

# Lecture 4

Quantum algorithms beyond the circuit model  
Quantum optimization - Quantum simulation

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Quantum algorithms beyond the circuit model

**Quantum optimization** - Quantum simulation

# Quantum adiabatic theorem

“A physical system remains in its instantaneous eigenstate if a given perturbation is acting on it slowly enough and if there is a gap between the eigenvalue and the rest of the Hamiltonian's spectrum” Born-Fock (1928)

**Schrodinger equation:**

$$i\hbar \frac{d\psi(t)}{dt} = H(t)\psi(t)$$

**Instantaneous eigenstates:**

$$H(t)\psi_n(t) = E_n(t)\psi_n(t)$$

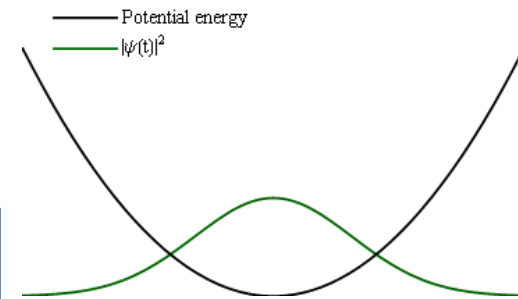
**Initial condition:**

$$\psi(t=0) = \psi_{n_0}$$

If evolution time **slow enough** (condition, see later)  $\psi(t) \approx e^{i\theta(t)}\psi_{n_0}(t)$

**Example:**

Particle in a Harmonic trap

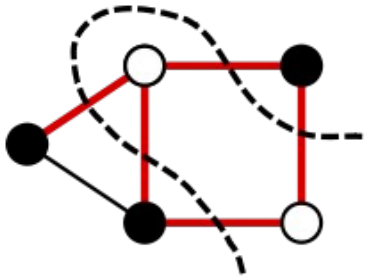


# Quantum annealing (B. Apolloni, N. Cesa Bianchi and D. De Falco (1988))

## Basic Idea:

- 1) Encode the solution of a 'hard' computational problem as the ground state of a classical Hamiltonian
- 2) Prepare the ground-state physically via an adiabatic quantum machine
- 3) Extract the solution by a projective measurement

## Example: Max-Cut



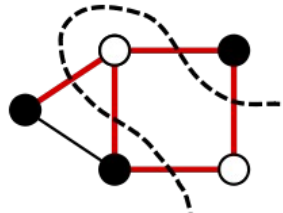
### Problem:

Given a graph, divide the nodes in two parts (white versus black), such as the number of edges between the two parts is maximal

**Application:** Group/Market opinions analysis, micro-electronics

**Complexity :** NP-Hard

# Quantum annealing with Max-Cut



## Step 1: Encoding

**Problem:** Given a graph, divide the nodes in two parts (white versus black), such as the number of edges between the two parts is maximal

→ The solution is the ground-state  $\psi_c$  of a classical Ising model

$$H_C = \sum_{(i,j) \in G} \sigma_i^z \sigma_j^z$$

## Step 2: Adiabatic state preparation

$$H(t) = \left(\frac{t}{\tau}\right) H_C + \left(1 - \frac{t}{\tau}\right) \sum_i \sigma_i^x$$

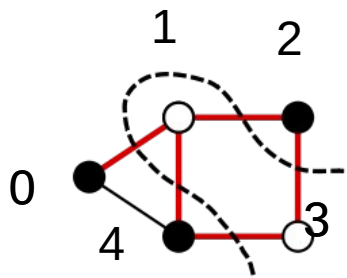
$$\psi(t=0) = |\downarrow_x, \dots, \downarrow_x\rangle$$

