

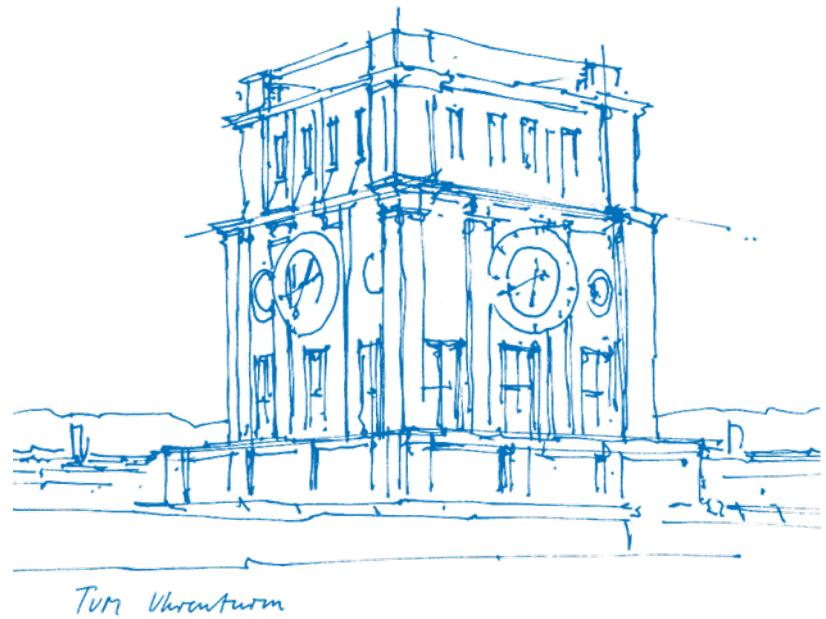
Introduction to Quantum Computing (IN2381)

Prof. Dr. Christian B. Mendl

Technische Universität München

Department of Informatics 5

November 2, 2020



Course organization

- People:

Prof. Dr. Christian B. Mendl	lecture
M.Sc. Irene López Gutiérrez	tutorial
M.Sc. Keefe Huang	tutorial

- Moodle: <https://www.moodle.tum.de/course/view.php?id=57976>
- Course will be offered using online video lectures, both an on-campus and a recorded tutorial, a script, the Nielsen and Chuang textbook, homework exercises and online exchange (see Moodle)
- Topics:
 - Introduction to quantum mechanics
 - Bell inequalities
 - Quantum circuits and algorithms
 - Quantum error correction
- Final exam: planned as on-campus written exam
- Grade bonus: 1 “*Notenstufe*” (+0.3 or +0.4) for 60% of appropriately solved (“sinnvoll bearbeitete”) homework exercises (excluding failed exams and better than 1.0)
- Groups of up to 3 people allowed to hand in homework solutions (via Moodle)
(please only hand in one solution for the whole group)

Quantum mechanics

Fundamental physical theory describing behavior of atoms, electrons and other elementary particles
 (But: general relativity not taken into account \rightsquigarrow area of active research)

Handwritten notes and diagrams include:

- $E_{\text{photon}} = hf = h\frac{c}{\lambda}$
- $K_{\max} = eV_{\text{stop}}$
- $|\Psi(x, y, z)|^2 dV$
- $\Delta x \cdot \Delta p > h$
- $\frac{d^2\Psi}{dx^2} + \frac{8\pi^2 m}{h^2} [E - U] \Psi = 0$
- $\Delta x \cdot \Delta p \geq h$
- $U(x) = 0$
- $\lambda_{\text{particle}} = \frac{\hbar}{P}$
- $\Delta x > \lambda$
- $\Delta p > \frac{h}{\lambda}$
- $E = \frac{P^2}{2m}$
- $b = \sqrt{\frac{8\pi^2 m (U_0 - E)}{h^2}}$
- A diagram of a cathode ray tube showing "Incident light" hitting an "Emitter (E)" and "Photoelectrons" hitting a "Collector (C)".
- $V_{\text{stop}} = \frac{h}{e} f - \frac{\phi}{e}$
- $V(r) = -\frac{1}{4\pi\epsilon_0} \frac{e^2}{r}$
- Diagrams of atomic orbits and wave functions.

Source: <http://timesslate.com/2019/06/21/machine-assimilation-reveals-mysteries-of-quantum-physics/>

Quantum theory and computing: a short history (1)

- 1900 Max Planck: energy quantization, invented as mathematical tool to describe black body radiation:

$$E = nh\nu, \quad n \in \mathbb{N}, \quad h: \text{Planck's constant}, \quad \nu: \text{frequency}$$

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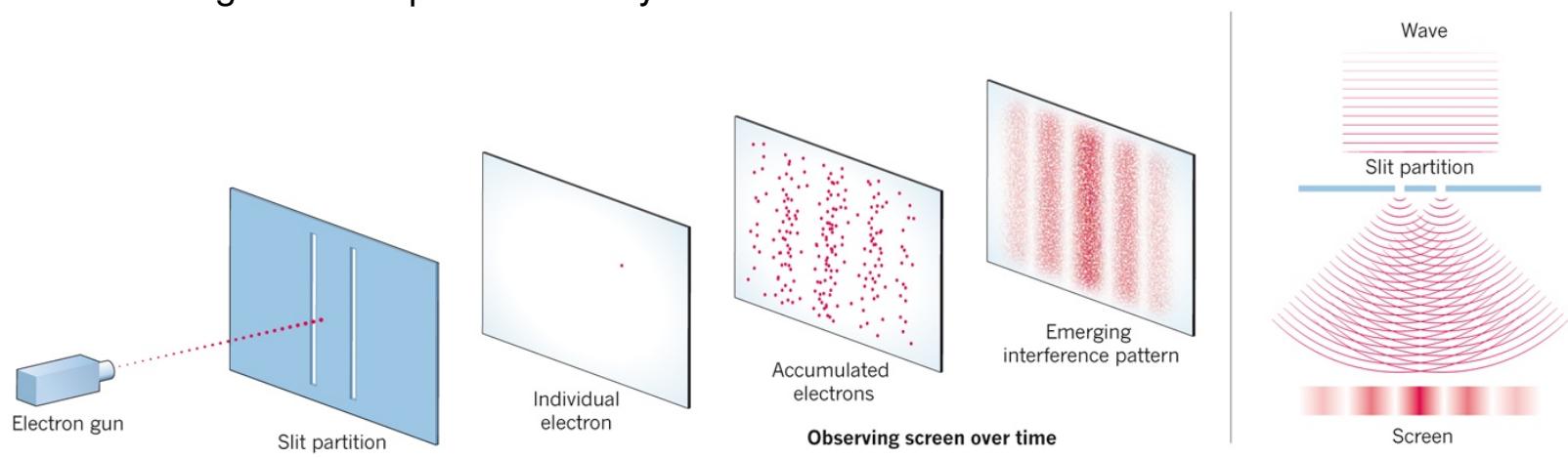
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- 1924 Louis de Broglie: wave–particle duality of matter



