



# Introduction to Quantum Computing

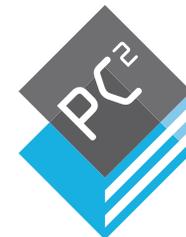
**Dr. Robert Schade**

HPC-Advisor

Paderborn Center for Parallel Computing

Paderborn University

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# Introduction to Quantum Computing



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1. Qubits, States and Complexity
2. Challenges in Practice
3. An Interesting Algorithm for an HPC Workload
4. Outlook

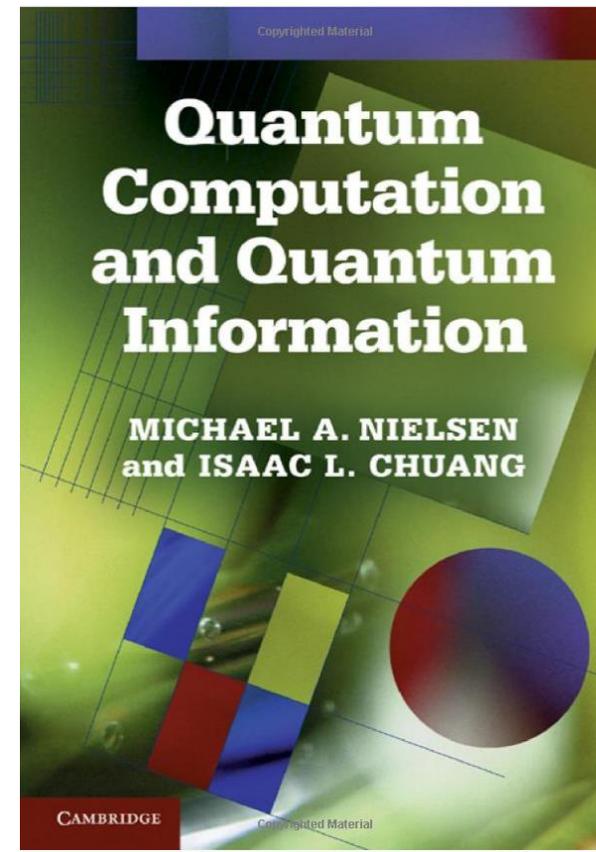
# Introduction to Quantum Computing



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## Disclaimers:

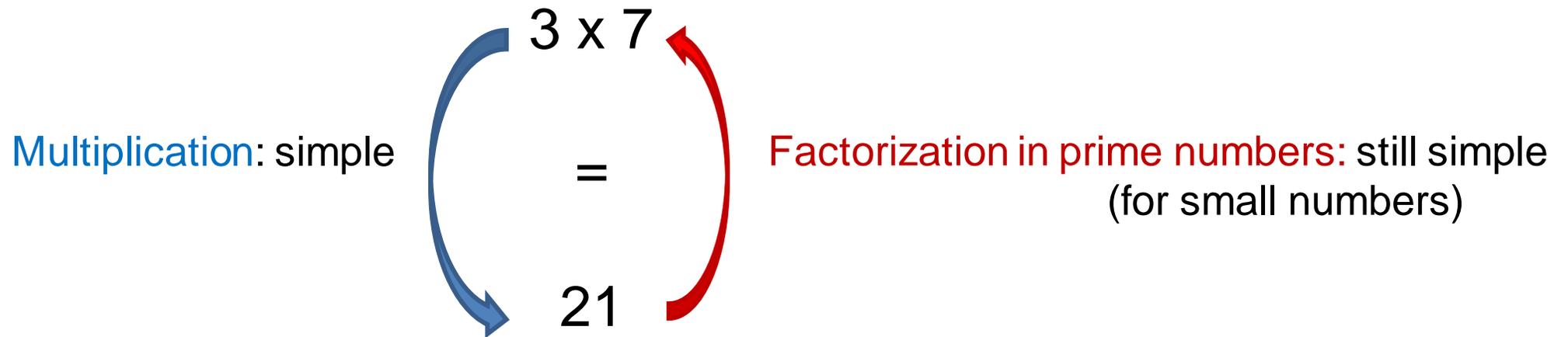
- I'm a **theoretical** physicist/chemist, so not a lot about experiments.
- This talk is very short, I had to throw in many grains of salt!
- This talk is focussed on **gate-based quantum computers** (Google, IBM,... but not D-Wave).
- **Great book:** Quantum Computation and Quantum Information, (Nielsen and Chuang)
- Experiments with QC:
  - <https://quantum-computing.ibm.com/>



# Why Quantum Computers?

No efficient classical algorithms are known for many problems:

**Factoring numbers:**



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# Why Quantum Computers?

No efficient classical algorithms are known for many problems:

**Factoring numbers:**

**Multiplication:** simple  
1 ms on a single cpu-core

```
33478071698956898786044169848212690817704794983713768568912
431388982883793878002287614711652531743087737814467999489
      x
36746043666799590428244633799627952632279158164343087642676
032283815739666511279233373417143396810270092798736308917
      =
12301866845301177551304949583849627207728535695953347921973
22452151726400507263657518745202199786469389956474942774063
84592519255732630345373154826850791702612214291346167042921
4311602221240479274737794080665351419597459856902143413
```

$$\in \mathcal{O}(2^k)$$

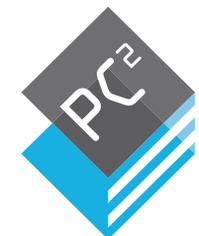
**Factorization in prime numbers:**  
HARD on classical computers!!!

768-bit RSA:

"2000 years of computing on a  
single-core 2.2 GHz AMD Opteron-  
based computer"

(<https://eprint.iacr.org/2010/006.pdf>)

- **BUT:** there is an **efficient quantum algorithm** to factor numbers:  
Shor's Algorithm by Peter Shor (*SIAM J. Comput.*, 26(5), 1484–1509., 1994)  
Complexity:  $\in \mathcal{O}(k^3)$



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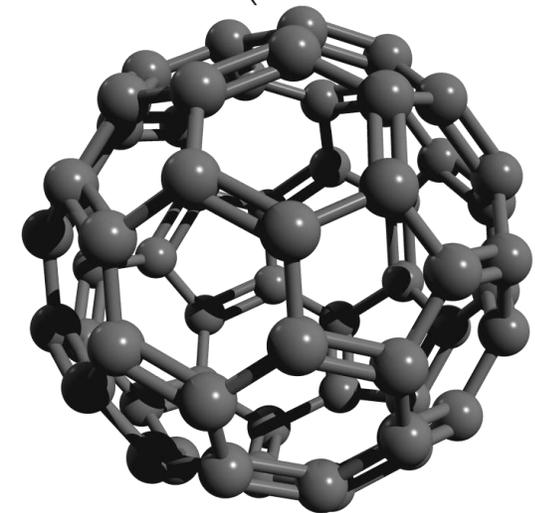
# Why Quantum Computers?