$$|\downarrow_x\rangle = |\uparrow\rangle - |\downarrow\rangle$$

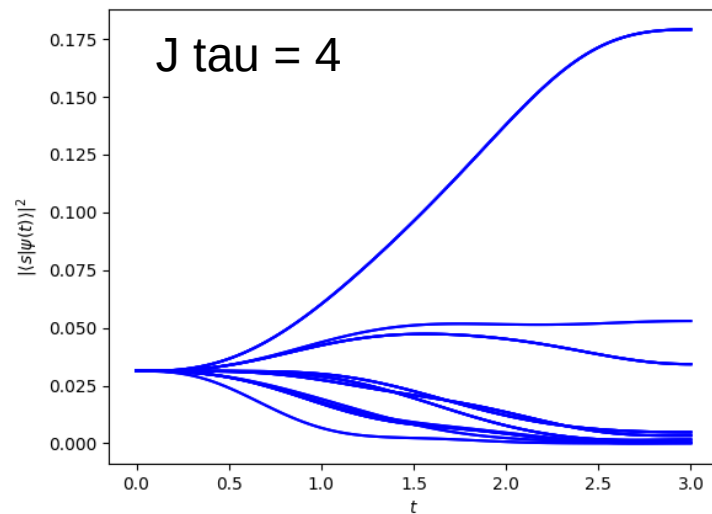
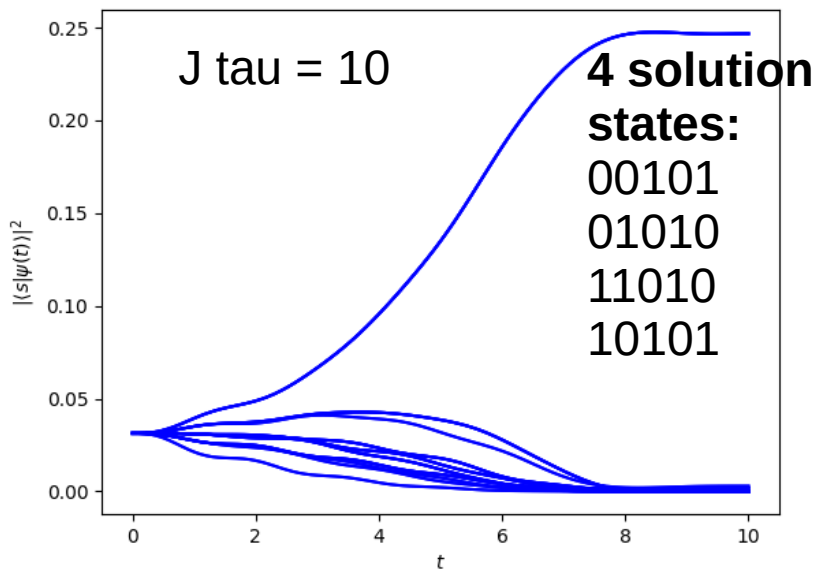
For an adiabatic ramp  $\psi(\tau) \approx \psi_c$

## Step 3: Readout

# Quantum annealing with Max-Cut

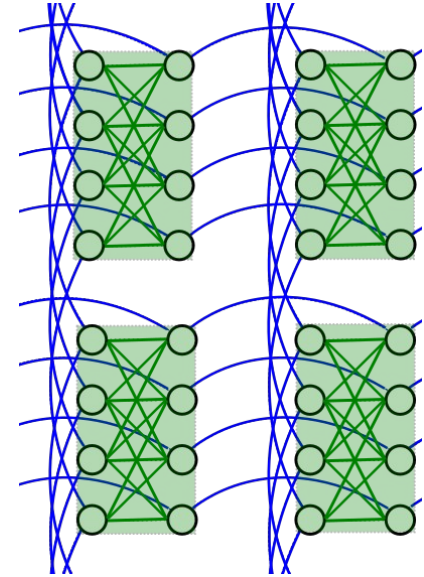


Numerical illustration (with the Python toolbox QuTip)



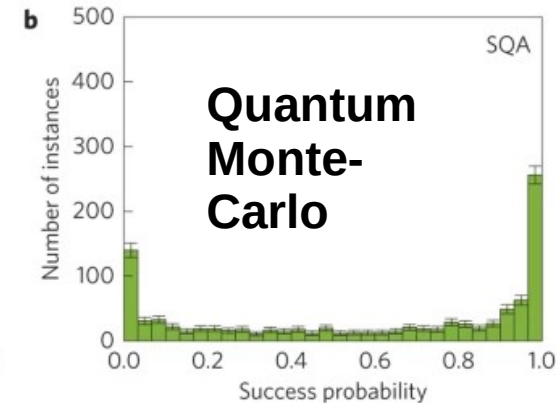
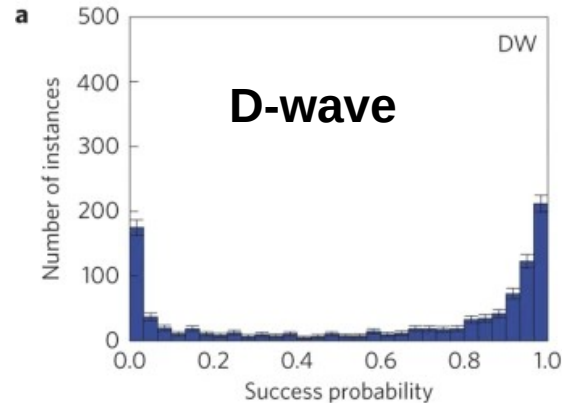
# First steps towards quantum annealing

**2011:** D-wave quantum computing releases D-wave one with 128 qubits!



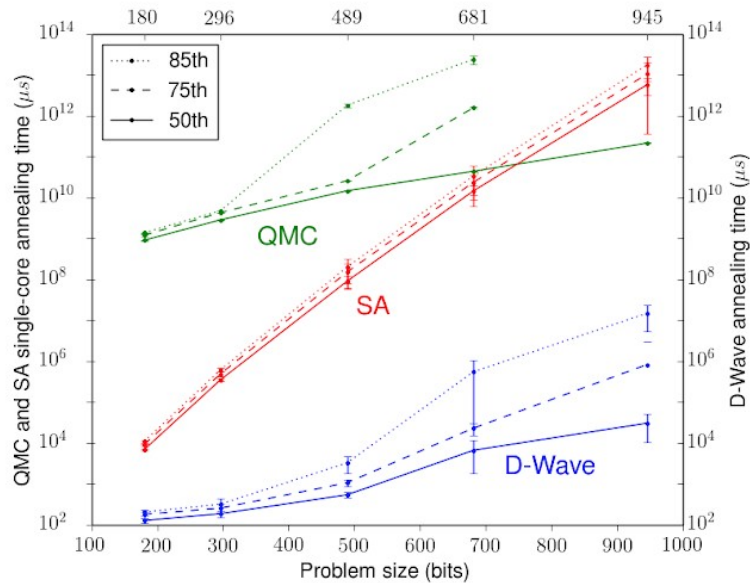
**2014:** Troyer and co-workers (ETH) show numerical evidence of quantum annealing with 108 qubits