Quantum theory and computing: a short history (2)

- 1925 Erwin Schrödinger: Schrödinger equation for the wave function Ψ of a quantum-mechanical system:

$$i\hbar \frac{d}{dt} |\Psi(t)\rangle = \hat{H} |\Psi(t)\rangle$$

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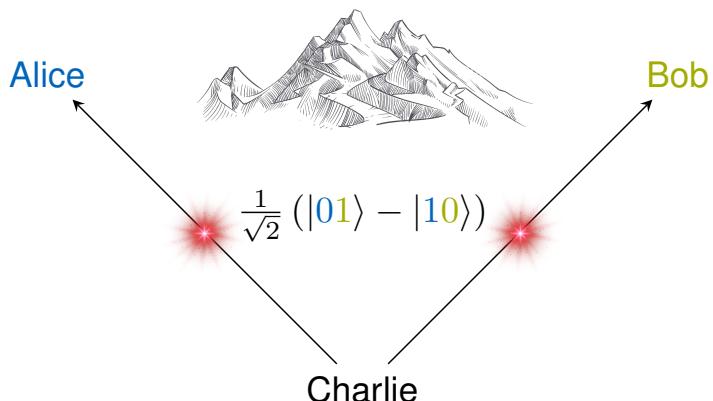
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- 1935 Einstein, Podolsky, Rosen: EPR paradox: “spooky action at a distance” due to quantum entanglement (~ Bell’s inequality)



Quantum theory and computing: a short history (3)

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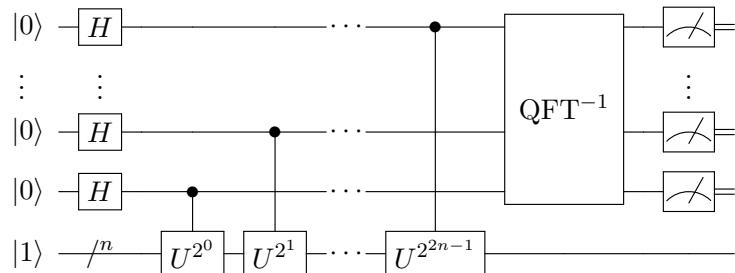
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- 1994 Peter Shor: Shor’s algorithm for integer factorization
(\rightsquigarrow highly relevant for public-key cryptography)



Quantum theory and computing: a short history (4)

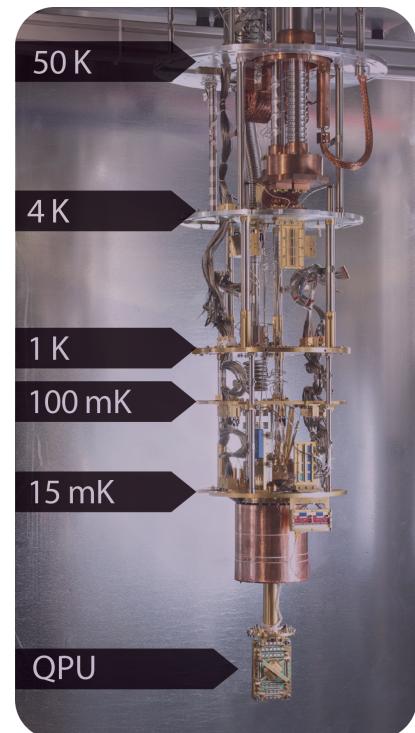
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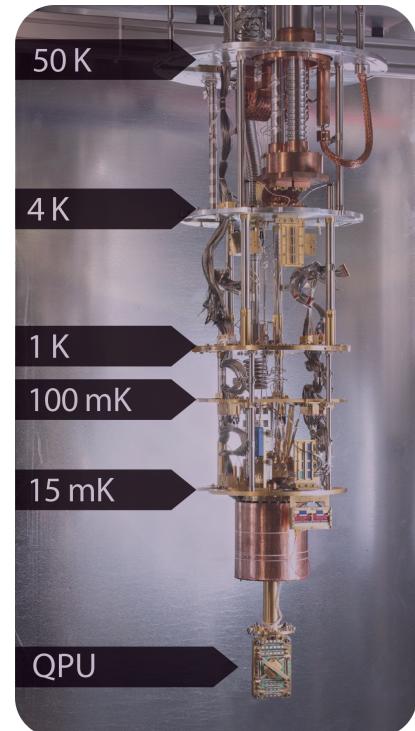
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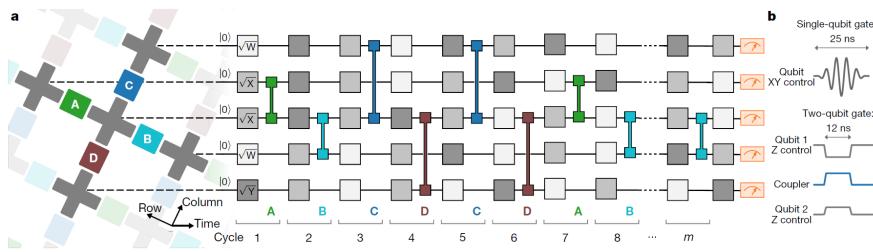
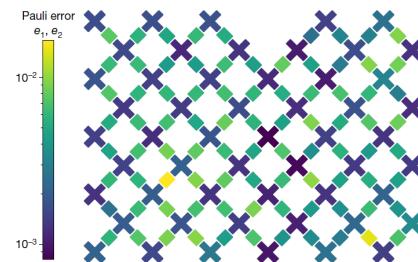
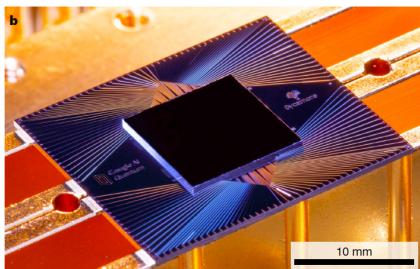
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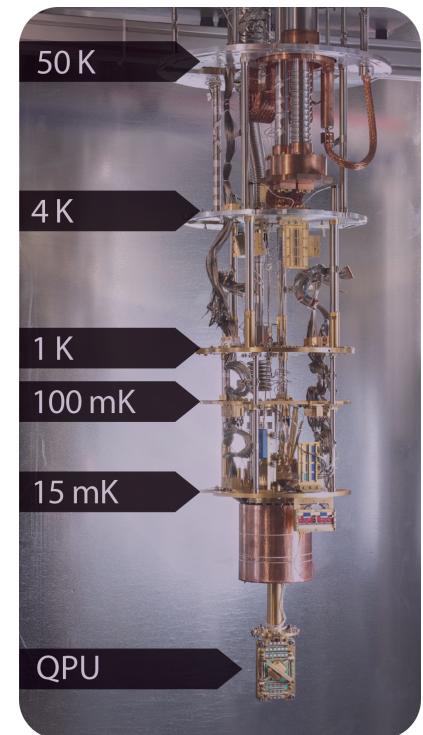
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- 2019 Google / Martinis group: “quantum supremacy”, Sycamore processor (53 qubits)



