ |n\rangle \end{array} \begin{array}{c} \left[ \begin{array}{c} 1 \\ 0 \\ 0 \\ \vdots \\ 0 \end{array} \right] \\ = \\ \left[ \begin{array}{c} 0 \\ 1/2 \\ 0 \\ \vdots \\ 1/2 \end{array} \right] \end{array}$$



# Probabilistic states

$$\begin{bmatrix} \text{Transition} \\ \text{Matrix} \end{bmatrix} \begin{bmatrix} |1\rangle \\ |2\rangle \\ |3\rangle \\ \vdots \\ |n\rangle \end{bmatrix} \begin{bmatrix} 1 \\ 0 \\ 0 \\ \vdots \\ 0 \end{bmatrix} = \begin{bmatrix} 0 \\ 1/2 \\ 0 \\ \vdots \\ 1/2 \end{bmatrix} \quad \text{the new state} \\ \text{(probabilistic)}$$

A *general* probabilistic state:

$$\begin{bmatrix} p_1 \\ p_2 \\ \vdots \\ p_n \end{bmatrix} \quad \begin{array}{l} p_i = \text{the probability of being in state } i \\ p_1 + p_2 + \cdots + p_n = 1 \\ (\ell_1 \text{ norm is } 1) \end{array}$$

# Probabilistic states

$$\begin{bmatrix} \text{Transition} \\ \text{Matrix} \end{bmatrix} \begin{bmatrix} |1\rangle \\ |2\rangle \\ |3\rangle \\ \vdots \\ |n\rangle \end{bmatrix} \begin{bmatrix} 1 \\ 0 \\ 0 \\ \vdots \\ 0 \end{bmatrix} = \begin{bmatrix} 0 \\ 1/2 \\ 0 \\ \vdots \\ 1/2 \end{bmatrix} \quad \text{the new state} \\ \text{(probabilistic)}$$

A *general* probabilistic state:

$$\begin{bmatrix} p_1 \\ p_2 \\ \vdots \\ p_n \end{bmatrix} = p_1 \begin{bmatrix} 1 \\ 0 \\ \vdots \\ 0 \end{bmatrix} + p_2 \begin{bmatrix} 0 \\ 1 \\ \vdots \\ 0 \end{bmatrix} + \cdots + p_n \begin{bmatrix} 0 \\ 0 \\ \vdots \\ 1 \end{bmatrix}$$



# Probabilistic states

## Evolution of probabilistic states

**Transition Matrix** Any matrix that maps probabilistic states to probabilistic states.

We won't restrict ourselves to just one transition matrix.

$$\pi_0 \xrightarrow{K_1} \pi_1 \xrightarrow{K_2} \pi_2 \xrightarrow{K_3} \dots$$

# Quantum states

$$\begin{bmatrix} p_1 \\ p_2 \\ \vdots \\ p_n \end{bmatrix}$$

$p_i$ 's can be negative.

# Quantum states

$$\begin{bmatrix} \alpha_1 \\ \alpha_2 \\ \vdots \\ \alpha_n \end{bmatrix}$$

$\alpha_i$ 's can be negative. ( $\alpha_i$ 's are called **amplitudes**.)

$$= \alpha_1|1\rangle + \alpha_2|2\rangle + \cdots + \alpha_n|n\rangle$$

$$\alpha_1^2 + \alpha_2^2 + \cdots + \alpha_n^2 = 1 \quad (\ell_2 \text{ norm is } 1)$$

( $\alpha_i$  can be a complex number)

$$\begin{bmatrix} \text{Unitary} \\ \text{Matrix} \end{bmatrix}$$

$$\begin{bmatrix} \alpha_1 \\ \alpha_2 \\ \vdots \\ \alpha_n \end{bmatrix} = \begin{bmatrix} \beta_1 \\ \beta_2 \\ \vdots \\ \beta_n \end{bmatrix}$$

$$\beta_1^2 + \beta_2^2 + \cdots + \beta_n^2 = 1$$



any matrix that preserves “quantumness”

# Quantum states

## Evolution of quantum states

Unitary  
Matrix

Any matrix that maps  
quantum states to quantum states.

We won't restrict ourselves to just one unitary matrix.

$$\psi_0 \xrightarrow{U_1} \psi_1 \xrightarrow{U_2} \psi_2 \xrightarrow{U_3} \dots$$

# Quantum states

## Measuring quantum states

$$\begin{bmatrix} \alpha_1 \\ \alpha_2 \\ \vdots \\ \alpha_n \end{bmatrix} = \alpha_1|1\rangle + \alpha_2|2\rangle + \cdots + \alpha_n|n\rangle$$

$$\alpha_1^2 + \alpha_2^2 + \cdots + \alpha_n^2 = 1$$

When you **measure** the state,  
you see state  $i$  with probability  $\alpha_i^2$ .

# Probabilistic states vs Quantum states

Suppose we have just 2 possible states:  $|0\rangle$  and  $|1\rangle$

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

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

randomize a random state  
→ random state

$$|0\rangle \rightarrow \frac{1}{2}|0\rangle + \frac{1}{2}|1\rangle$$

$$\frac{1}{2} \left( \frac{1}{2}|0\rangle + \frac{1}{2}|1\rangle \right)$$

$$\frac{1}{4}|0\rangle + \frac{1}{4}|1\rangle$$

$$\frac{1}{2} \left( \frac{1}{2}|0\rangle + \frac{1}{2}|1\rangle \right)$$

$$\frac{1}{4}|0\rangle + \frac{1}{4}|1\rangle$$

+

# Probabilistic states vs Quantum states

Suppose we have just 2 possible states:  $|0\rangle$  and  $|1\rangle$

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

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

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

$$\frac{1}{\sqrt{2}} \left( \frac{1}{\sqrt{2}} |0\rangle + \frac{1}{\sqrt{2}} |1\rangle \right)$$

