

# Intro to quantum computing

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# Preamble

- I'm skipping a lot of caveats, knowingly and unknowingly
- Will talk only about "digital" QC (aka quantum circuit) based on qubits
  - No annealing, no qutrits, no continuous-variable, etc.



# How it works

- N-qubit system starts with  $|0\rangle^{\otimes N} =: |\mathbf{0}\rangle$
- Single-qubit gates rotate single qubits
  - Generically,  $|0\rangle \rightarrow \alpha|0\rangle + \beta|1\rangle$  ( $\alpha, \beta \in \mathbb{C}$ ;  $|\alpha|^2 + |\beta|^2 = 1$ )
  - For a tensor product of N qubits,

$$|0\rangle^{\otimes N} \rightarrow \bigotimes_{i=0}^{N-1} (\alpha_i |0\rangle_i + \beta_i |1\rangle_i) = \alpha_0 \dots \alpha_{N-1} |0\rangle_0 \dots |0\rangle_{N-1} + \dots + \beta_0 \dots \beta_{N-1} |1\rangle_0 \dots |1\rangle_{N-1} = \sum_{j=0}^{2^N-1} c_j |\mathbf{j}\rangle$$

$$\text{where } |\mathbf{j}\rangle := \bigotimes_{i=0}^{N-1} |s_i^j\rangle_i \text{ for } j = \left( s_0^j s_1^j \dots s_{N-1}^j \right)_2 \quad (\text{e.g. } |\mathbf{3}\rangle = |0\rangle_0 |1\rangle_1 |1\rangle_2)$$

$$\text{and } c_j = \prod_{\{i|s_i^j=0\}} \alpha_i \prod_{\{i|s_i^j=1\}} \beta_i$$

- So we get a superposition of  $|\mathbf{j}\rangle$ s, but this is actually a "separable" state - not interesting
  - Full state can be expressed by  $\{\alpha_i, \beta_i\}_i$  where each pair has

2 complex  $\left( 4 - 1 - 1 = 2 \right)$  real parameters  $\rightarrow$  2N-dim. parameter space

normalization overall phase equivalence

# How it works

- Controlled gates create inseparable states. For example,

$$\frac{1}{\sqrt{2}} (|0\rangle_0 + |1\rangle_0) \cdot |0\rangle_1 \xrightarrow{\text{controlled NOT}} \frac{1}{\sqrt{2}} (|0\rangle_0 |0\rangle_1 + |1\rangle_0 |1\rangle_1)$$

Qubit 1 is inverted only when qubit 0 is  $|1\rangle$

- Combination of controlled and single-qubit gates create state  $\sum_{j=0}^{2^N-1} c_j |\mathbf{j}\rangle$  where  $c_j$  are independent parameters.
- 2 real param  $\times 2^N$  terms - 1 norm. constraint - 1 overall phase  
 →  $2^{N+1} - 2$  dimensional parameter space

# Output = a distribution

- The circuit is one giant  $SU(2^N)$  operator that "rotates"  $|\mathbf{0}\rangle$  to a final state

$$(\text{circuit})|\mathbf{0}\rangle = \sum_{j=0}^{2^N-1} c_j |\mathbf{j}\rangle$$

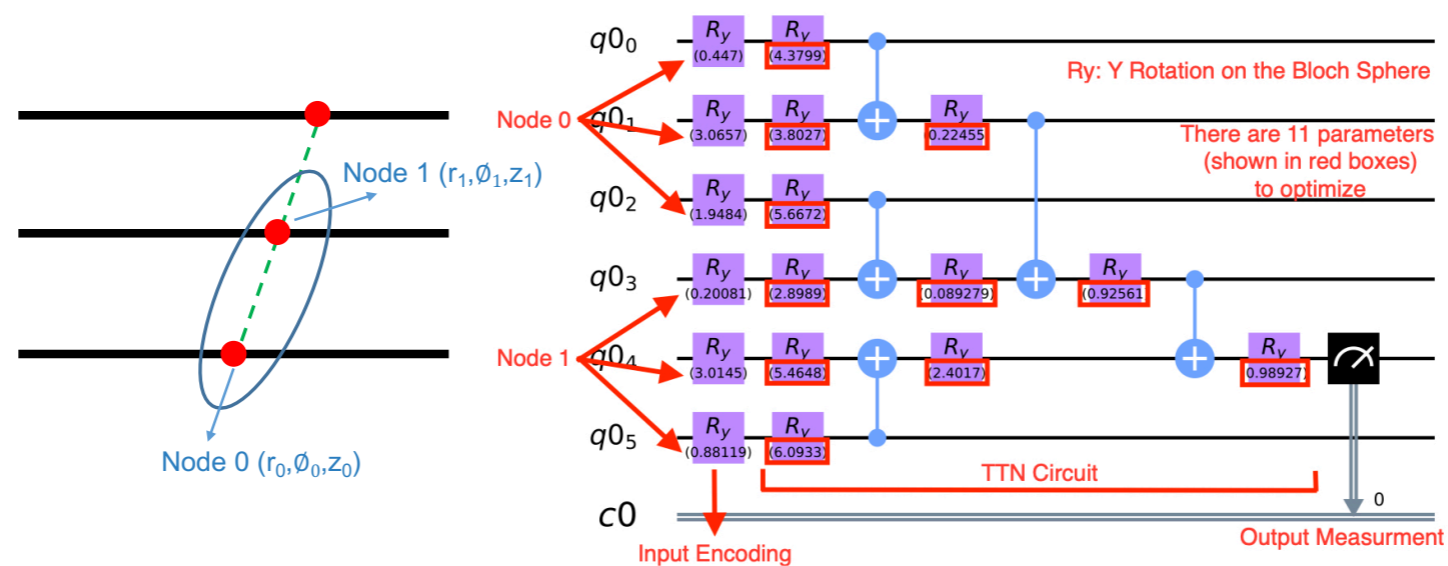
- Measurement projects each qubit into 0 or 1 state  
→ Overall measurement projects the final state to one  $|\mathbf{j}\rangle$
- Probability of obtaining  $j = |c_j|^2$
- Run the circuit many times and repeat the measurement  
→ Get a histogram over  $j$  with bin contents prop. to  $|c_j|^2$
- Output of a quantum circuit is a distribution over  $\{0, \dots, 2^N-1\}$