*But.. can also 'simulate classically' the whole process via Quantum Monte Carlo Simulations..*



# First steps towards quantum annealing

<http://arxiv.org/abs/1512.02206> → Google responds with D-wave 2X...



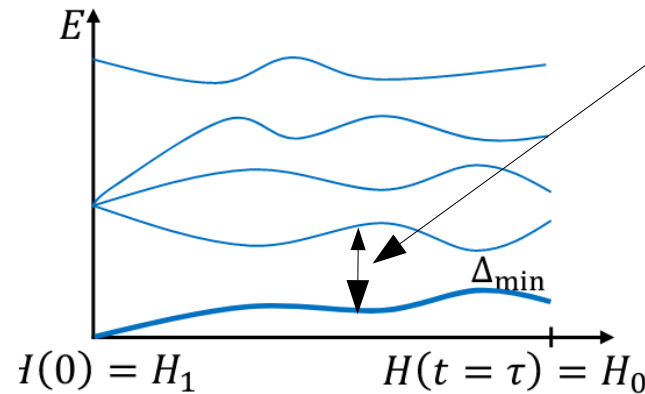
D-wave is promising, but are there **fundamental limitations...**



# Limitation of quantum annealing: quantum-phase transitions

<https://arxiv.org/pdf/1903.06559.pdf>

**Adiabatic condition for a quantum Annealer:**  $\tau \gg \max_{0 \leq s \leq 1} \frac{\left| \langle 1(s) | \frac{d\tilde{H}(s)}{ds} | 0(s) \rangle \right|}{\Delta_{1,0}(s)^2}$ . ( $t = s\tau$ )



Instantaneous 'gap'

→ Performance of quantum annealing are governed by the size of the gap'

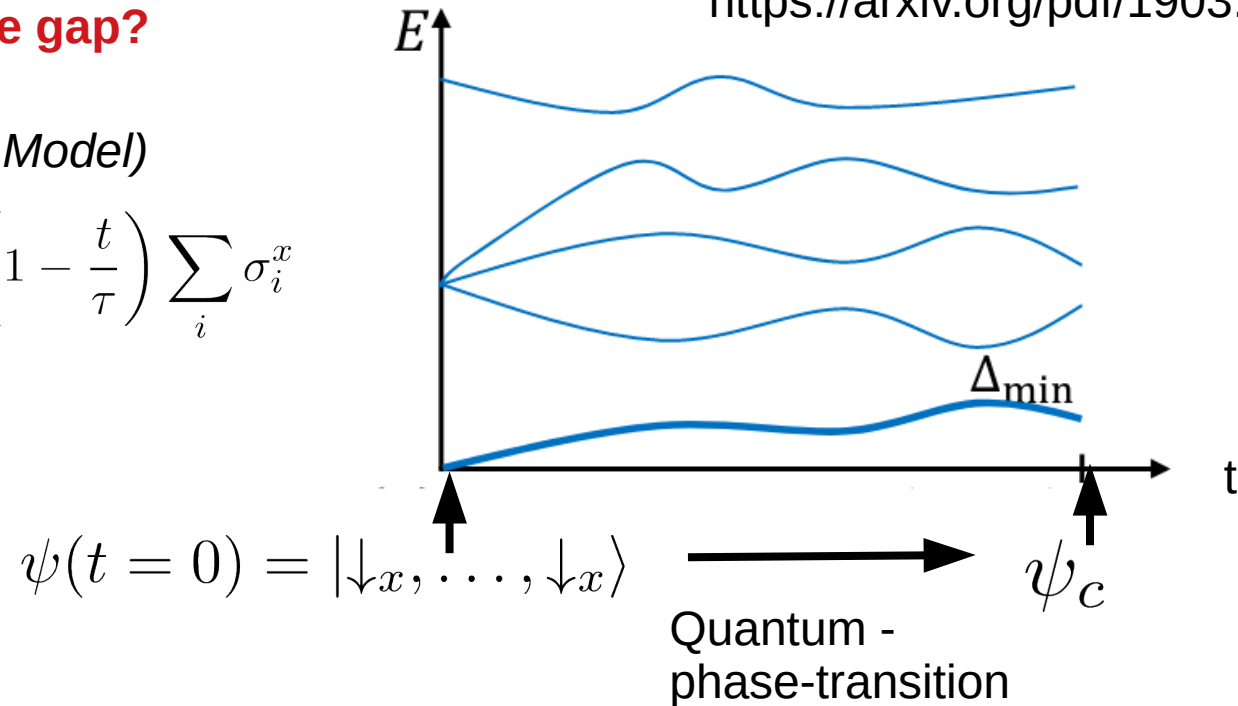
# Limitation of quantum annealing: quantum-phase transitions

What is the size of the gap?