No efficient classical algorithms are known for many problems:  
**Quantum Chemistry, Solid-State Physics,....:**

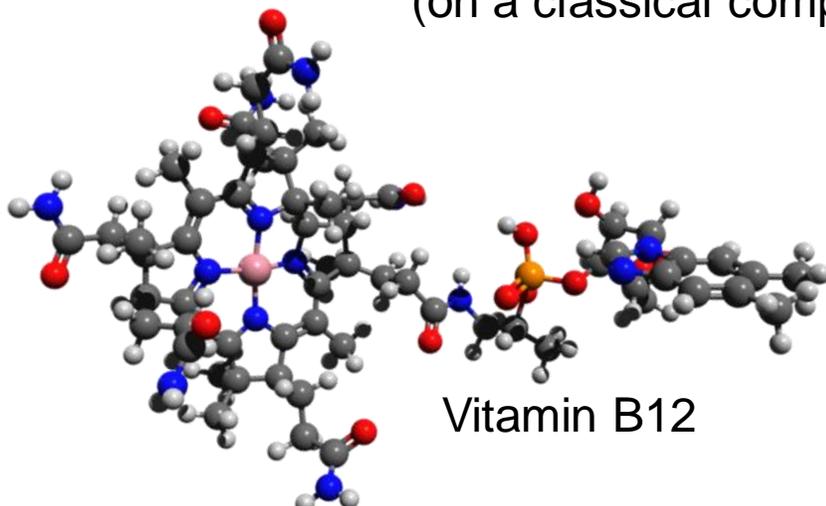
Challenge is to describe **quantum** systems (atoms, molecules, ...)  
on **classical** computers.

$$\left( \sum_i \frac{\hat{p}_i^2}{2m_e} + \sum_A \frac{\hat{P}_A^2}{2M_A} + \frac{1}{2} \sum_{i \neq j} \frac{e^2}{4\pi\epsilon_0 |\hat{r}_i - \hat{r}_j|} + \frac{1}{2} \sum_{A \neq B} \frac{e^2 Z_A Z_B}{4\pi\epsilon_0 |\hat{R}_A - \hat{R}_B|} - \frac{1}{2} \sum_{A,i} \frac{e^2 Z_A}{4\pi\epsilon_0 |\hat{R}_A - \hat{r}_i|} \right) |\Psi(t)\rangle = i\hbar\partial_t |\Psi(t)\rangle$$

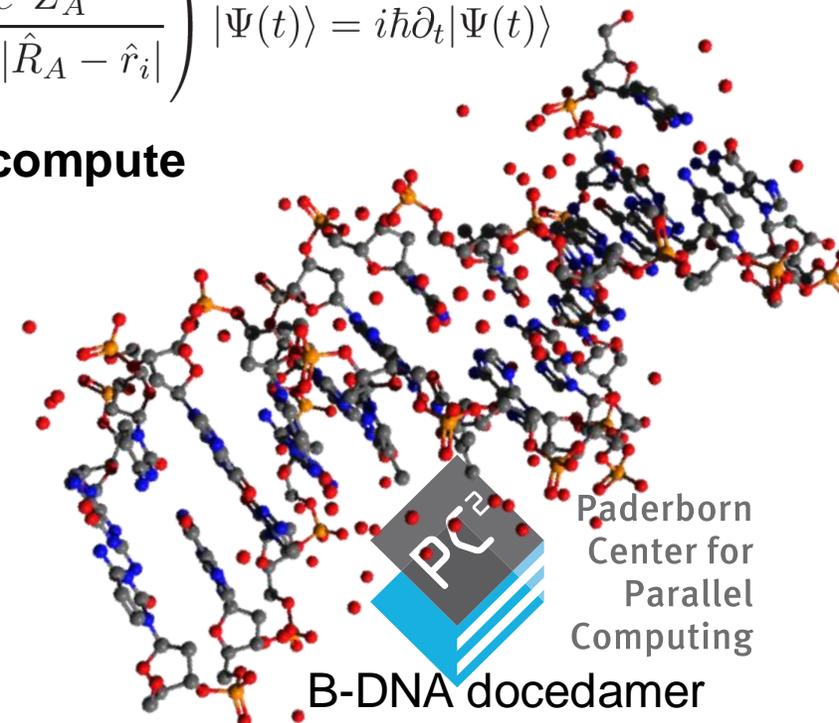
All basic physical laws are known, just **to hard to compute**  
(on a classical computer).



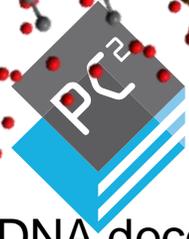
C60 Fullerene



Vitamin B12



B-DNA dodecamer

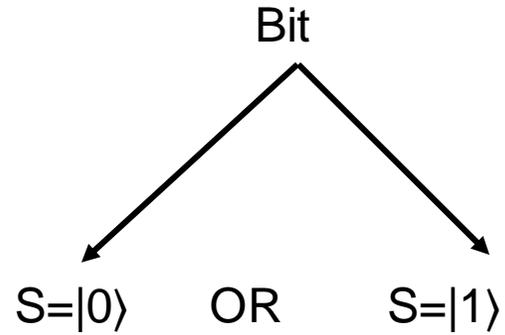


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# Qubits, States and Complexity

## Classical computer

Storage unit:

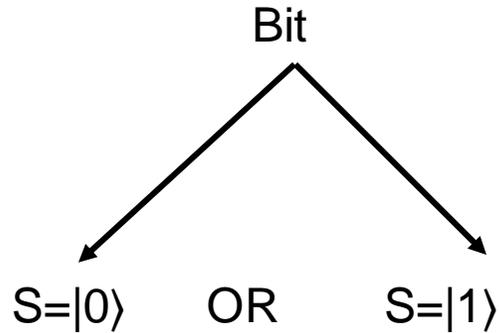


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# Qubits, States and Complexity

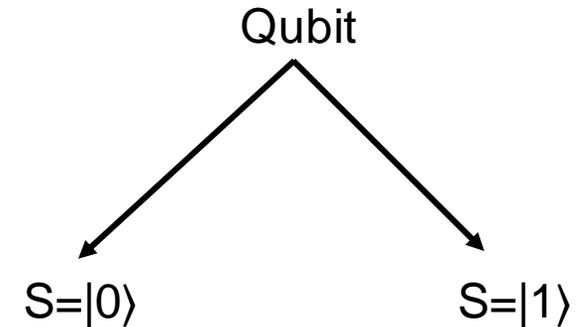
## Classical computer

Storage unit:



## Quantum computer

Storage unit:



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

( $a, b$  complex numbers,  $1=a^2+b^2$ )

A quantum system can be in **more than one** state at a time:

### **Superposition**

$S=|0\rangle + |1\rangle$ :

- system is 50% in state  $|0\rangle$  and 50% in state  $|1\rangle$   
**at the same time!**



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# Superposition

Sketch by Dhatfield

[https://commons.wikimedia.org/wiki/File:Schrodingers\\_cat.svg](https://commons.wikimedia.org/wiki/File:Schrodingers_cat.svg)

$S=|0\rangle + |1\rangle$ :