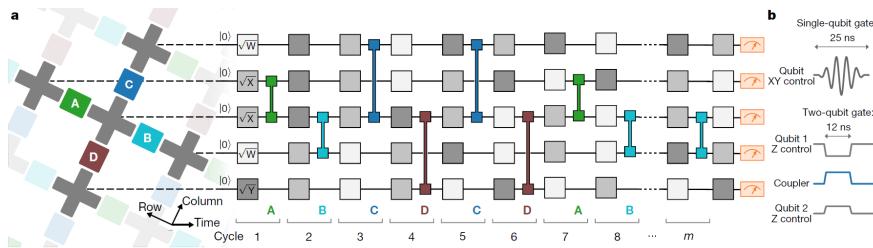
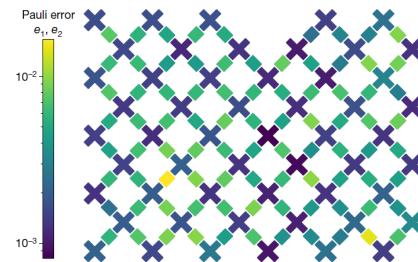
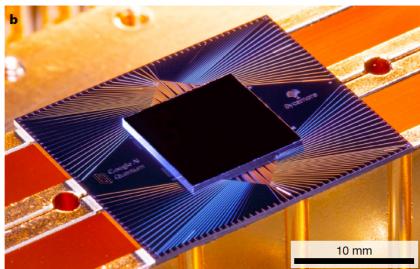
F. Arute, . . . , H. Neven, J. M. Martinis. *Quantum supremacy using a programmable superconducting processor*. Nature 574, 505 (2019)



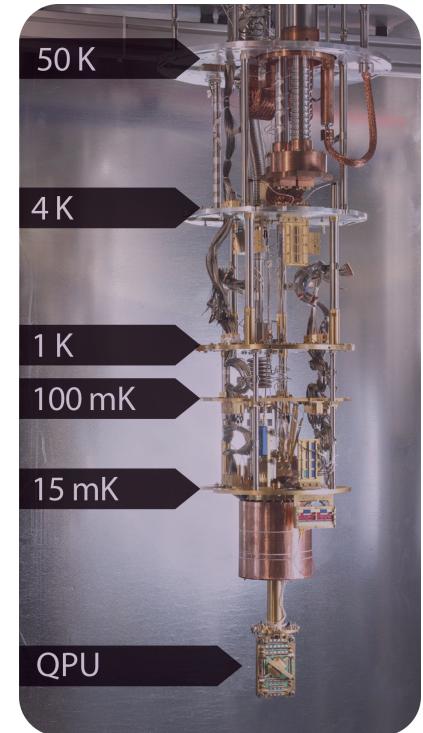
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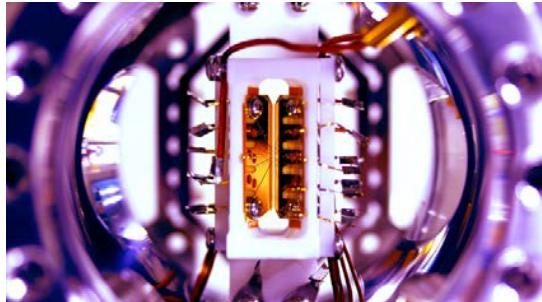


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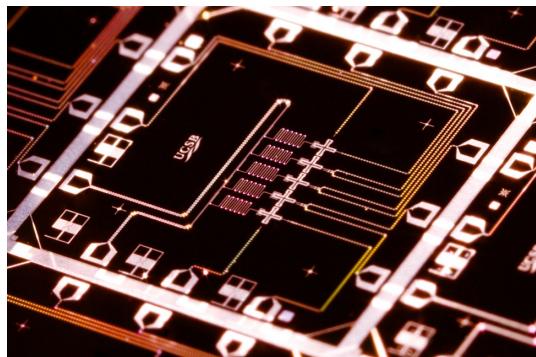


- 2020 Alpine Quantum Technologies (aqt.eu): ion-trap QC, qubit loss detection and correction

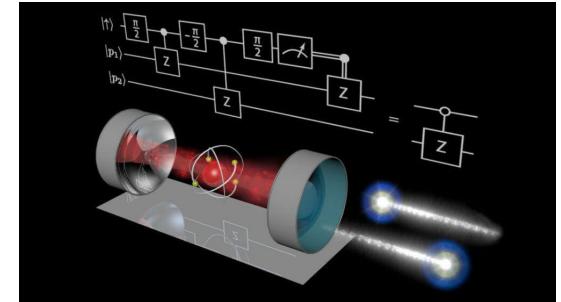
Various approaches for physical realizations