(Transverse Ising Model)

$$H(t) = \left(\frac{t}{\tau}\right) H_C + \left(1 - \frac{t}{\tau}\right) \sum_i \sigma_i^x$$

<https://arxiv.org/pdf/1903.06559.pdf>



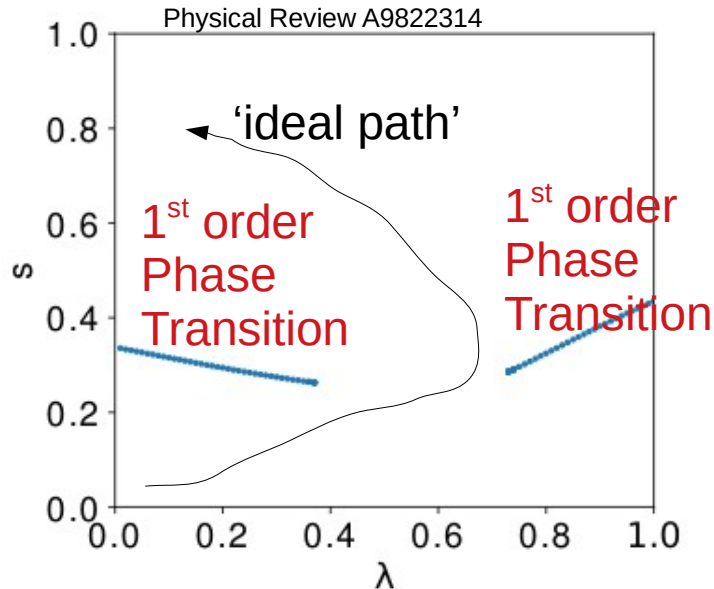
**First order phase transition:** gaps closes exponentially with system size → **HARD PROBLEM**

**Second-order phase transition:** polynomial closure → **DOABLE**

# Limitation of quantum annealing: quantum-phase transitions

## Current efforts:

**Solution (1)** Try to avoid first order phase transitions



Extra-control parameter  $\rightarrow H(s, \lambda)$

**Solution (2)** Go beyond adiabaticity: Quantum Approximate Optimization Algorithm (QAOA)

# The quantum approximate optimization algorithm (E. Farhi 2014)

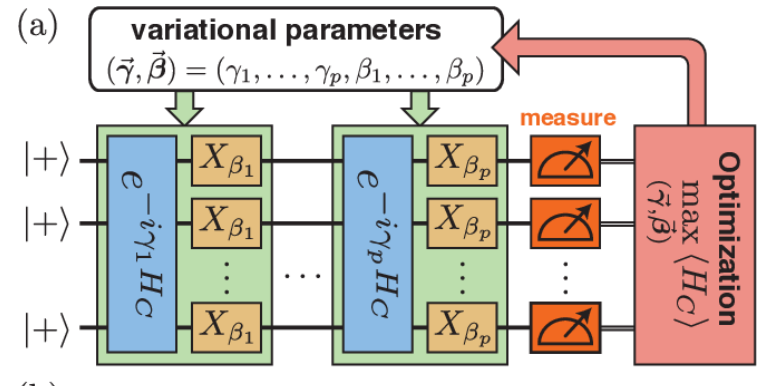
**Problem** (ex: Maxcut)  $H_C$

**Step 1:** Build a candidate for the solution via a quantum device

$$\psi = \prod_{j=1}^{\eta} e^{i\alpha_j H_C} e^{i\beta_j \sum_i \sigma_i^x} |0000000\rangle$$

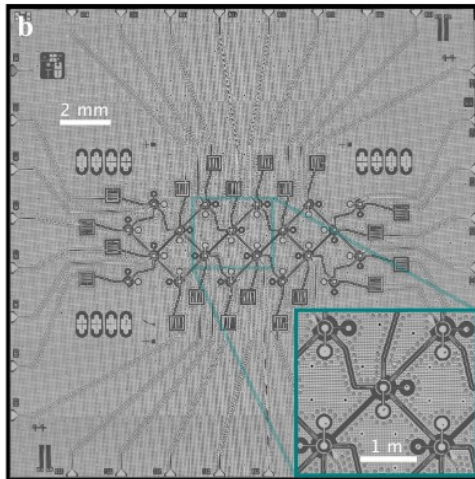
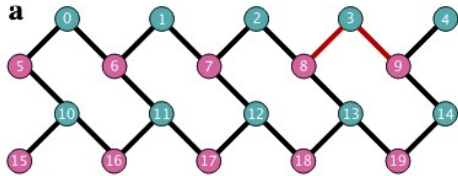
**Step 2:** Measure the cost-function  $\langle \psi | H_C | \psi \rangle$

**Step 3:** Feed the result into a classical optimization algorithm and try **Step 1** with new parameters  $(\alpha_j, \beta_j)$