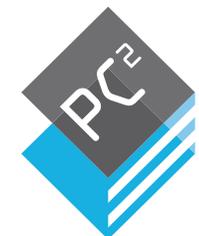
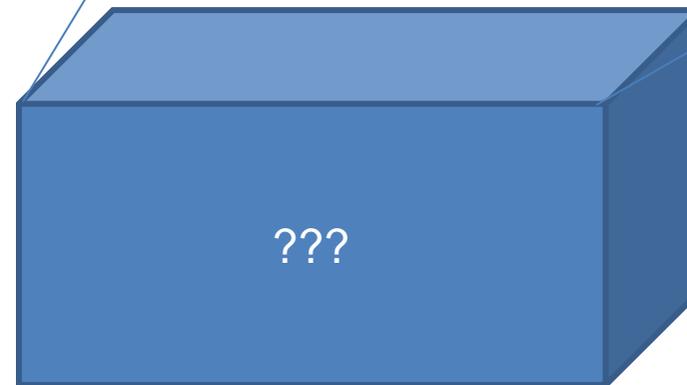
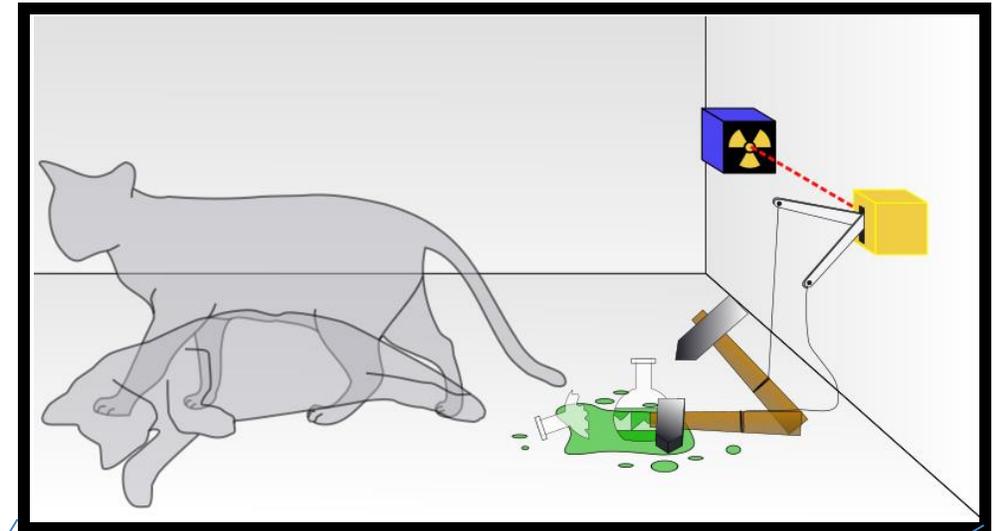
- system is 50% in state  $|0\rangle$  and 50% in state  $|1\rangle$  at the same time!

**Schrodinger's cat (1935):** thought experiment

Imagine a **cat in a closed box** with a poison:

- A random element (e.g. radioactive decay) controls the release of poison
- The cat can be thought of as **dead  $|dead\rangle$  and alive  $|alive\rangle$  at the same time!**

$S_{cat}=|dead\rangle+|alive\rangle$

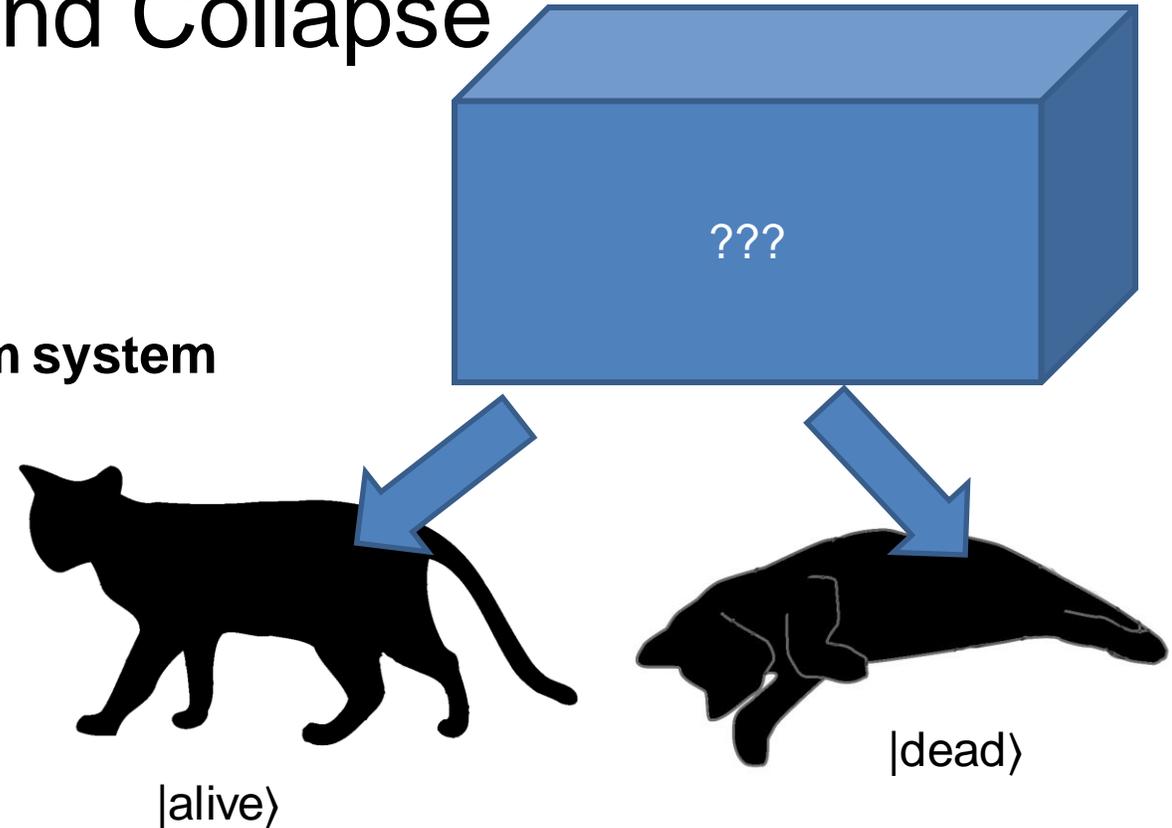


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# Superposition and Collapse

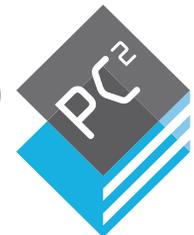
$$S_{\text{cat}} = |\text{dead}\rangle + |\text{alive}\rangle$$

- As long as the box is closed, we don't know.
- When we open the box we **disturb the quantum system and the state collapses:**  
quantum-mechanical measurement



- **We measure**
  - with 50% probability  $|\text{alive}\rangle$
  - with 50% probability  $|\text{dead}\rangle$

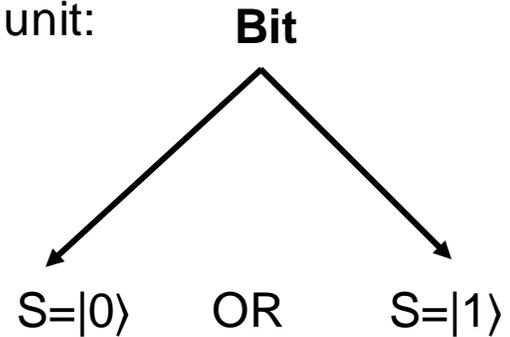
(The collapse of the state is nothing magical, but can be described by quantum decoherence of a system (the box) interacting with the environment.)



# Qubits, States and Complexity

## Classical computer

Storage unit:



**Multiple storage units:** N=8 bits

S=|01011010>="Z"

$2^N=256$  different possibilities

A state is determined by **one integer number**.