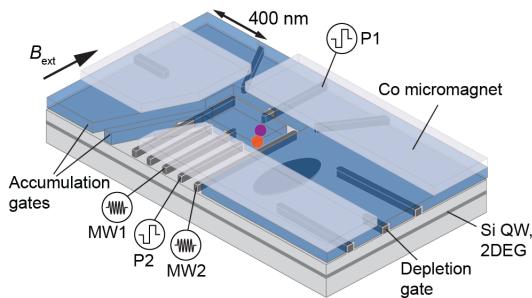
ion traps



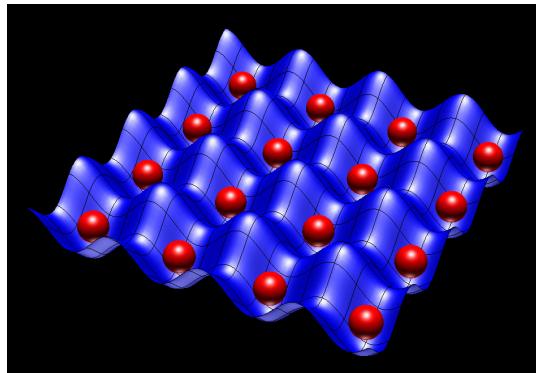
superconducting qubits



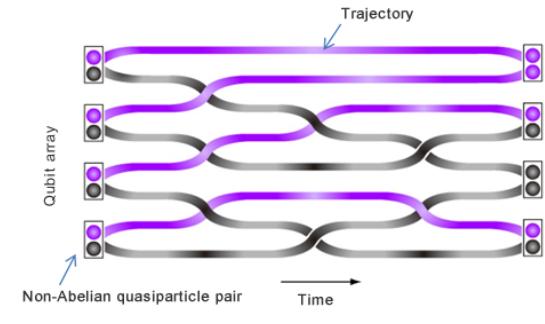
photons



quantum dots



optical lattices



topological

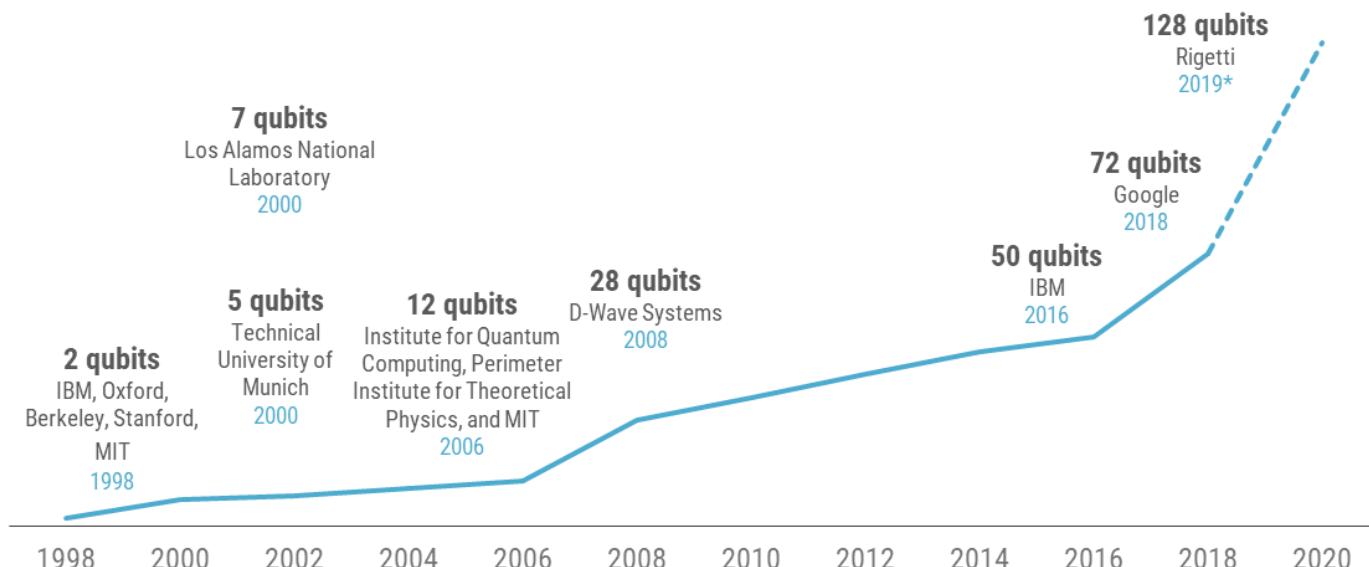
Several hardware platforms thinkable due to “universality” of quantum mechanics, current cloud-accessible devices based on superconducting qubits or ion-traps

Number of qubits



Quantum computers are getting more powerful

Number of qubits achieved by date and organization 1998 – 2020*



Source: MIT, Qubit Counter. *Rigetti quantum computer expected by late 2019.

CB INSIGHTS

Source: <https://www.cbinsights.com/research/report/quantum-computing/>

“Qubit quality”, gate fidelity, decoherence time, . . . relevant as well

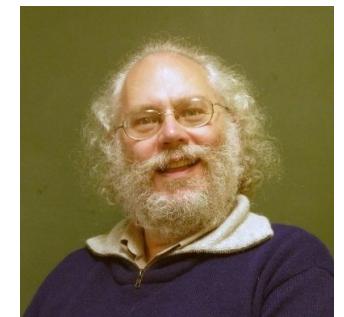
Shor's algorithm for integer factorization

$$15 = 3 \cdot 5$$

Peter Shor (1994)

Quantum algorithm, polynomial w.r.t. number of bits

~~ thread to RSA cryptosystem?



Peter Shor

Idea: reduce factoring to order-finding:

given co-prime integers x, N , compute smallest integer $r \geq 1$ such that

$$x^r \equiv 1 \pmod{N}$$

In case r is even: find factor of N via

$$x^r - 1 = (x^{r/2} - 1)(x^{r/2} + 1)$$

Solve order-finding by *quantum phase estimation*

But: not feasible on current quantum hardware: length of circuit, qubit number, low noise tolerance ...