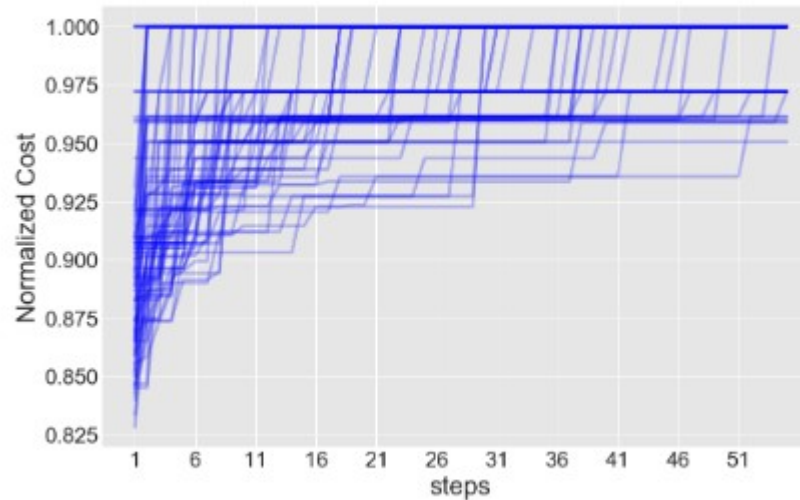


The quantum device is used for 'fast' evaluation of a cost function, exploring many quantum paths

# The quantum approximate optimization algorithm (E. Farhi 2014)



**Example: Rigetti** <https://arxiv.org/pdf/1712.05771.pdf>



**Quantum annealing** → **QAOA**: Promising for classical problems (ex: Max-Cut)  
Can we solve **quantum** problems?

# Solving quantum problems with quantum computers

Nature Communications volume 5, Article number: 4213 (2014)

## 1) Quantum Chemistry

**Goal:** Find Ground-State configuration of a molecule

$$\mathcal{H}(R) = \sum_{pq} h_{pq}(R) \hat{a}_p^\dagger \hat{a}_q + \sum_{pqrs} h_{pqrs}(R) \hat{a}_p^\dagger \hat{a}_q^\dagger \hat{a}_r \hat{a}_s$$

Electron creation operator

$$h_{pq} = \int dr \chi_p(r)^* \left( -\frac{1}{2} \nabla^2 - \sum_{\alpha} \frac{Z_{\alpha}}{|r_{\alpha} - r|} \right) \chi_q(r)$$

Single-electron orbital

(2)

$$h_{pqrs} = \int dr_1 dr_2 \frac{\chi_p(r_1)^* \chi_q(r_2)^* \chi_r(r_1) \chi_s(r_2)}{|r_1 - r_2|}$$

Coulomb-term

(3)

# Solving quantum problems with quantum computers

## Translating quantum chemistry for quantum computers

Nature Communications volume 5, Article number: 4213 (2014)

$$\mathcal{H}(R) = \sum_{pq} h_{pq}(R) \hat{a}_p^\dagger \hat{a}_q + \sum_{pqrs} h_{pqrs}(R) \hat{a}_p^\dagger \hat{a}_q^\dagger \hat{a}_r \hat{a}_s$$