Information stored = **N bits**

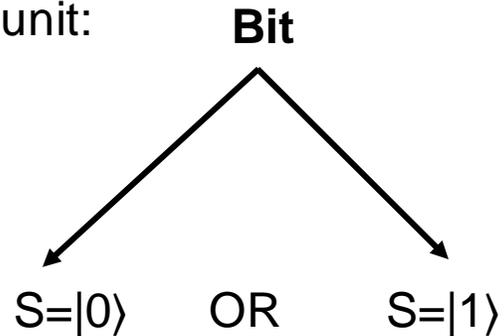
= 64 bit for N=64

## Quantum computer

# Qubits, States and Complexity

## Classical computer

Storage unit:



**Multiple storage units:**  $N=8$  bits

$$S=|01011010\rangle = \text{"Z"}$$

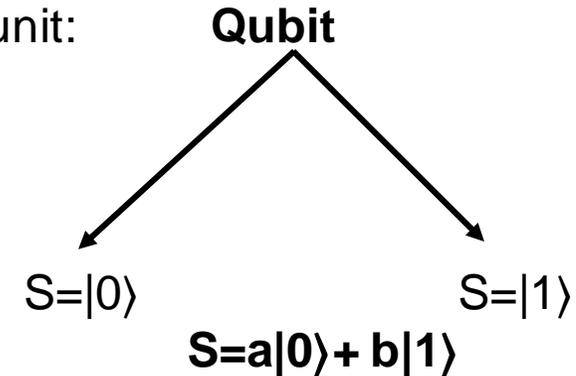
$2^N=256$  different possibilities

A state is determined by **one integer number**.

Information stored = **N bits**  
= 64 bit for  $N=64$

## Quantum computer

Storage unit:



**Multiple storage units:**  $N=8$  Qubits

$$S=a_0|00000000\rangle+a_1|10000000\rangle+a_2|01000000\rangle+a_3|11000000\rangle+\dots$$

A state is determined by an **exponential number ( $2^N$ ) of complex numbers ( $a_0, a_1, \dots$ )**.

Information stored =  **$2^N$  x 128 bit**  
= **295148 PB** for 64 qubits

(assuming 64-bit double precision for the complex numbers)

# Qubits, States and Complexity

Operations on quantum states:

$$S = a|0\rangle + b|1\rangle \quad \xrightarrow{\text{Op}} \quad S' = \text{Op}(S) = a'|0\rangle + b'|1\rangle$$

An operation Op maps  $a, b$  to  $a', b'$

- Can be written as a **unitary transformation**, i.e., a 2x2 matrix  $U$  with  $U^{-1} = (U^T)^*$

$$\begin{pmatrix} a' \\ b' \end{pmatrix} = U \begin{pmatrix} a \\ b \end{pmatrix} = \begin{pmatrix} U_{11} & U_{12} \\ U_{21} & U_{22} \end{pmatrix} \begin{pmatrix} a \\ b \end{pmatrix}$$

**Unitary** ( $U^{-1} = (U^T)^*$ ) because:

- Operation needs to be **reversible**
- Resulting state needs to be **normalized**, i.e.  $a^2 + b^2 = 1 \Rightarrow a'^2 + b'^2 = 1$

Very general, but hard to understand/imagine the operation.

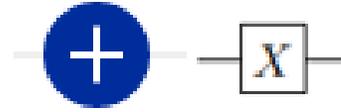


# Qubits, States and Complexity

Operations on quantum states:

**Example: x-gate**

$$U_x = \begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix}$$



$$U_x \begin{pmatrix} a \\ b \end{pmatrix} = \begin{pmatrix} b \\ a \end{pmatrix} \quad \text{or} \quad U_x(a|0\rangle + b|1\rangle) = a|1\rangle + b|0\rangle$$

x-gate "switches" (flips) the qubit from  $|0\rangle$  to  $|1\rangle$  and vice versa.

name	unitary matrix	visual representation
Hadamard gate (h)	$\frac{1}{\sqrt{2}} \begin{pmatrix} 1 & 1 \\ 1 & -1 \end{pmatrix}$	$ q_0\rangle$ — $\boxed{H}$ —
$\sigma_x$ gate (x)	$\begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix}$	$ q_0\rangle$ — $\boxed{X}$ —
$\sigma_y$ gate (y)	$\begin{pmatrix} 0 & -i \\ i & 0 \end{pmatrix}$	$ q_0\rangle$ — $\boxed{Y}$ —
$\sigma_z$ gate (z)	$\begin{pmatrix} 1 & 0 \\ 0 & -1 \end{pmatrix}$	$ q_0\rangle$ — $\boxed{Z}$ —
$R_x$ gate (rx)	$e^{-i\theta\sigma_x/2} = \begin{pmatrix} \cos(\theta/2) & -i \sin(\theta/2) \\ -i \sin(\theta/2) & \cos(\theta/2) \end{pmatrix}$	$ q_0\rangle$ — $\boxed{R_x(\theta)}$ —
$R_y$ gate (ry)	$e^{-i\theta\sigma_y/2} = \begin{pmatrix} \cos(\theta/2) & -\sin(\theta/2) \\ \sin(\theta/2) & \cos(\theta/2) \end{pmatrix}$	$ q_0\rangle$ — $\boxed{R_y(\theta)}$ —
$R_z$ gate (rz)	$e^{-i\theta\sigma_z/2} = \begin{pmatrix} e^{-i\theta/2} & 0 \\ 0 & e^{i\theta/2} \end{pmatrix}$	$ q_0\rangle$ — $\boxed{R_z(\theta)}$ —
phase shift	$e^{i\theta 1} = \begin{pmatrix} e^{i\theta} & 0 \\ 0 & e^{i\theta} \end{pmatrix}$	$ q_0\rangle$ — $\boxed{Ph(\theta)}$ —
rotation gate (u3)	$\begin{pmatrix} e^{-i(\phi+\lambda)/2} \cos(\theta/2) & -e^{-i(\phi-\lambda)/2} \sin(\theta/2) \\ e^{i(\phi-\lambda)/2} \sin(\theta/2) & e^{i(\phi+\lambda)/2} \cos(\theta/2) \end{pmatrix}$	$ q_0\rangle$ — $\boxed{U3(\theta, \phi, \lambda)}$ —
phase gate (s)	$\begin{pmatrix} 1 & 0 \\ 0 & i \end{pmatrix}$	$ q_0\rangle$ — $\boxed{S}$ —
phase gate <sup>†</sup> (sdag)	$\begin{pmatrix} 1 & 0 \\ 0 & -i \end{pmatrix}$	$ q_0\rangle$ — $\boxed{S^\dagger}$ —
swap gate	$\begin{pmatrix} 1 & 0 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 1 \end{pmatrix}$	$ q_0\rangle$ — $\times$ — $ q_1\rangle$ — $\times$ —
CNOT gate (cx)	$\begin{pmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 1 \\ 0 & 0 & 1 & 0 \end{pmatrix}$	$ q_0\rangle$ — $\bullet$ — $ q_1\rangle$ — $\oplus$ —
Toffoli gate (cxx)	$\begin{pmatrix} 1 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 1 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 1 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1 \end{pmatrix}$	$ q_0\rangle$ — $\bullet$ — $ q_1\rangle$ — $\bullet$ — $ q_2\rangle$ — $\oplus$ —