P. W. Shor. "Algorithms for quantum computation: discrete logarithms and factoring" (1994)

C. Gidney and M. Ekerå. "How to factor 2048 bit RSA integers in 8 hours using 20 million noisy qubits". arXiv:1905.09749

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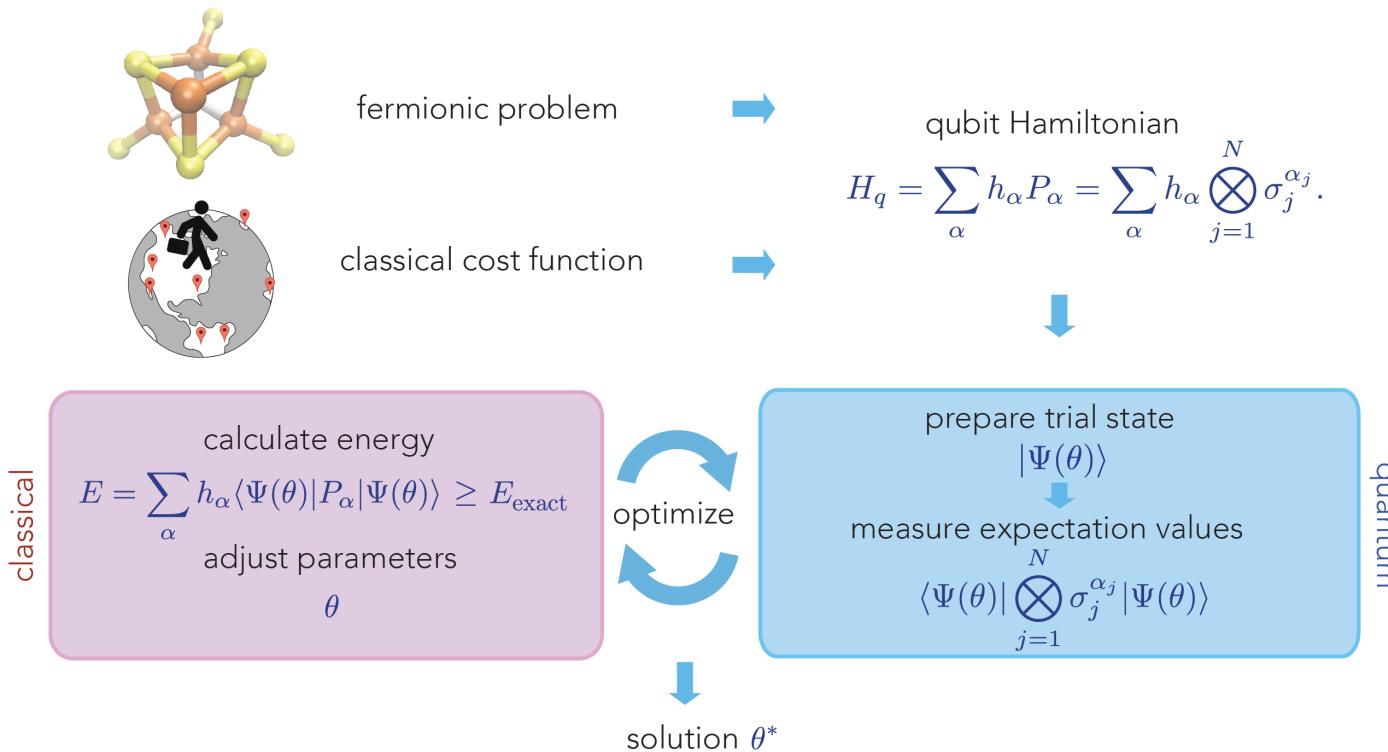
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Hybrid classical-quantum computing and QVE

QVE: quantum variational eigensolver



Source: Moll et al. (2018)

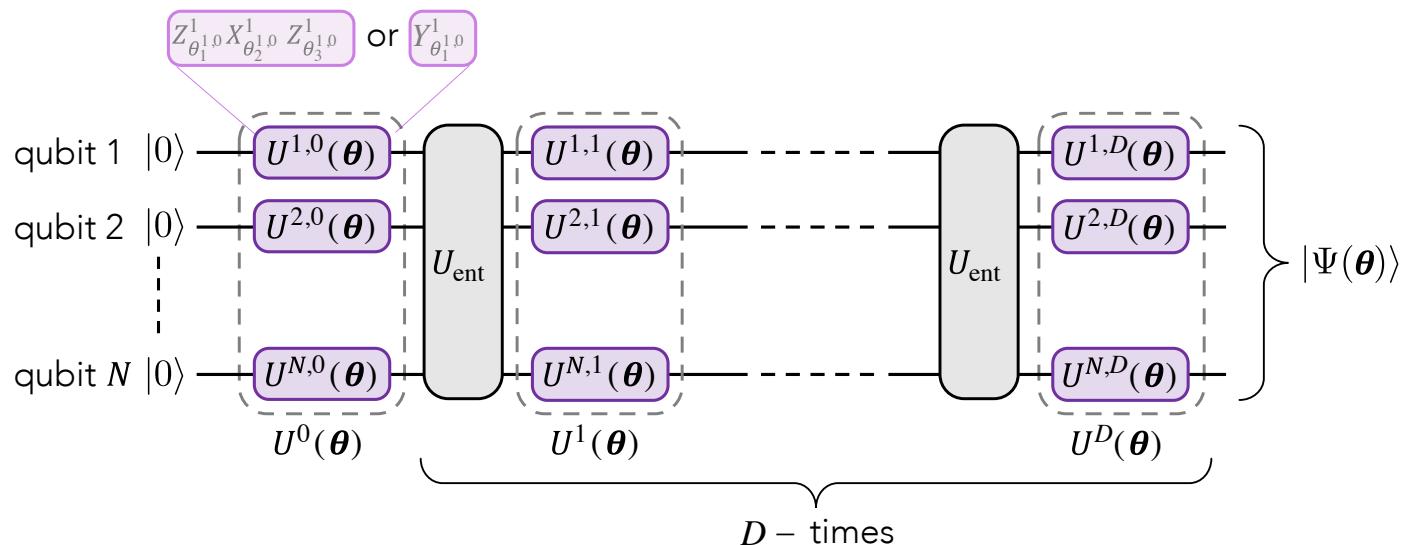
A. Peruzzo et al. "A variational eigenvalue solver on a photonic quantum processor". Nat. Commun. 5, 4213 (2014)

A. Kandala et al. "Hardware-efficient variational quantum eigensolver for small molecules and quantum magnets". Nature 549, 242–246 (2017)

Moll, N. et al. "Quantum optimization using variational algorithms on near-term quantum devices". Quantum Sci. Technol. 3, 030503 (2018)