$$\frac{1}{\sqrt{2}} \left( -\frac{1}{\sqrt{2}} |0\rangle + \frac{1}{\sqrt{2}} |1\rangle \right)$$

$$\cancel{\frac{1}{2} |0\rangle} + \frac{1}{2} |1\rangle$$

+

$$\cancel{-\frac{1}{2} |0\rangle} + \frac{1}{2} |1\rangle = |1\rangle$$

# Probabilistic states vs Quantum states

## Classical Probability

To find the **probability** of an event:

add the **probabilities** of every possible way it can happen



# Probabilistic states vs Quantum states

## Quantum

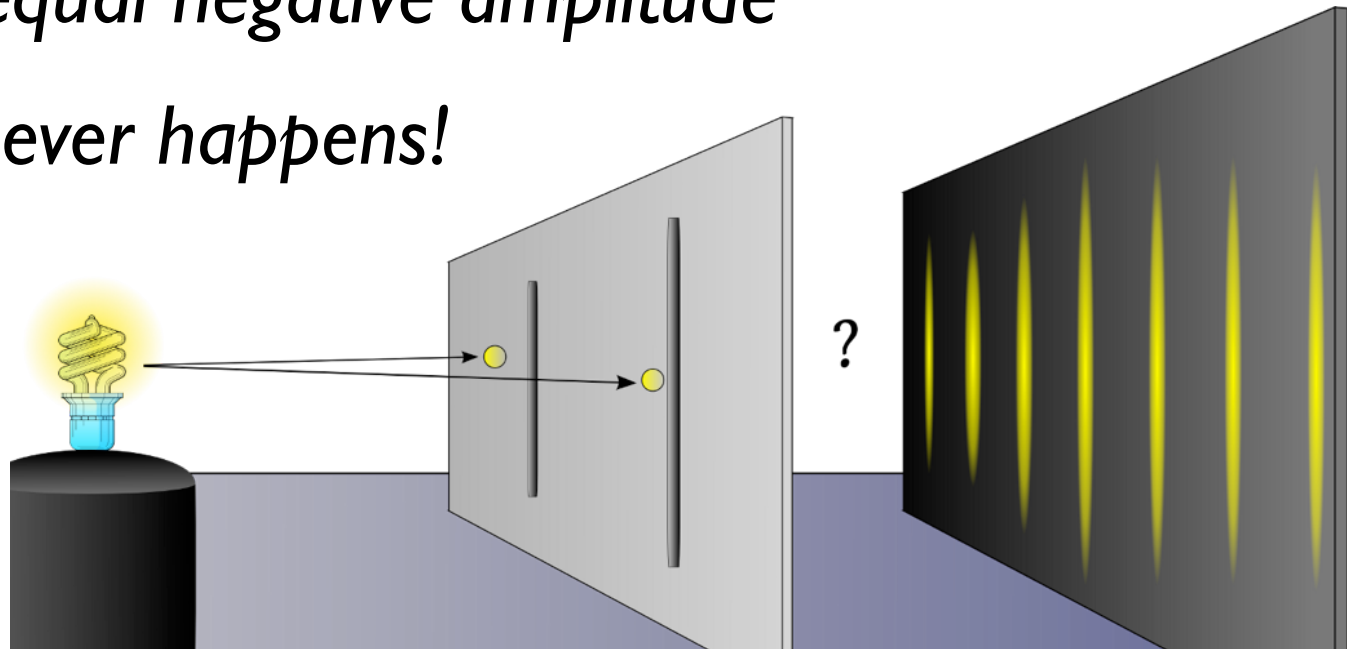
To find the **probability of an event**:

add the **amplitudes** of every possible way it can happen,  
then square the value to get the probability.

*one way has positive amplitude*

*the other way has equal negative amplitude*

➔ *event never happens!*



# Probabilistic states vs Quantum states

## A final remark

Quantum states are an upgrade to:

**2-norm** (Euclidean norm) and **algebraically closed fields**.

Nature seems to be choosing the mathematically more elegant option.

# The plan

Classical computers and classical theory of computation

Quantum physics (what the fuss is all about)

Quantum computation  
(practical, scientific, and philosophical perspectives)

# The plan

Quantum computation  
(practical, scientific, and philosophical perspectives)

# Two beautiful theories

**Theory of computation**

**Quantum physics**



# **Quantum Computation:**

Information processing using laws of quantum physics.



Richard Feynman  
(1918 - 1988)

It would be super nice to be able to simulate quantum systems.

With a classical computer this is extremely inefficient.

**n**-state quantum system  $\longrightarrow$   
complexity exponential in **n**

Why not view the quantum particles as a computer simulating themselves?

Why not do computation using quantum particles/physics?

# Representing data/information

An electron can be in “spin up” or “spin down” state.

$$|\text{up}\rangle \quad \text{or} \quad |\text{down}\rangle \quad \sim \quad |0\rangle \quad \text{or} \quad |1\rangle$$

A quantum bit:  
(qubit)

$$\alpha_0|0\rangle + \alpha_1|1\rangle, \quad \alpha_0^2 + \alpha_1^2 = 1$$

A *superposition* of  $|0\rangle$  and  $|1\rangle$ .

**When you measure:**

- With probability  $\alpha_0^2$  it is  $|0\rangle$ .
- With probability  $\alpha_1^2$  it is  $|1\rangle$ .