# Qubits, States and Complexity

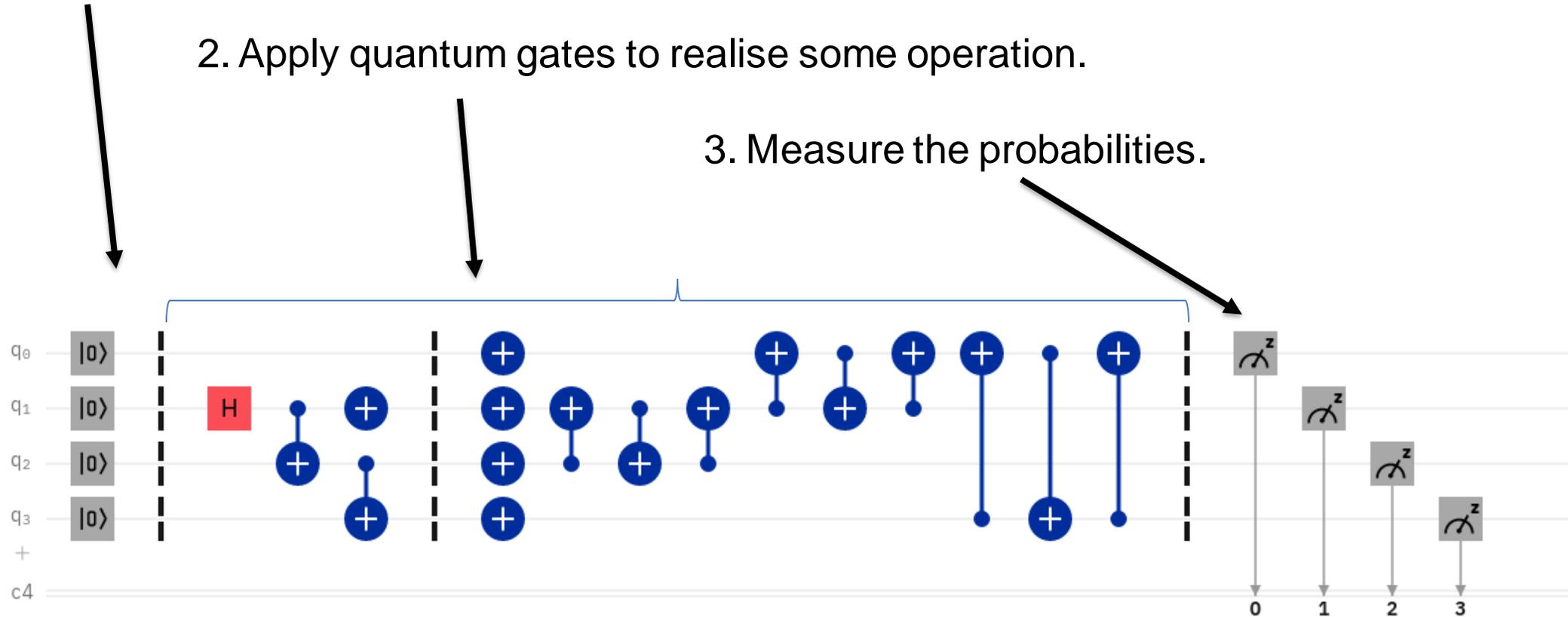
Operations on quantum states of multiple qubits: **Quantum Programs**

**Build program from many small steps (quantum gates).**

1. Start with a well-defined initial state, i.e.,  $S=|00000000\dots\rangle$

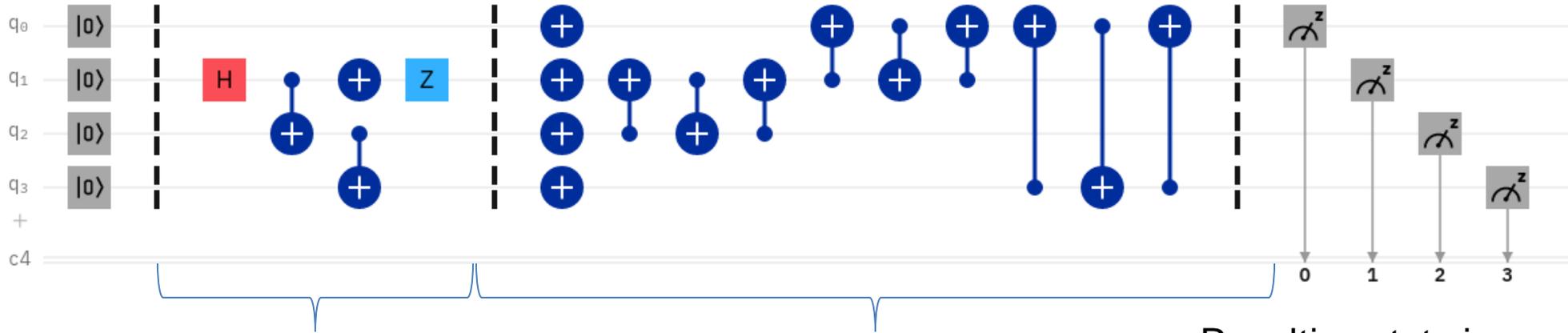
2. Apply quantum gates to realise some operation.

3. Measure the probabilities.



# Qubits, States and Complexity

## Superposition for Computations:



3-qubit entangled state (GHZ-like)  
 $(|0011\rangle - |0100\rangle)/\sqrt{2}$

$(7x) \bmod 15$   
 modular multiplication

Resulting state is  $(|0110\rangle - |1101\rangle)/\sqrt{2}$   
 We measure

- 0110 with 50% probability
- 1101 with 50% probability

state	x	$(7x) \bmod 15$	result
$ 0100\rangle$	4	13	$ 1101\rangle$
$ 0011\rangle$	3	6	$ 0110\rangle$

**Superposition:** apply one operation to many states at once!  
 Inherently parallel!

# Challenges in Practice

- **Basic programming principles** and even some interesting algorithms known for several decades.

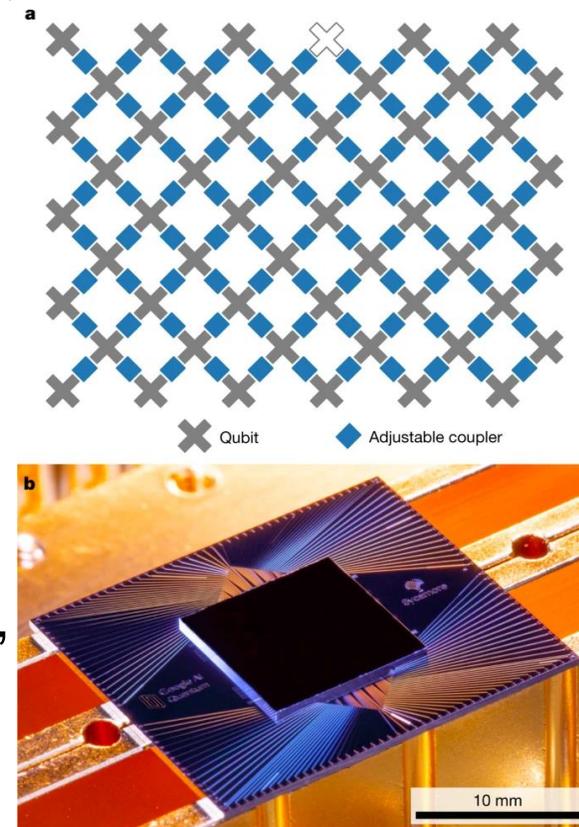
**Requirements** (DiVincenzo, Fortschr. Phys., 48: 771-783. 2000):