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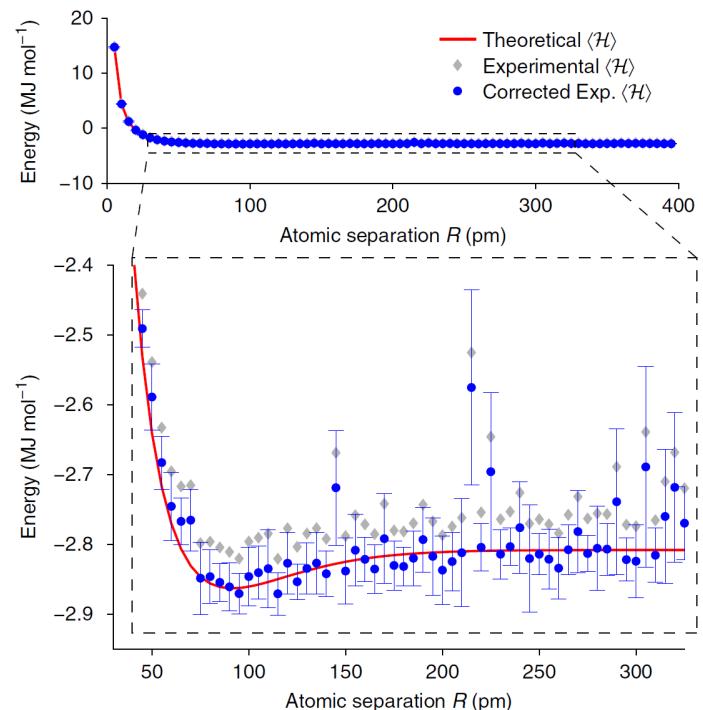
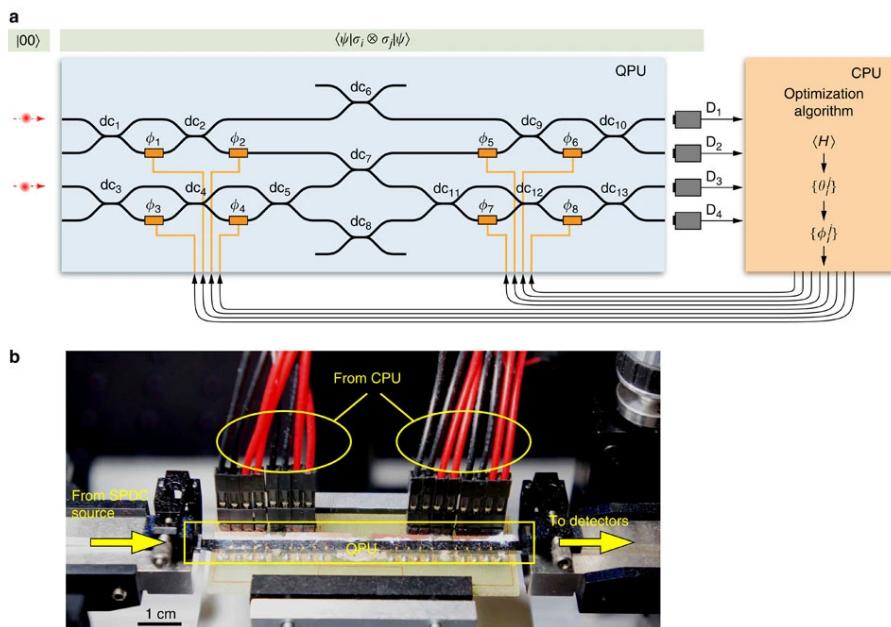
Moll, N. et al. "Quantum optimization using variational algorithms on near-term quantum devices". Quantum Sci. Technol. 3, 030503 (2018)

Quantum variational eigensolver (QVE)

Minimal model Hamiltonian (dimension 4×4), for bond dissociation of He-H⁺

$$H(R) = \sum_{i\alpha} h_\alpha^i(R) \sigma_\alpha^i + \sum_{ij\alpha\beta} h_{\alpha\beta}^{ij}(R) \sigma_\alpha^i \sigma_\beta^j$$

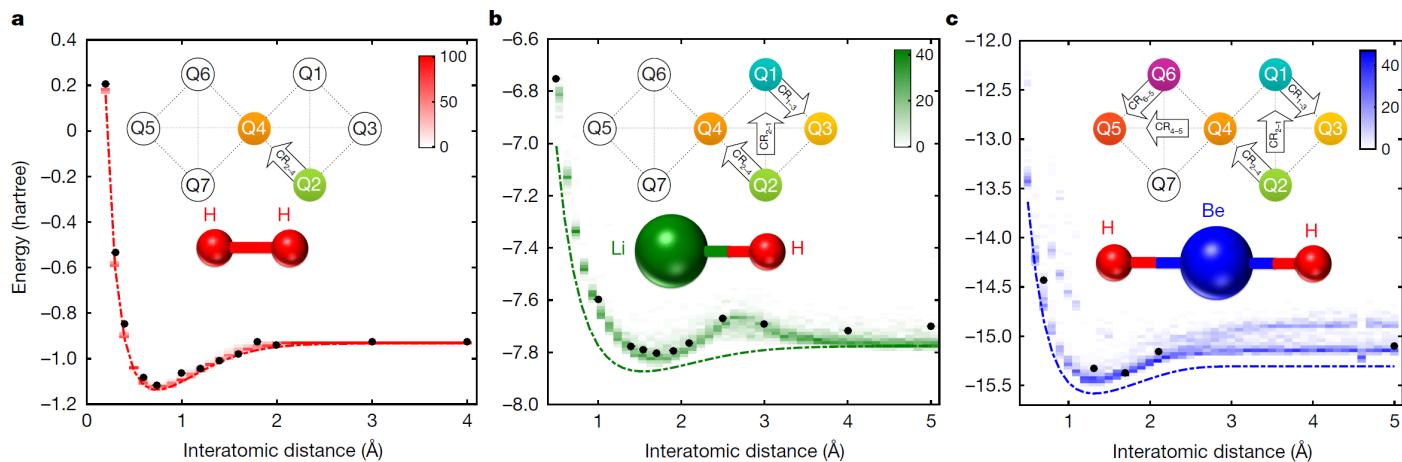
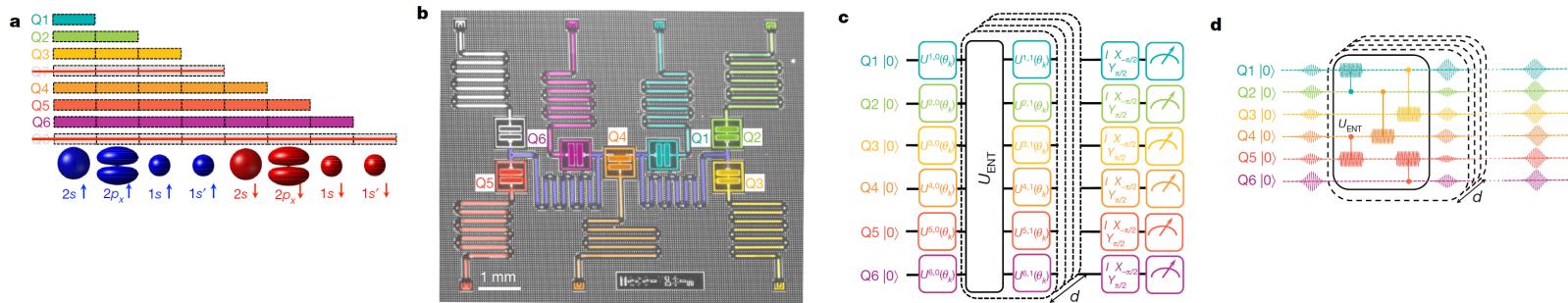
expectation values $\langle \psi | \sigma_\alpha^i \sigma_\beta^j | \psi \rangle$



A. Peruzzo et al. "A variational eigenvalue solver on a photonic quantum processor". Nat. Commun. 5, 4213 (2014)

J.-G. Liu et al. "Variational quantum eigensolver with fewer qubits". Phys. Rev. Research 1, 023025 (2019)

Quantum variational eigensolver (QVE), cont.