# Representing data/information

An electron can be in “spin up” or “spin down” state.

$$|\text{up}\rangle \quad \text{or} \quad |\text{down}\rangle \quad \sim \quad |0\rangle \quad \text{or} \quad |1\rangle$$

A quantum bit:  $\alpha_0|0\rangle + \alpha_1|1\rangle$ ,  $\alpha_0^2 + \alpha_1^2 = 1$   
(qubit)

---

2 qubits:

$$\alpha_{00}|00\rangle + \alpha_{01}|01\rangle + \alpha_{10}|10\rangle + \alpha_{11}|11\rangle$$

$$\alpha_{00}^2 + \alpha_{01}^2 + \alpha_{10}^2 + \alpha_{11}^2 = 1$$

# Representing data/information

An electron can be in “spin up” or “spin down” state.

$$|\text{up}\rangle \quad \text{or} \quad |\text{down}\rangle \quad \sim \quad |0\rangle \quad \text{or} \quad |1\rangle$$

A quantum bit:  $\alpha_0|0\rangle + \alpha_1|1\rangle$ ,  $\alpha_0^2 + \alpha_1^2 = 1$   
(qubit)

---

3 qubits:

$$\alpha_{000}|000\rangle + \alpha_{001}|001\rangle + \alpha_{010}|010\rangle + \alpha_{011}|011\rangle + \\ \alpha_{100}|100\rangle + \alpha_{101}|101\rangle + \alpha_{110}|110\rangle + \alpha_{111}|111\rangle$$

$$\alpha_{000}^2 + \alpha_{001}^2 + \alpha_{010}^2 + \alpha_{011}^2 + \alpha_{100}^2 + \alpha_{101}^2 + \alpha_{110}^2 + \alpha_{111}^2 = 1$$

# Representing data/information

An electron can be in “spin up” or “spin down” state.

$$|\text{up}\rangle \quad \text{or} \quad |\text{down}\rangle \quad \sim \quad |0\rangle \quad \text{or} \quad |1\rangle$$

A quantum bit:  $\alpha_0|0\rangle + \alpha_1|1\rangle$ ,  $\alpha_0^2 + \alpha_1^2 = 1$   
(qubit)

---

For  $n$  qubits, how many amplitudes are there?

# Processing data

## What will be our model?

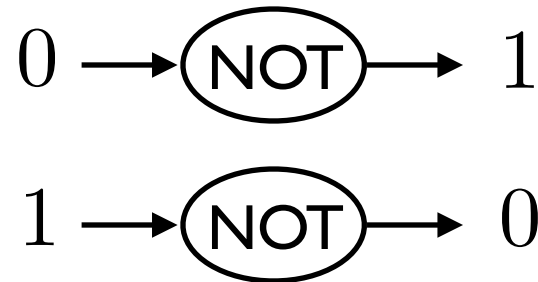
In the classical setting, we had:

- Turing Machines
- Boolean circuits

In the quantum setting,  
more convenient to use the **circuit** model.

# Processing data: quantum gates

One non-trivial **classical gate** for a single **classical bit**:



There are many non-trivial quantum gates for a single qubit.

One famous example: **Hadamard gate**

$$|0\rangle \longrightarrow \boxed{H} \longrightarrow \frac{1}{\sqrt{2}}|0\rangle + \frac{1}{\sqrt{2}}|1\rangle$$

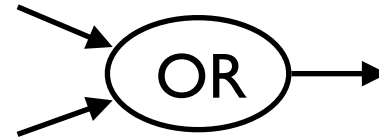
$$|1\rangle \longrightarrow \boxed{H} \longrightarrow \frac{1}{\sqrt{2}}|0\rangle - \frac{1}{\sqrt{2}}|1\rangle$$

“transition” matrix:

$$\begin{bmatrix} 1/\sqrt{2} & 1/\sqrt{2} \\ 1/\sqrt{2} & -1/\sqrt{2} \end{bmatrix}$$

# Processing data: quantum gates

Examples of **classical gates** on 2 **classical bits**:

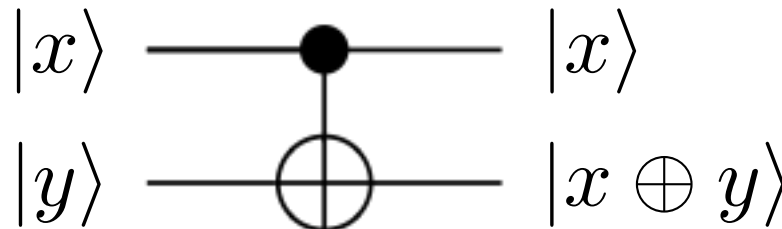


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A famous example of a quantum gate on 2 qubits:

## controlled NOT

For  
 $x, y \in \{0, 1\}$



“transition” matrix:

$$\begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 1 \\ 0 & 0 & 1 & 0 \end{bmatrix}$$