**Step 1:** Expression the Hamiltonian has a qubit Hamiltonian: **Jordan-Wigner Transformation**

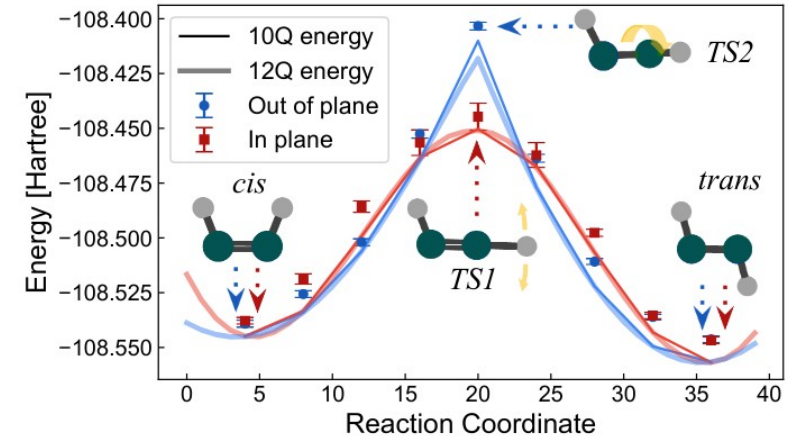
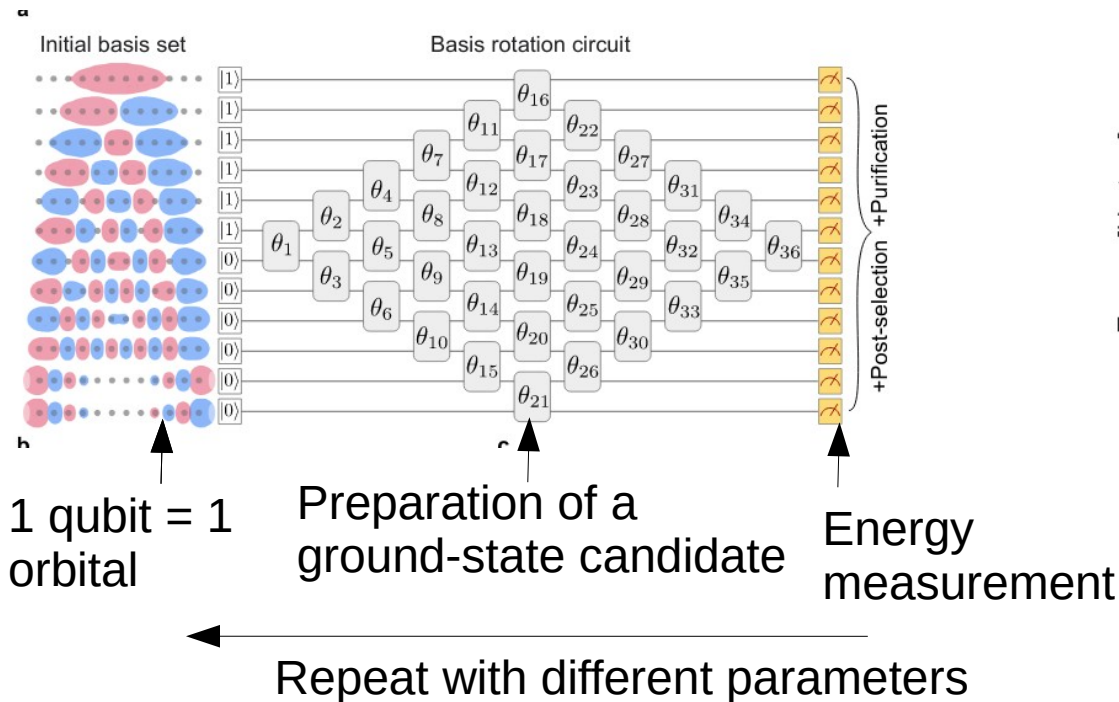
$$\begin{aligned}\hat{a}_j &\rightarrow I^{\otimes j-1} \otimes \sigma_+ \otimes \sigma_z^{\otimes N-j} \\ \hat{a}_j^\dagger &\rightarrow I^{\otimes j-1} \otimes \sigma_- \otimes \sigma_z^{\otimes N-j}\end{aligned}$$

**Step 2:** Find the ground-state by quantum-approximate-optimization-algorithm (In this context, it's called **Variational Quantum Eigensolver (VQE)**)

# Solving quantum problems with quantum computers

## Illustration with Google's Sycamore

<https://arxiv.org/pdf/2004.04174.pdf>





# Conclusions on quantum optimization

	<b>Quantum annealing</b>	<b>Quantum Approximate-Optimization Algorithm</b>	<b>Variational Quantum Eigensolver</b>
<b>Typical Problem:</b>	Classical	Classical	Quantum
<b>Limitations:</b>	Scaling of the Gap	?	?

Can we solve other quantum problems?

# Lecture 4

Quantum algorithms beyond the circuit model  
Quantum optimization - **Quantum simulation**

# Quantum Simulators

A quantum machine that could imitate any quantum system, including the physical world



*Richard Feynman*

**Quantum Simulation:** Simulation of real quantum systems by implementing the relevant Hamiltonian (in contrast to VQE)

**Applications :** High-Tc superconductivity, High-energy Physics, Frustrated magnetism, Topological materials, etc

# Quantum Simulators

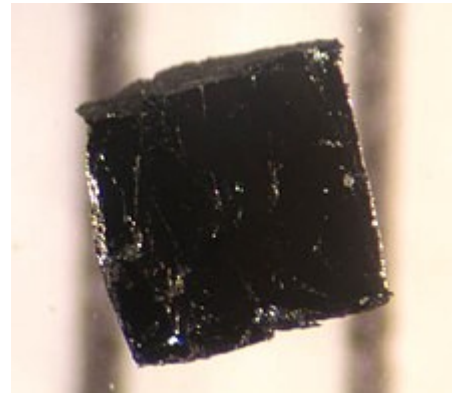
**First approach:** Analog quantum simulation

→ Physically realize a Hamiltonian (without a quantum computer)

**Example: Hubbard Model**

$$\hat{H} = -t \sum_{i,\sigma} \left( \hat{c}_{i,\sigma}^\dagger \hat{c}_{i+1,\sigma} + \hat{c}_{i+1,\sigma}^\dagger \hat{c}_{i,\sigma} \right) + U \sum_i \hat{n}_{i\uparrow} \hat{n}_{i\downarrow},$$

- Model dynamics of valence electrons in solids
- Cannot be solved numerically in many cases
- Candidate to explain high-Tc superconductivity