1. "a **scalable** physical system with well-characterized quantum-mechanical observables to represent the qubits,"

## Some physical principles of qubits:

- cooper pairs in Josephson junctions (e.g. transmon qubits)
- ions in electromagnetic traps manipulated with laser pulses,
- nuclear spins of molecules manipulated with nuclear magnetic resonance,
- single photons in non-linear optical media

Sycamore quantum computer



# Challenges in Practice

**Requirements** (DiVincenzo, Fortschr. Phys., 48: 771-783. 2000):

2. "a preparation of an **initial qubit state**,"
3. "a controllable unitary evolution with **single qubit-gates** and at least **one type of universal two-qubit gate**"

name	unitary matrix	visual representation
Hadamard gate (h)	$\frac{1}{\sqrt{2}} \begin{pmatrix} 1 & 1 \\ 1 & -1 \end{pmatrix}$	$ q_0\rangle$ —  —
$\sigma_x$ gate (x)	$\begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix}$	$ q_0\rangle$ —  —
$\sigma_y$ gate (y)	$\begin{pmatrix} 0 & -i \\ i & 0 \end{pmatrix}$	$ q_0\rangle$ —  —
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$R_z$ gate (rz)	$e^{-i\theta\sigma_z/2} = \begin{pmatrix} e^{-i\theta/2} & 0 \\ 0 & e^{i\theta/2} \end{pmatrix}$	$ q_0\rangle$ —  —
phase shift	$e^{i\theta 1} = \begin{pmatrix} e^{i\theta} & 0 \\ 0 & e^{i\theta} \end{pmatrix}$	$ q_0\rangle$ —  —
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phase gate† (sdag)	$\begin{pmatrix} 1 & 0 \\ 0 & -i \end{pmatrix}$	$ q_0\rangle$ —  —
swap gate	$\begin{pmatrix} 1 & 0 & 0 & 0 \\ 0 & 0 & 1 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 1 \end{pmatrix}$	$ q_0\rangle$ —  — $ q_1\rangle$ —  —
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# Challenges in Practice

**Requirements** (DiVincenzo, Fortschr. Phys., 48: 771-783. 2000):

4. "**decoherence times** that are much longer than gate-operation times"

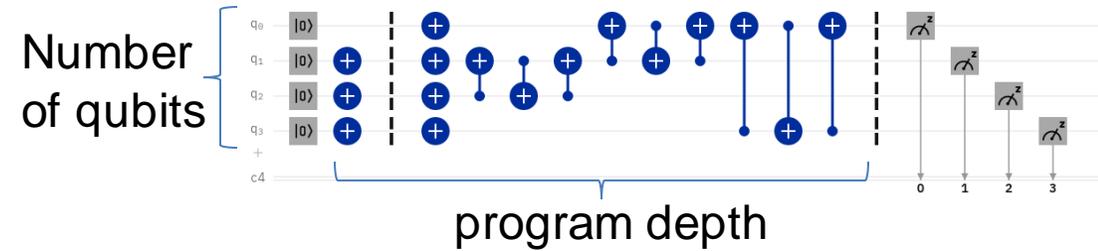
**Decoherence time:** The duration for which the quantum state can keep its **quantum nature**.  
So basically the **time available to compute**.

- Noise from finite temperature
- Noise from external electric and magnetic fields
- Crosstalk between qubits
- .....

# Challenges in Practice

**Requirements** (DiVincenzo, Fortschr. Phys., 48: 771-783. 2000):

4. **decoherence times** that are much longer than gate-operation times



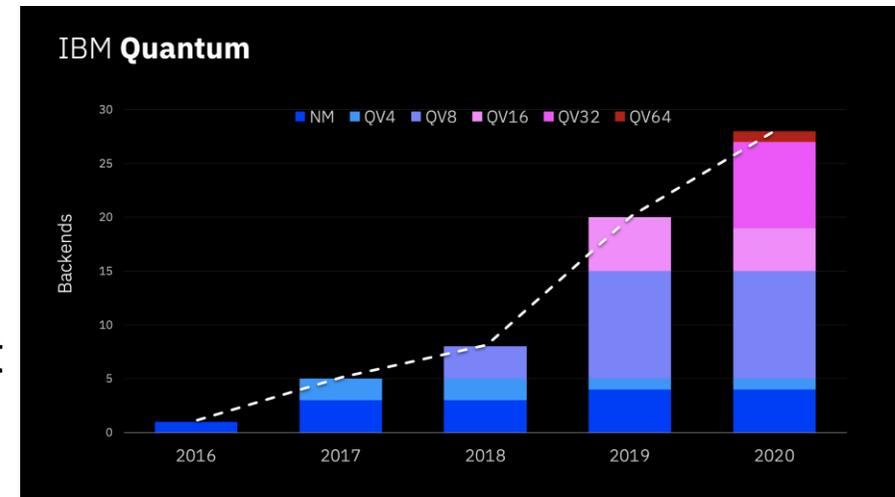
$$V \geq 4 \cdot 11 = 44$$

Power of a QC can be quantified with the **quantum volume V** (Moll, 2017):

- Number of qubits, decoherence times
- gate- and measurement error rates
- Connectivity of qubits

Example (with a grain of salt):

A value of  $V$  means that it can run any program where the product of **program depth and number of qubits** is smaller than  $V$ .



Source: IBM

# An Interesting Algorithm for an HPC Workload

- Initially, most quantum algorithms assumed **perfect quantum computers**.
- Then **quantum error correction** schemes have been developed  
But **many qubits** needed and **long programs**.

New idea in the last ten years:

Simulate a quantum system (e.g. molecules) on quantum computers in a noise-tolerant way.

# An Interesting Algorithm for an HPC Workload

## Quantum computer

New idea in the last ten years:

Simulate a quantum system (e.g. molecules) on quantum computers in a noise-tolerant way.

## **Variational Classical Eigensolvers**

(VASP, CP2K, Gaussian,...)

$$E_{GS} = \min_{\vec{x}} E(\Psi(\vec{x}))$$

i.e. minimize the energy to find the ground state.

\* Note: depending on the level of theory (DFT, CCSD(T),...) the wave functions are single-particle wave functions or many-particle wave functions.

# An Interesting Algorithm for an HPC Workload

## Quantum computer

New idea in the last ten years:

Simulate a quantum system (e.g. molecules) on quantum computers in a noise-tolerant way.

### **Variational Classical Eigensolvers**

(VASP, CP2K, Gaussian,...)

$$E_{GS} = \min_{\vec{x}} E(\Psi(\vec{x}))$$

i.e. minimize the energy to find the ground state.

### **Variational Quantum Eigensolver (VQE)**

(VQE, Peruzzo et. al, 2013)

$$E_{GS} = \min_{\vec{x}} E(\Psi(\vec{x}))$$

i.e. minimize the energy to find the ground state.  
Parameters are optimized on the classical computer.