# Input = gate parameters

- Usually, the initial state of a quantum circuit is fixed to  $|0\rangle$ 
  - We don't know a way to prepare arbitrary states  
(If we do, we have mastered quantum computing)
- QC becomes all about setting up the gates so that the output distribution gives the answer to the problem at hand

## A Quantum Classifier

How does it work?



# Applications

- Is the big(gest?) question.
- QC calculates  $O(2^N)$  numbers in parallel using  $O(M)$  gates
  - $M$  should be  $\ll 2^N$  for it to make sense
- We only get 1 out of  $O(2^N)$  numbers per "shot"
  - We must be OK with getting answers statistically
  - Or we engineer a clever circuit whose final state is dominantly a single  $|j\rangle$  that is the desired answer (cf. Grover's algorithm)
- Quantum memory is not a thing yet
  - All computations must go from initial to final state in one shot



# Hint for applications

- We know how to use QC to do a really Fast Fourier Transform

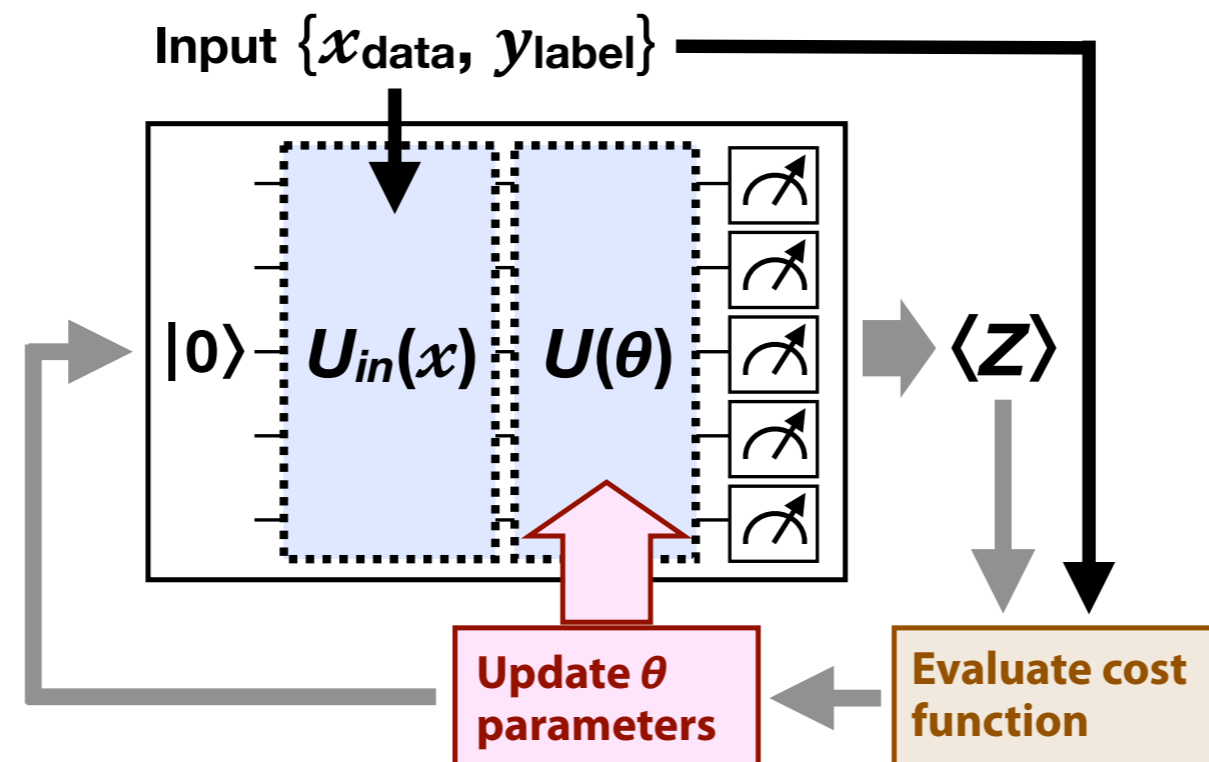
$$|\mathbf{j}\rangle \rightarrow \frac{1}{\sqrt{\mathcal{N}}} \sum_{k=0}^{\mathcal{N}-1} e^{2\pi i \frac{jk}{\mathcal{N}}} |\mathbf{k}\rangle \quad (\mathcal{N} = 2^N)$$