# Quantum Simulators

## Solving the Hubbard Model via analog quantum simulation with ultra-cold atoms

Physical Review Letters 81 (15), 3108 (1998)

$$\hat{H} = -t \sum_{i,\sigma} \left( \hat{c}_{i,\sigma}^\dagger \hat{c}_{i+1,\sigma} + \hat{c}_{i+1,\sigma}^\dagger \hat{c}_{i,\sigma} \right) + U \sum_i \hat{n}_{i\uparrow} \hat{n}_{i\downarrow},$$

**Idea:** Map electrons → Fermionic ultracold atoms (ex Li<sup>6</sup>)

Laser cooling → Quantum degenerate Fermi Gas

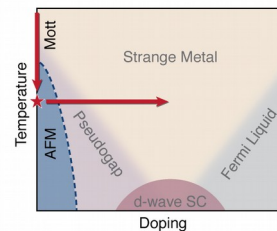
Laser trapping → Optical lattice

Interactions → Atomic collisions

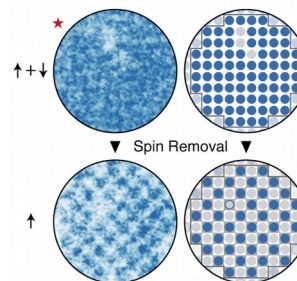
Readout → Microscope

Result match, *so far*, with theory  
without need for quantum error correction

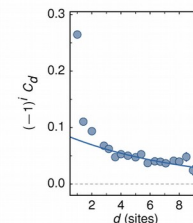
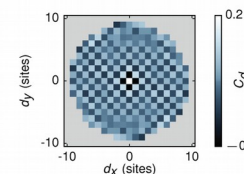
The Hubbard Model



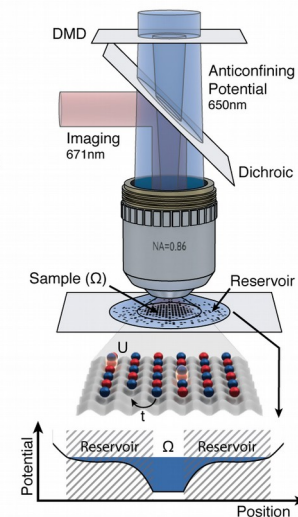
Long-range Antiferromagnet



Spin Correlation Function



Entropy Redistribution



M. Greiner's Lab (Harvard)

# Quantum Simulators via Quantum Computers: Digital Quantum Simulation

**Step 1:** Mapping to a qubit Hamiltonian  $H$   
(ex: Fermi-Hubbard  $\rightarrow$  Spin via Jordan-Wigner transformation)

**Step 2:** 'Trotterized' time-evolution via qubit gates

$$H = \underbrace{h \sum_i \sigma_i^x}_{H_1} + \underbrace{J \sum_i \sigma_i^z \sigma_{i+1}^z}_{H_2} \quad (\text{Transverse Ising model})$$

—► **Suzuki-Trotter expansion**

$$\psi(t) = e^{-iHt} \psi(0)$$

$$\psi(t) \approx \left( e^{-iH_1(t/n)} e^{-iH_2(t/n)} \right)^n \psi(0)$$

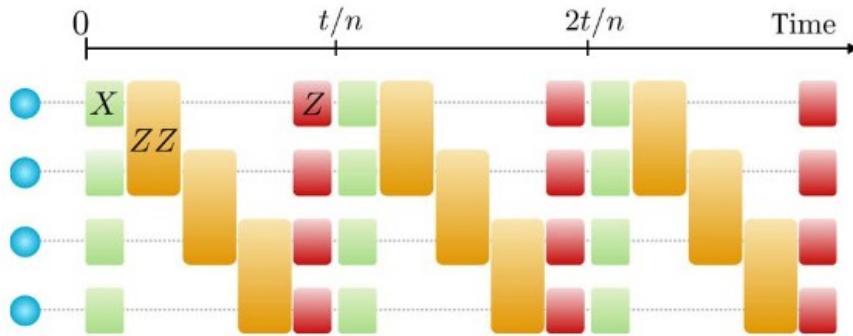
**Error for a finite  $n$  (Lloyd, 1996)**

$$\mathcal{E} \sim \frac{t^2}{n} \|[H_1, H_2]\|$$

—► Requires polynomial time

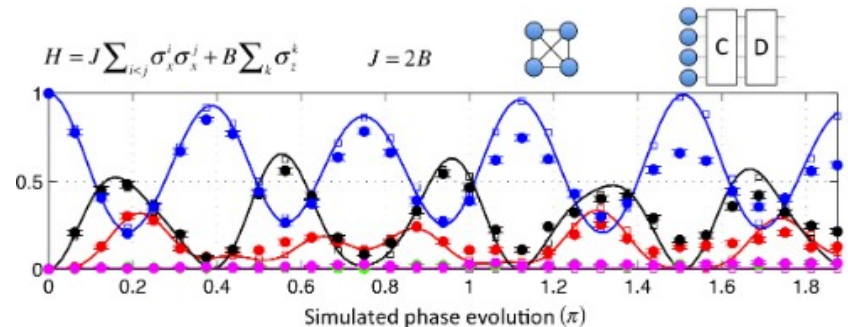
# Quantum Simulators via Quantum Computers: Digital Quantum Simulation

$$H = \underbrace{h \sum_i \sigma_i^x}_{H_1} + \underbrace{J \sum_i \sigma_i^z \sigma_{i+1}^z}_{H_2} \longrightarrow \psi(t) \approx \left( e^{-iH_1(t/n)} e^{-iH_2(t/n)} \right)^n \psi(0)$$