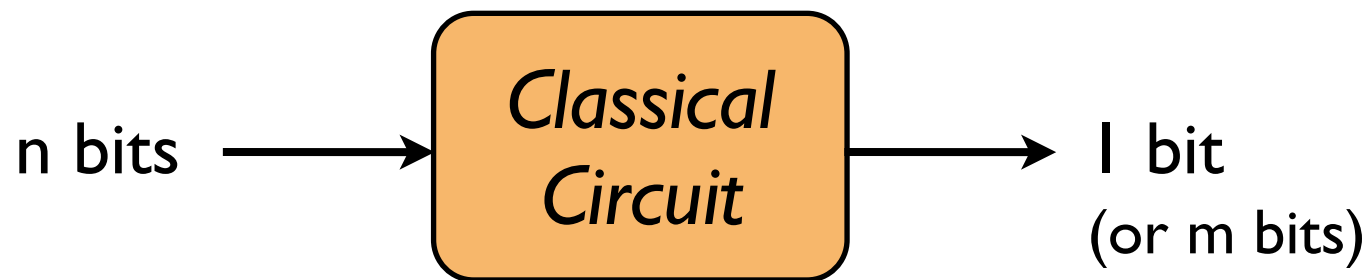
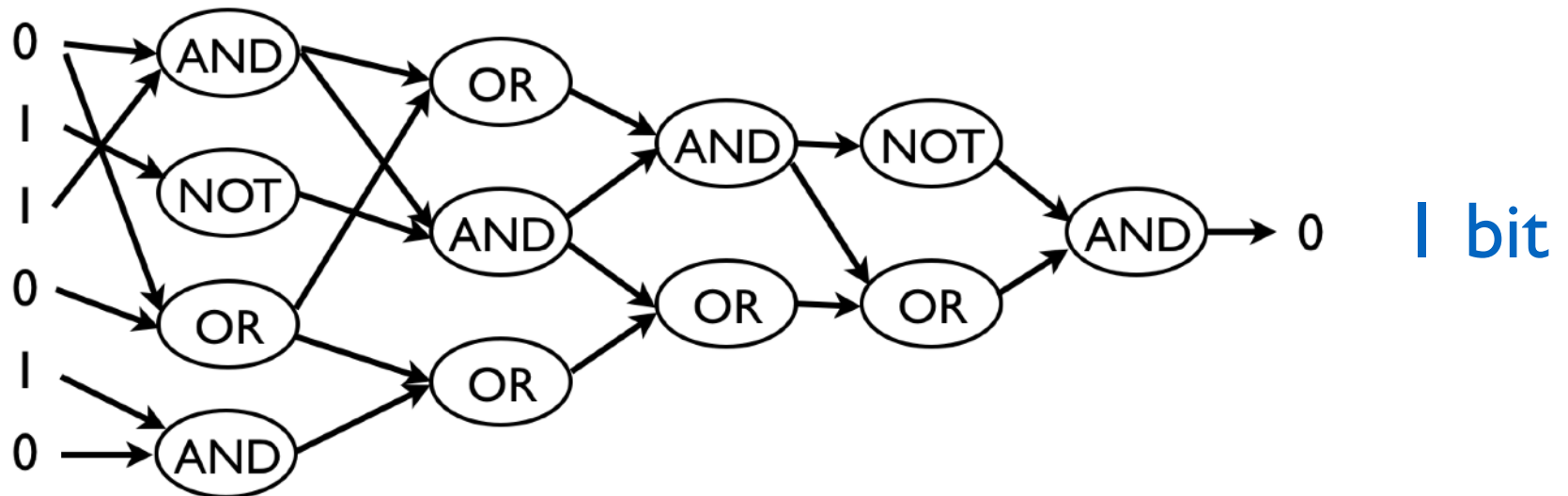
# Processing data: quantum circuits

## A classical circuit

INPUT

OUTPUT

n bits



# Processing data: quantum circuits

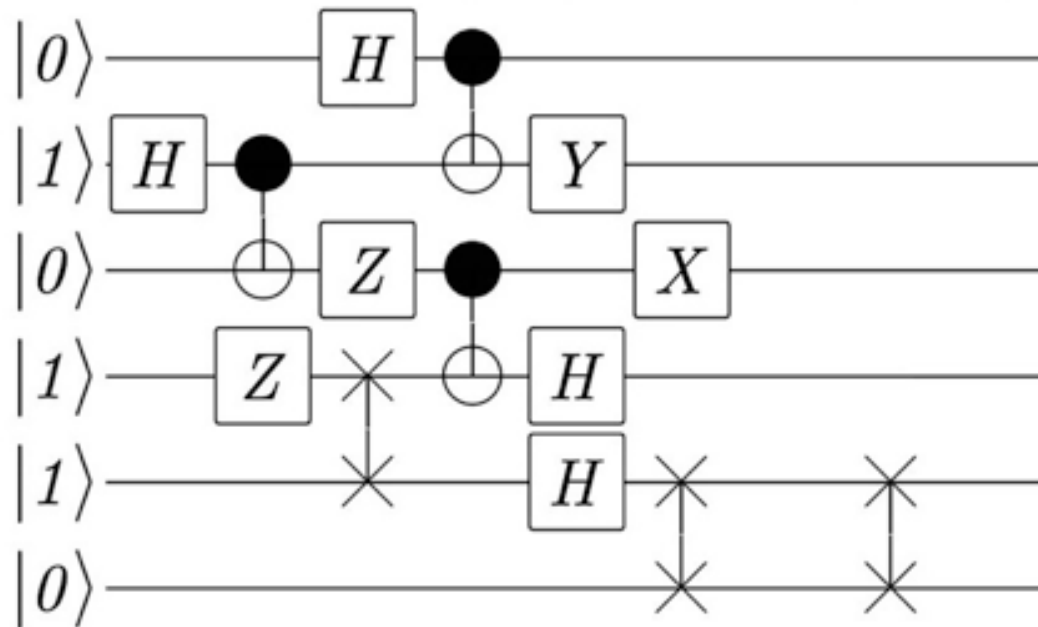
## A quantum circuit

**INPUT**

**OUTPUT**

n qubits

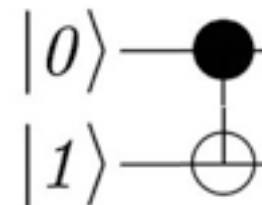
n qubits



**quantum gates**



(acts on 1 qubit)



(acts on 2 qubits)