→ Basis for algorithms like factoring (Shor)

- We also know search algorithms
- Recently, more attention given to using the  $2^N$ -dimensional vector space as the latent space of certain algorithms
  - $2^N$  numbers can't be accessed, so use them as a hidden layer
  - Inner product (= distance) in the space is a natural concept
    - Good synergy with kernel methods
  - Large dimensionality → possibility of universal approximation

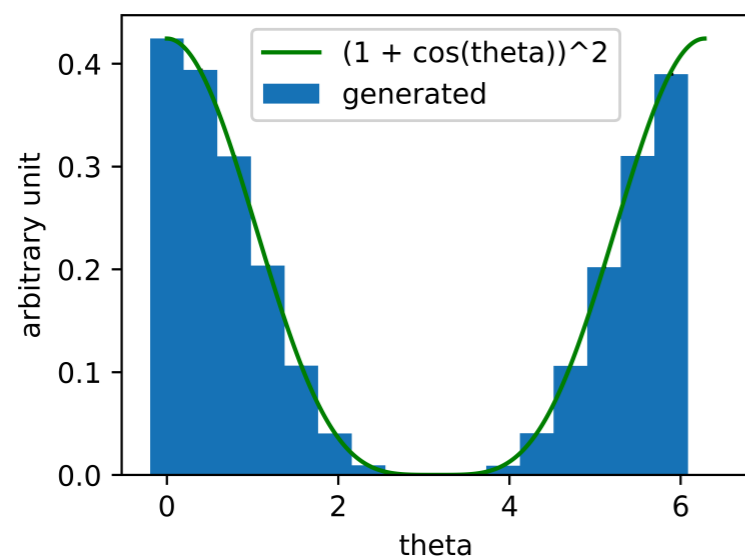
# Quantum ML with variational circuits

- Fix a gate representation (encoding) of input data
- Apply a set of gates with learnable params to the "data state"
- Run the circuit for a large number of iterations
  - Compute the cost function from an aggregate of the output (e.g. mean)
- Update the learnable params



# Side track: my dream application

- Getting 1 point per shot with a probability distribution  
→ An event generator!
- Label  $2^N$  points in the event phase space and create a state  $|\psi\rangle = \sum_{i=0}^{\mathcal{N}-1} \psi(\mathbf{x}_i) |i\rangle$  where  $\psi(\mathbf{x})$  is the scattering amplitude to  $\mathbf{x}$
- Each circuit run produces one unweighted event
- Benefit: no need to integrate (aka gridpack generation)
  - $T_{\text{integration}} \sim \exp(\text{number of final state particles})$
  - In the QC generator,  $N_{\text{qubit}} \sim \text{number of final state particles}$



Proof of concept:  $\psi(\theta) = (1 + \cos \theta)^2$   
 (LO amplitude of  $e^+e^- \rightarrow \mu^+\mu^-$ ) implemented on IBM  
 circuit simulator

# Existing ecosystem

- Google and IBM have the real machines
- Google: Cirq and now TensorFlow Quantum
- IBM: Qiskit and "IBM Quantum Experience"
  - Lets anyone with a (free) account use their QC on cloud
- Xanadu (Canadian startup): PennyLane (abstract layer for QML. Can do automatic differentiation of quantum circuits)
- Likely there are many more to check out

# NISQ reality

- We are in the "noisy intermediate scale quantum" regime
- Machines (at least the IBM ones) are really noisy!
  - Very low fidelity for any realistic number of gates
- Even though QC is a reality now, it's still time to focus on algorithm & tools development
- QC simulators are still important

# QFT

- There is already work on FPGA impl. of QC simulators
- As far as we know, there is no generic framework for translating circuits in e.g. Cirq into RTL
  - Actually the link above doesn't even use HLS
- Can we make an HLS4QML?
  - But we are calling it QFT