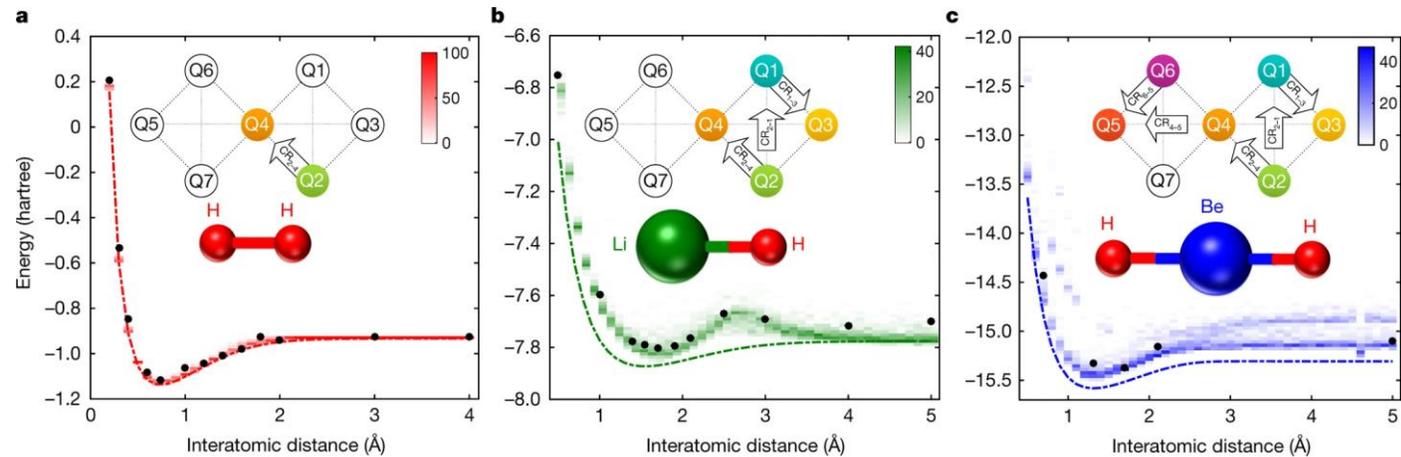
**BUT:** Energy is calculated on the QC!

- automatically compensates crosstalk and shifts
- **noise-tolerant\***
- Even 35-100 qubits can give results that no supercomputer can.

\* Note: depending on the level of theory (DFT, CCSD(T),...) the wave functions are single-particle wave functions or many-particle wave functions.

# An Interesting Algorithm for an HPC Workload

Variational Quantum Eigensolver (VQE, Peruzzo et. al, 2013):



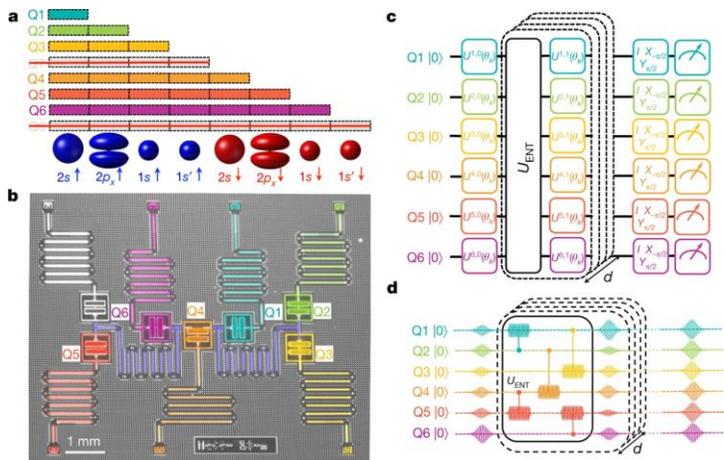
Kandala et. al, [Nature](#) vol. 549, p. 242–246 (2017)

$$E_{GS} = \min_{\vec{x}} E(\Psi(\vec{x}))$$

i.e. minimize the energy to find the ground state.

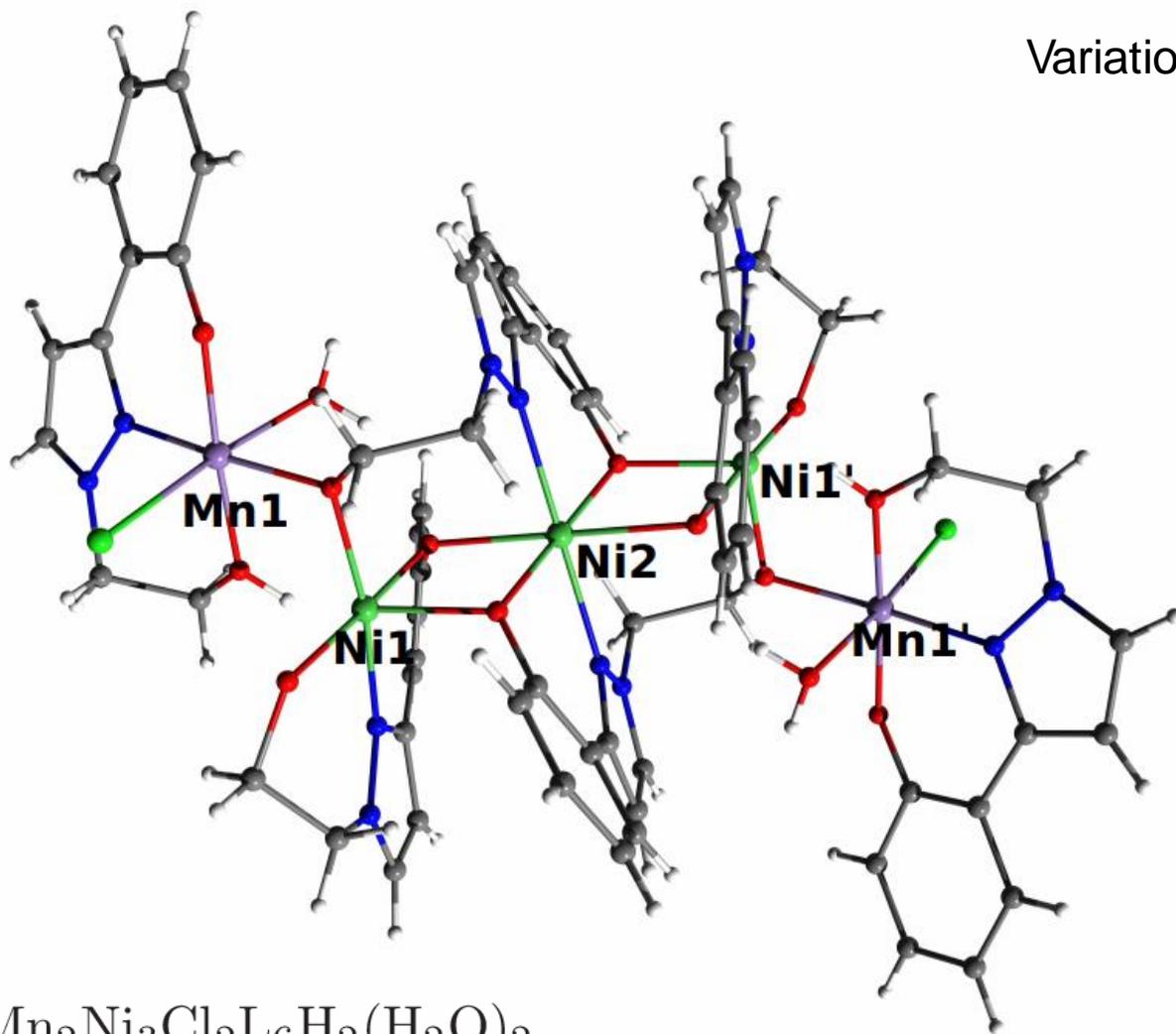
**BUT:** Energy is calculated on the QC!