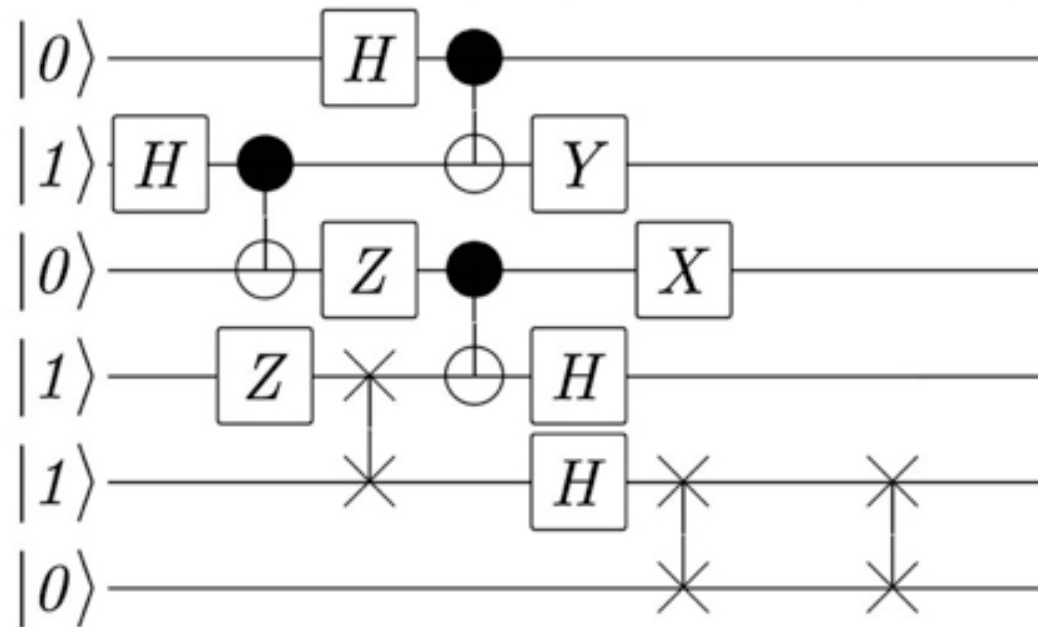
# Processing data: quantum circuits

## A quantum circuit

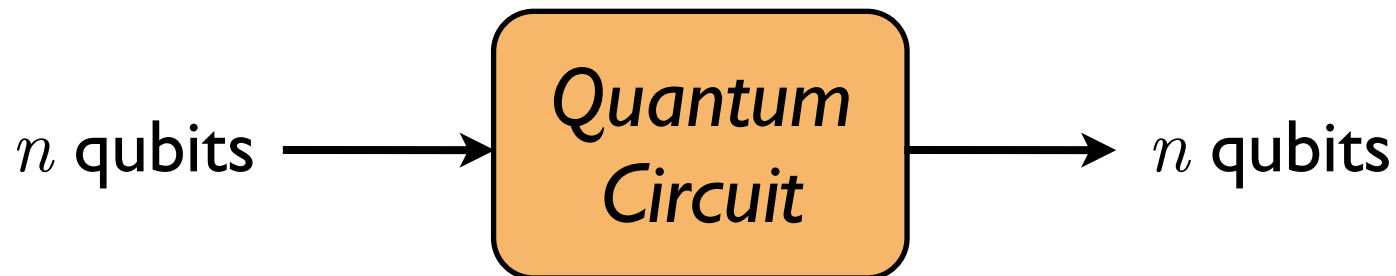
**INPUT**

**OUTPUT**

$n$  qubits



$n$  qubits



# Processing data: quantum circuits

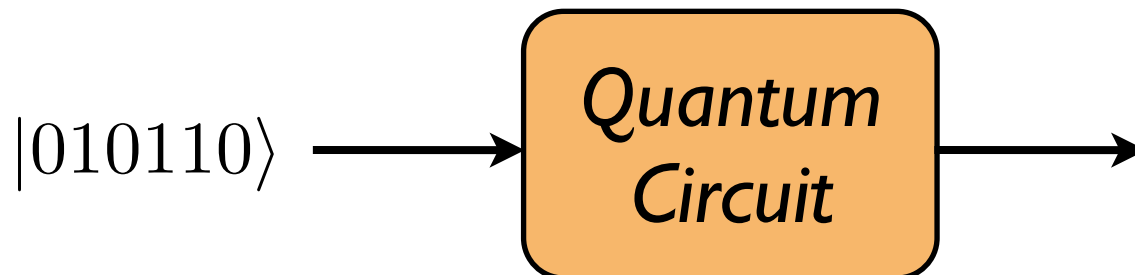
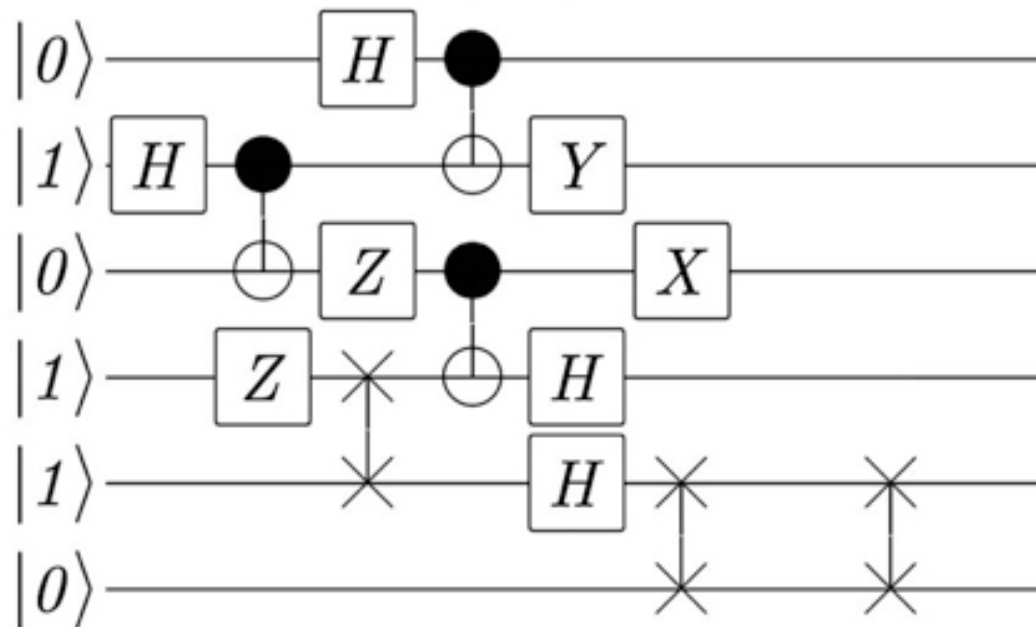
## A quantum circuit