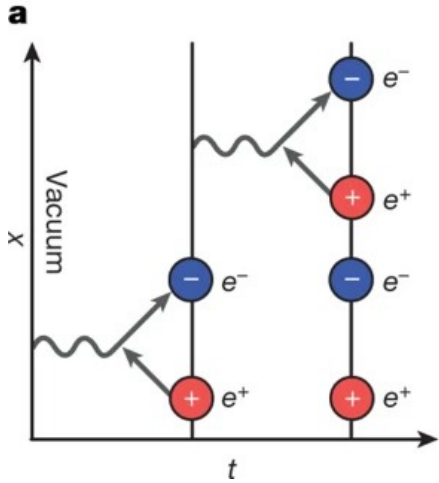
Sci. Adv.2019;5

## Experimental demonstration with trapped ions (Lanyon 2011)



# Quantum Simulation of high-energy physics phenomena

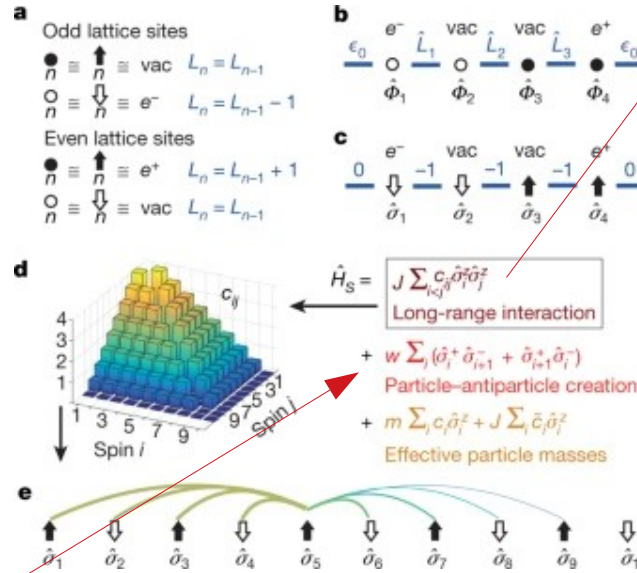
**Illustration:** Nature volume 534, pages516–519(2016)



**Swinger Model**  
(1 dimensional quantum-electro dynamics)

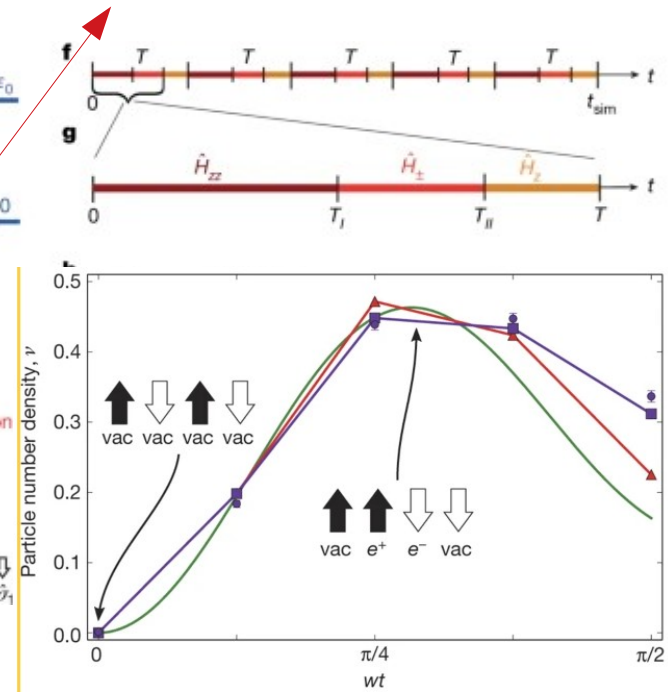
$$\hat{H}_{\text{lat}} = -iw \sum_{n=1}^{N-1} [\hat{\Phi}_n^\dagger e^{i\theta_n} \hat{\Phi}_{n+1} - \text{h.c.}] + J \sum_{n=1}^{N-1} \hat{L}_n^2 + m \sum_{n=1}^N (-1)^n \hat{\Phi}_n^\dagger \hat{\Phi}_n$$

Kogut–Susskind fermions



**Jordan-Wigner transformation**

**Digital quantum simulation**





# Summary: Quantum algorithms

- **Quantum computers do exist** and implement quantum circuits, following the dream of Feynman
- There are **quantum algorithms** that offer quantum speedup (Grover, Shor, etc)
- **Quantum error correction**: conceptually `solved`, technical challenges
- New quantum algorithms that do not rely necessarily on quantum error correction: **Quantum optimization/Quantum simulation**

→ *Quantum information meets many-body physics!*

**A very active research field, many developments expected in the next year!  
(talents needed)**