- automatically compensates crosstalk and shifts
- **noise-tolerant\***
- Even 35-100 qubits can give results that no supercomputer can.



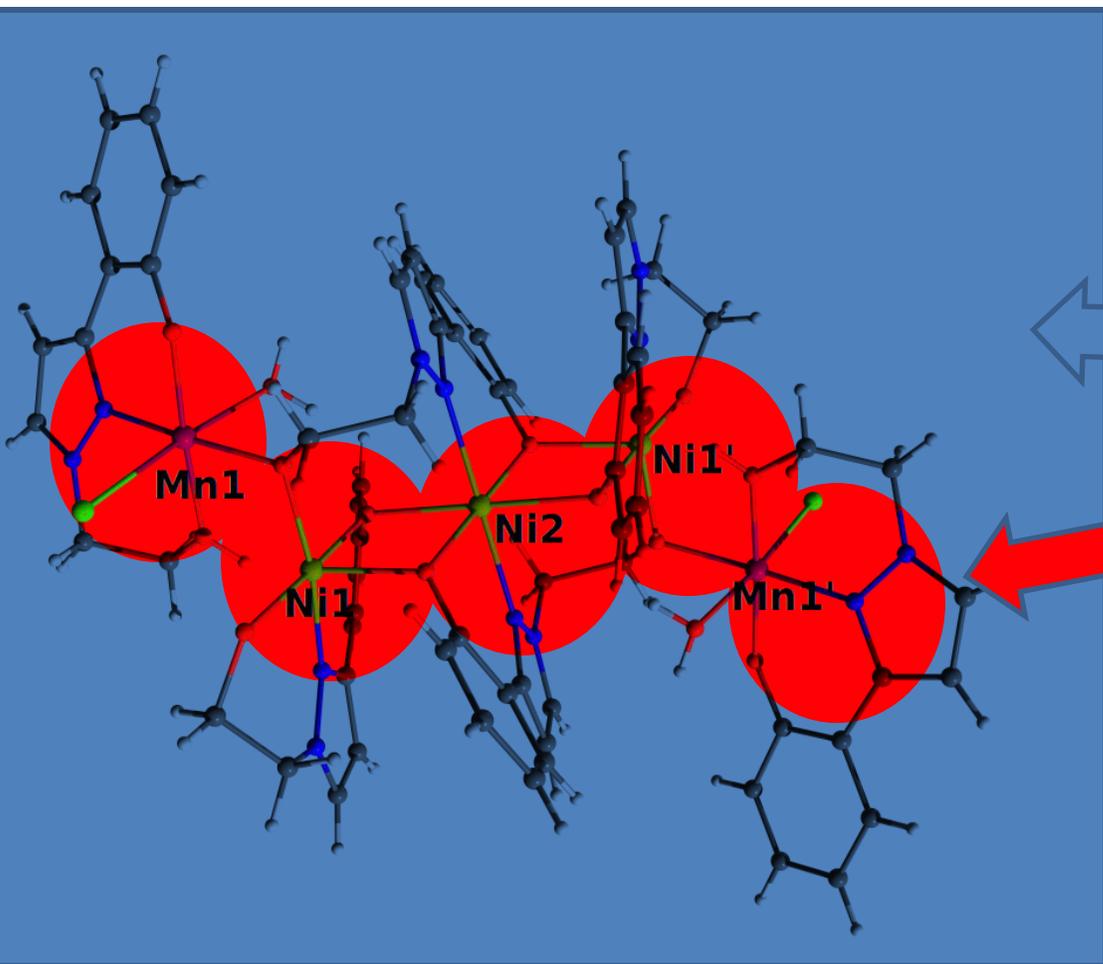
# An Interesting Algorithm for an HPC Workload

Variational Quantum Eigensolver: ~500 qubits required



Das et al., *J. Am. Chem. Soc.* 2011, 133, 10, 3433–3443

# An Interesting Algorithm for an HPC Workload



Variational Quantum Eigensolver: ~500 qubits required

**Idea:** decompose the molecule

**Outer part:** Treated with approx. DFT methods on a classical computer (cubic or linear scaling)

**Inner part:** Treated with VQE-like algorithm on QC requires only ~90 qubits

Decomposition can be performed consistently based on the reduced density-matrix functional

Decomposition: Schade et al, EPJ ST **226**, 2677 (2017)

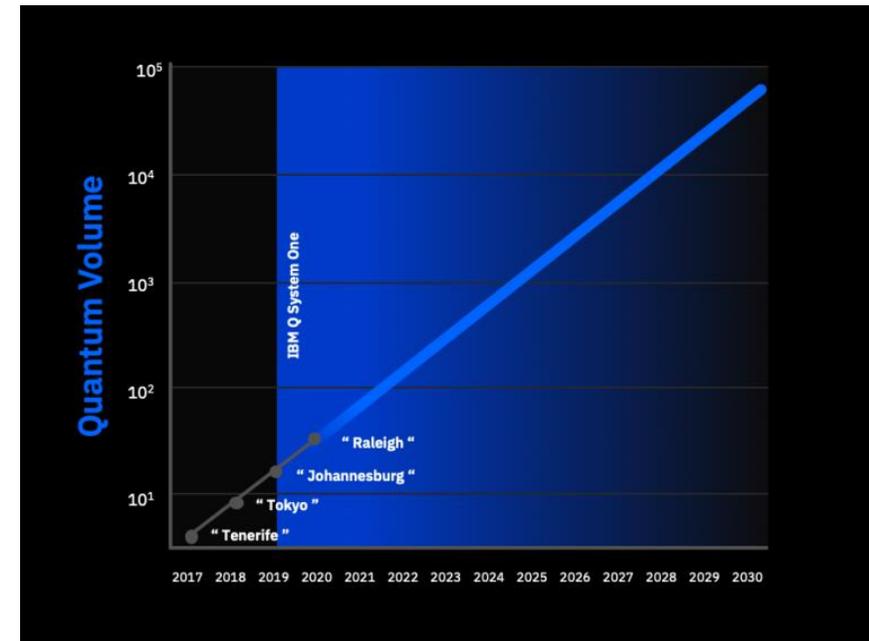
Solution of inner part on QC: Schade et al. in preparation, initial results in 10.5281/zenodo.4022026



Das et al., *J. Am. Chem. Soc.* 2011, 133, 10, 3433–3443

# Outlook

- Hopefully an **exponential increase** in quantum volume.
- An interesting race to increase quantum volume. (Many big players: IBM, Google, Microsoft, Rigetti, ...)
- Thankfully, **post-quantum cryptography** is already well developed.
- Quantum supremacy for useful workloads is only a matter of time.
- Creativity: Many new clever algorithms expected.
- **Chemistry / Physics / Biology:**
  - Most of the algorithmic developments of the last 90 years have to be thrown away.
  - But many new opportunities for hybrid-quantum-classical algorithms.
  - Probably some real HPC workloads run on QCs by 2030.
- Unfortunately a lot of buzzword-bingo to come: "Quantum AI"



Source: <https://www.ibm.com/blogs/research/2020/01/quantum-volume-32/>