**INPUT**

**OUTPUT**

n qubits

n qubits



# Processing data: quantum circuits

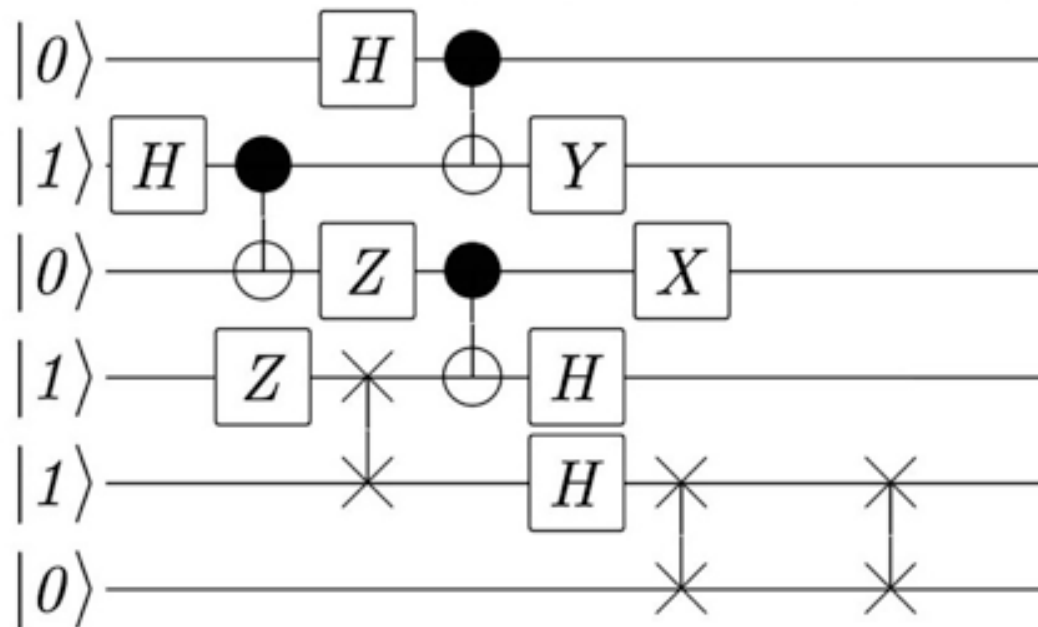
## A quantum circuit

**INPUT**

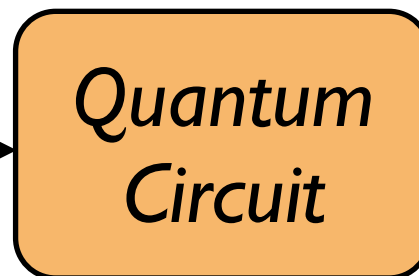
**OUTPUT**

n qubits

n qubits



$|010110\rangle$



$$\begin{aligned} & \alpha_{000000} |000000\rangle + \\ & \alpha_{000001} |000001\rangle + \\ & \alpha_{000010} |000010\rangle + \\ & \quad \cdot \quad \cdot \quad \cdot \\ & \alpha_{111111} |111111\rangle \end{aligned}$$

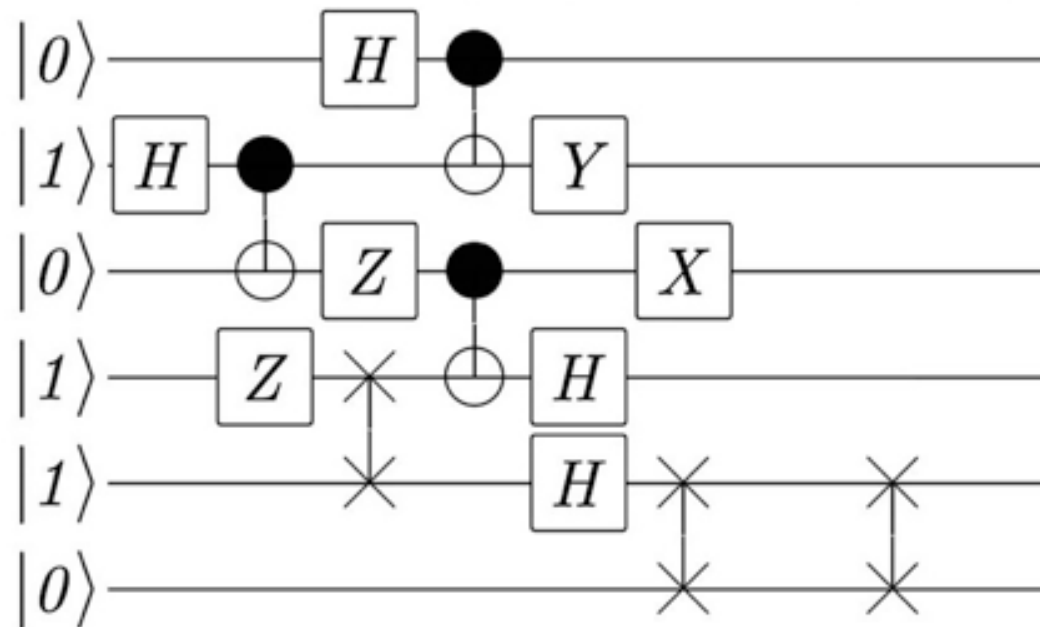
# Processing data: quantum circuits

## A quantum circuit

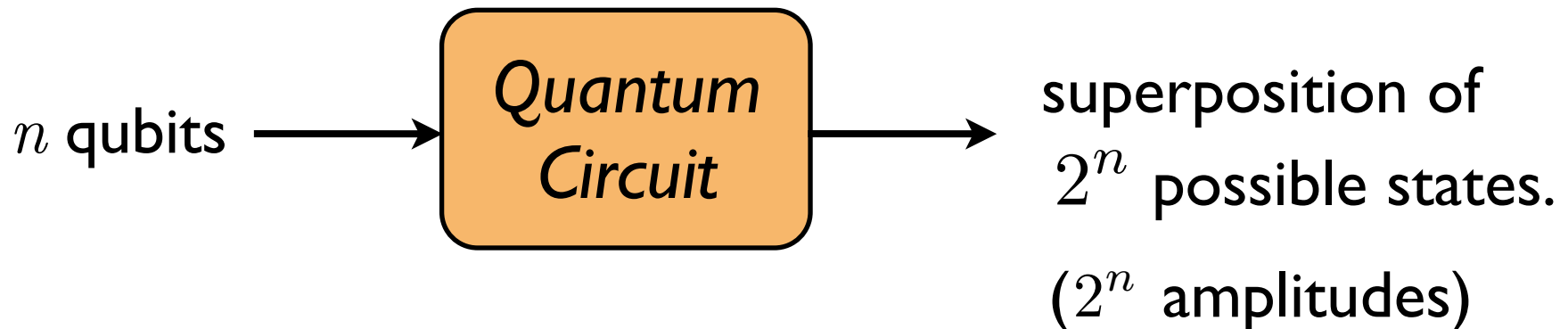
**INPUT**

**OUTPUT**

$n$  qubits



$n$  qubits



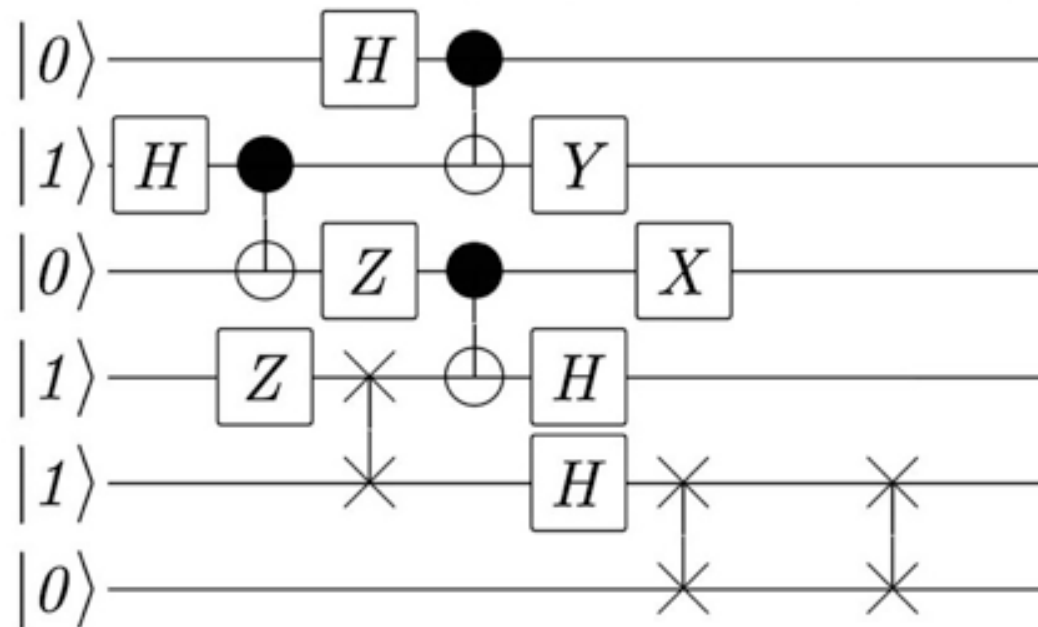
# Processing data: quantum circuits

## A quantum circuit

INPUT

OUTPUT

n qubits



n qubits

How do we get “classical information” from the circuit?

We **measure** the output qubit(s). e.g. we measure:

$$\alpha_{000000}|000000\rangle + \alpha_{000001}|000001\rangle + \dots + \alpha_{111111}|111111\rangle$$

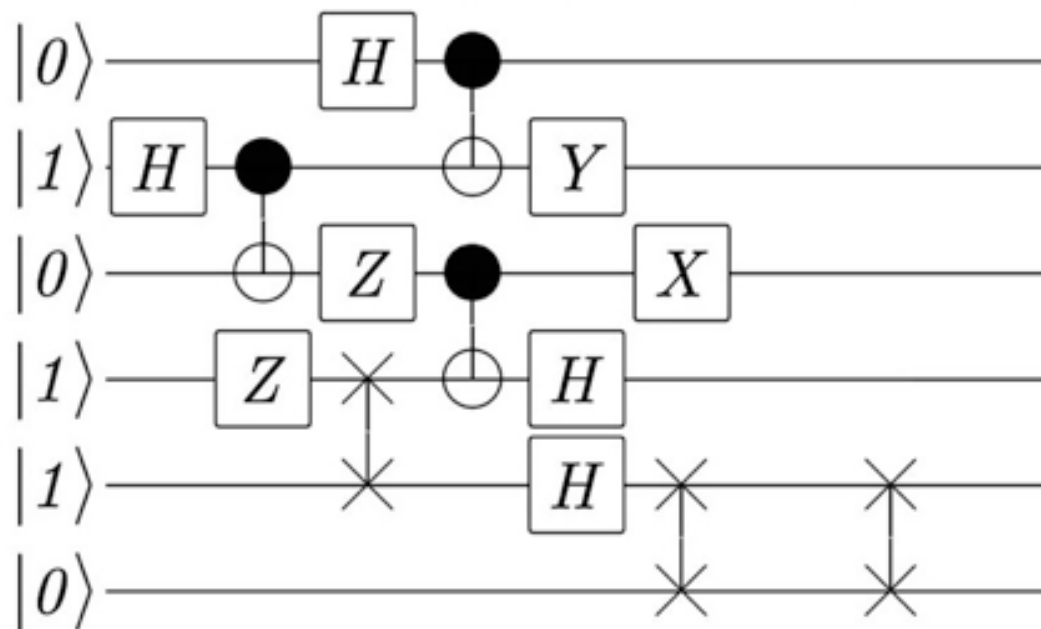
# Processing data: quantum circuits

## A quantum circuit

**INPUT**

**OUTPUT**

n qubits



n qubits

## Complexity?

number of gates  $\sim$  computation time

# Physical Realization

?

# **Practical, Scientific and Philosophical Perspectives**



# Practical perspective

What useful things can we do with a quantum computer?

We can factor large numbers efficiently!

203703597633448608626844568840937816105146839366593625063614044935438129976333670618339  
844568840937816105146839366593625063614044935438129976333670618339928374928729109198341  
992834719747982982750348795478978952789024138794327890432736783553789507821378582549871

So what?

Can break RSA!

Can we solve every problem efficiently?

No !

# Practical perspective

What useful things can we do with a quantum computer?

Can simulate quantum systems efficiently!

Better understand behavior of atoms and molecules.

## Applications:

- nanotechnology
- microbiology
- pharmaceuticals
- superconductors.

...

# Scientific perspective

To know the limits of efficient computation:  
Incorporate actual facts about physics.

# Scientific perspective

## (Physical) Church Turing Thesis

Any computational problem that can be solved by a physical device, can be solved by a Turing Machine.

## Strong version

Any computational problem that can be solved **efficiently** by a physical device, can be solved **efficiently** by a TM.

*Strong version doesn't seem to be true!*

# Philosophical perspective

Is the universe deterministic ?

How does nature keep track of all the numbers ?

1000 qubits  $\rightarrow 2^{1000}$  amplitudes

How should we interpret quantum measurement?  
(the measurement problem)

Does quantum physics have anything to say about the human mind?

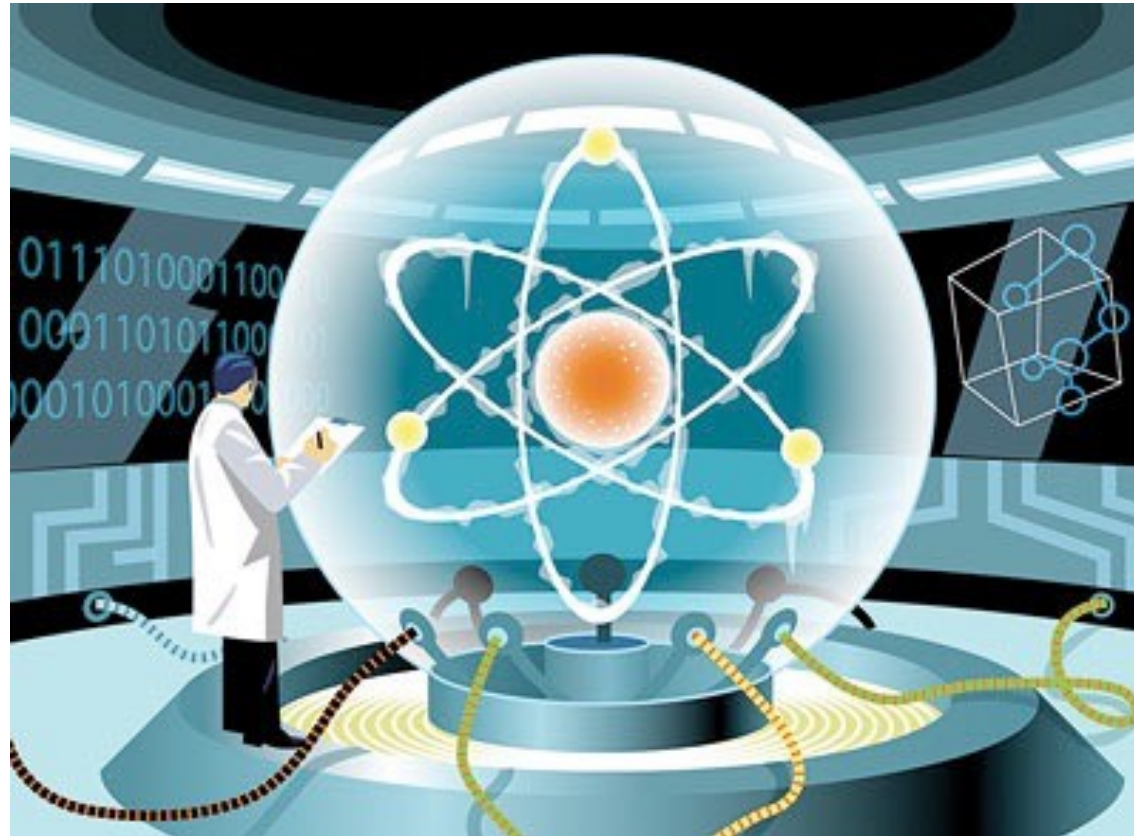
Quantum AI?

# Where are we at building quantum computers?

When can I expect a quantum computer on my desk ?

After about 20 years and 1 billion dollars of funding :  
Can factor 21 into  $3 \times 7$ . (with high probability)

**Challenge:** Interference with the outside world.  
“quantum decoherence”



A whole new exciting world of computation.

Potential to fundamentally change how we view computation.