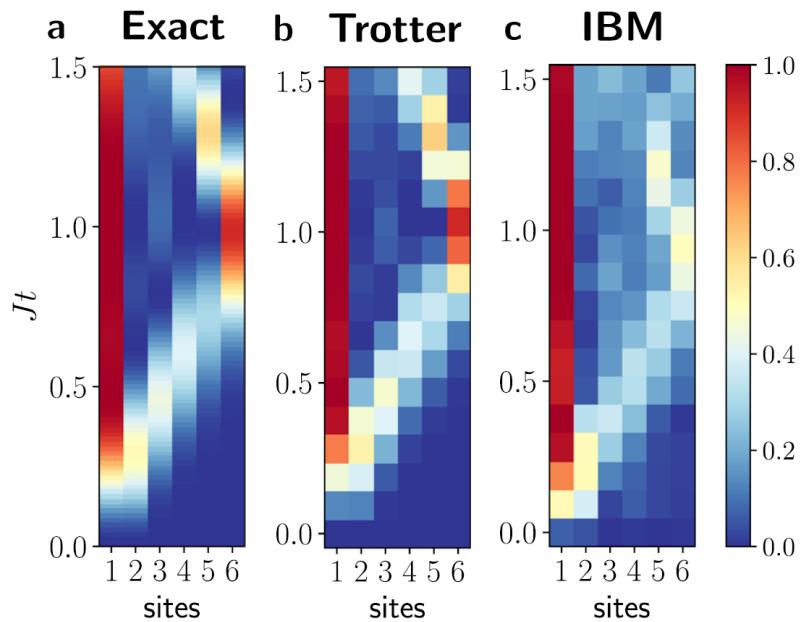
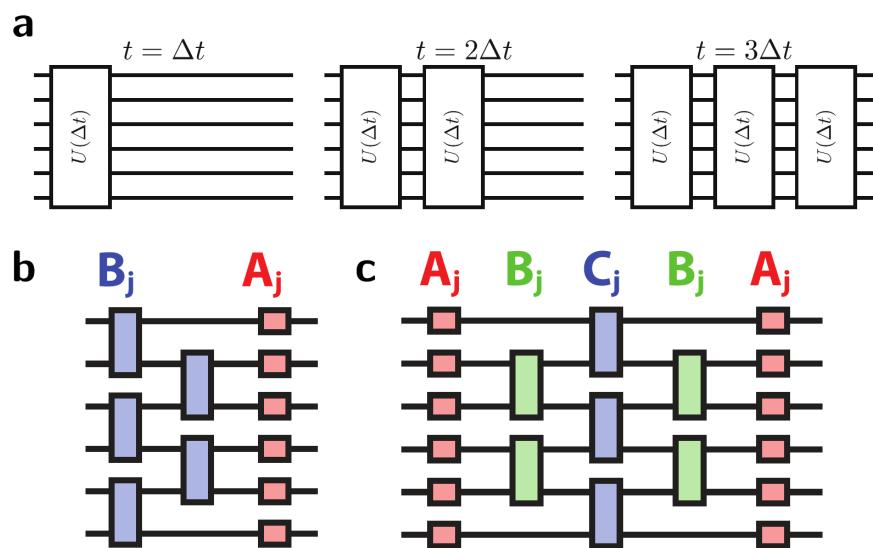


Source: A. Kandala et al. (2017), IBM

A. Kandala et al. "Hardware-efficient variational quantum eigensolver for small molecules and quantum magnets". Nature 549, 242–246 (2017)
 F. Arute et al. "Hartree-Fock on a superconducting qubit quantum computer". arXiv:2004.04174 (2020)

Simulating quantum many-body dynamics

Setup: spin- $\frac{1}{2}$ chain



Smith, Kim, Pollmann, Knolle. "Simulating quantum many-body dynamics on a current digital quantum computer". npj Quantum Information 5, 106 (2019)

B. Chiaro et al. "Growth and preservation of entanglement in a many-body localized system". arXiv:1910.06024

Quantum optimization: QAOA algorithm

Maximize

$$C(z) = \sum_{\alpha=1}^m C_\alpha(z), \quad z = z_1 z_2 \dots z_n$$

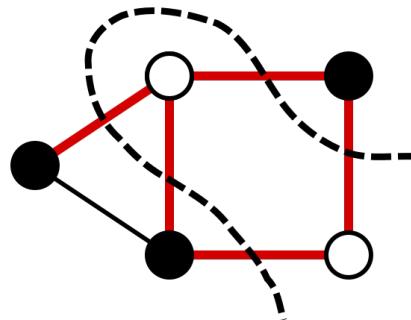
Ansatz: encode C as quantum Hamiltonian, maximize

$$\langle \psi_p(\gamma, \beta) | C | \psi_p(\gamma, \beta) \rangle$$

w.r.t. angles γ, β in

$$|\psi_p(\gamma, \beta)\rangle = e^{-i\beta_p B} e^{-i\gamma_p C} \dots e^{-i\beta_1 B} e^{-i\gamma_1 C} |+\rangle^{\otimes n}$$

Application to Max-Cut:

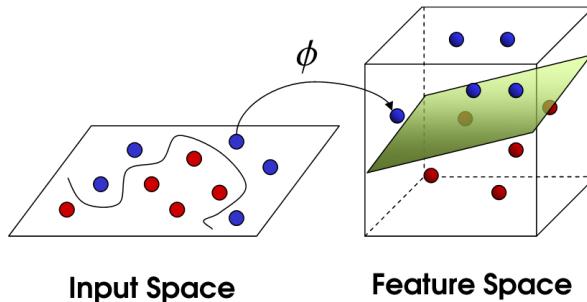


Source: Wikipedia

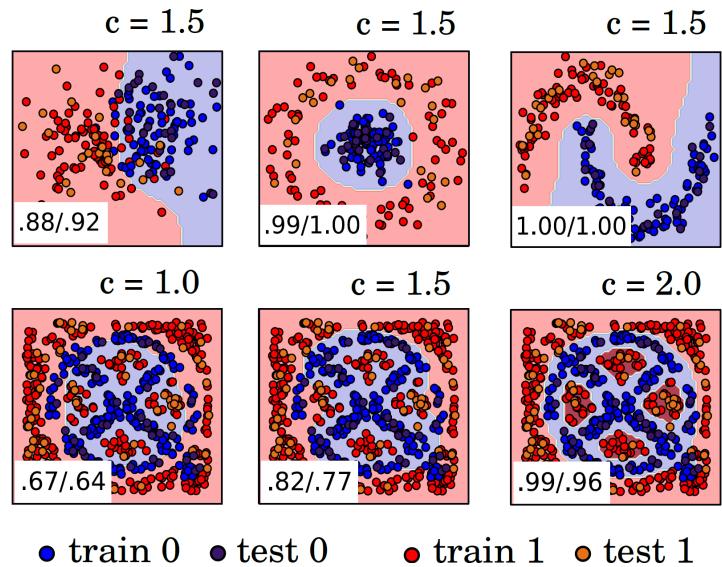
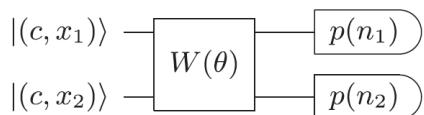
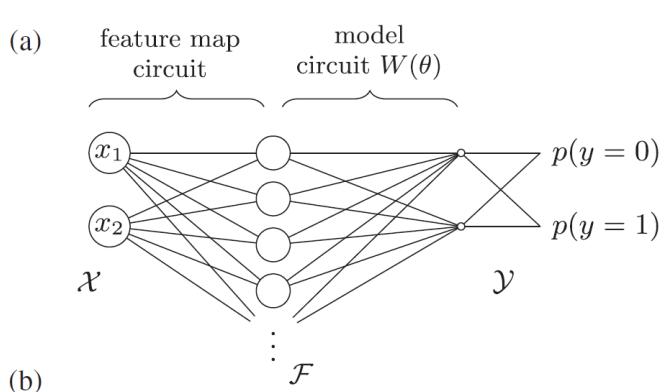
E. Farhi et al. "A quantum approximate optimization algorithm". arXiv:1411.4028

Quantum machine learning

Quantum Hilbert space as nonlinear feature map:



Source: towardsdatascience.com

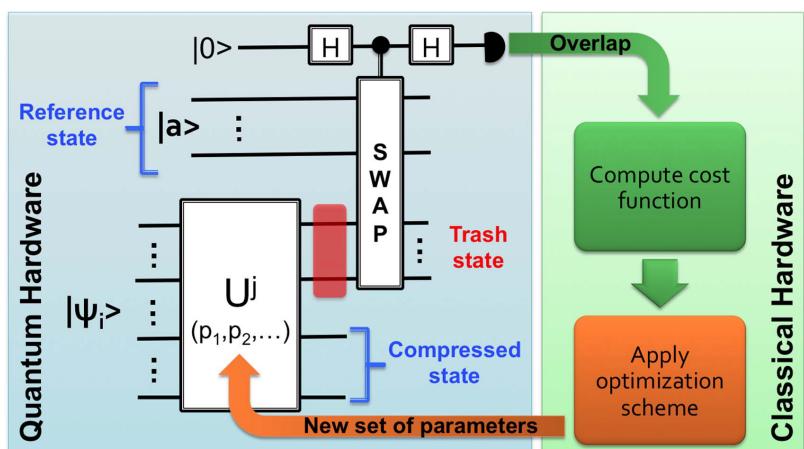
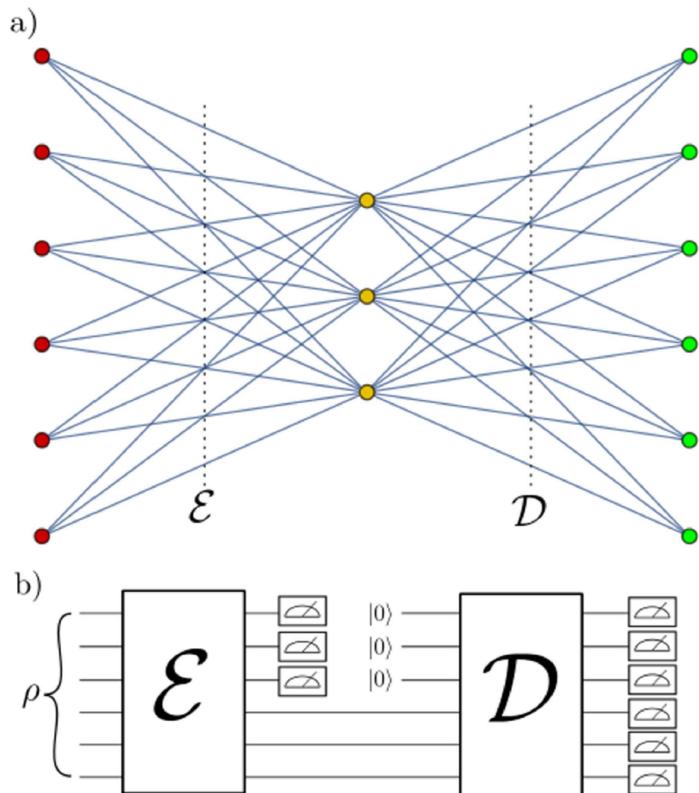


Review: J. Biamonte et al. "Quantum machine learning". Nature 549, 195–202 (2017)

M. Schuld and N. Killoran. "Quantum machine learning in feature Hilbert spaces". Phys. Rev. Lett. 122, 040504 (2019)

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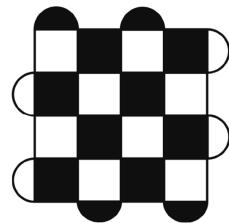
Quantum autoencoders



J. Romero, J. P. Olson, A. Aspuru-Guzik. "Quantum autoencoders for efficient compression of quantum data". Quantum Sci. Technol. 2, 045001 (2017)

Quantum error correction and fault-tolerant comput.

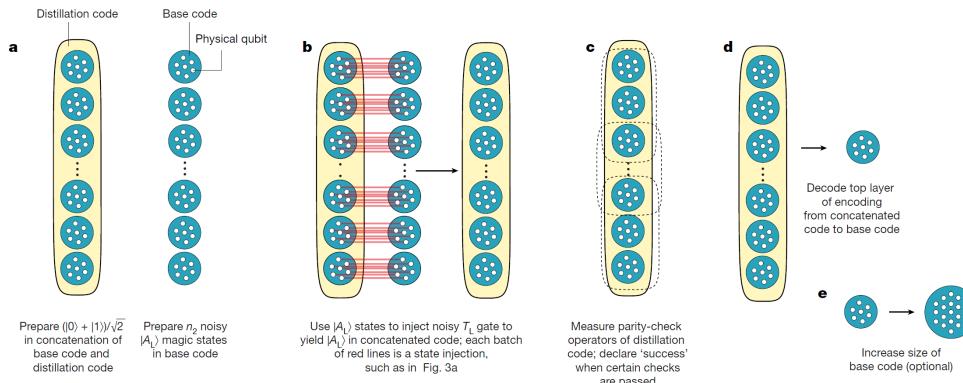
- Surface codes



E. Dennis et al. "Topological quantum memory". J. Math. Phys. 43, 4452–4505 (2002)

B. J. Brown et al. "Poking holes and cutting corners to achieve Clifford gates with the surface code". Phys. Rev. X 7, 021029 (2017)

- Magic state distillation

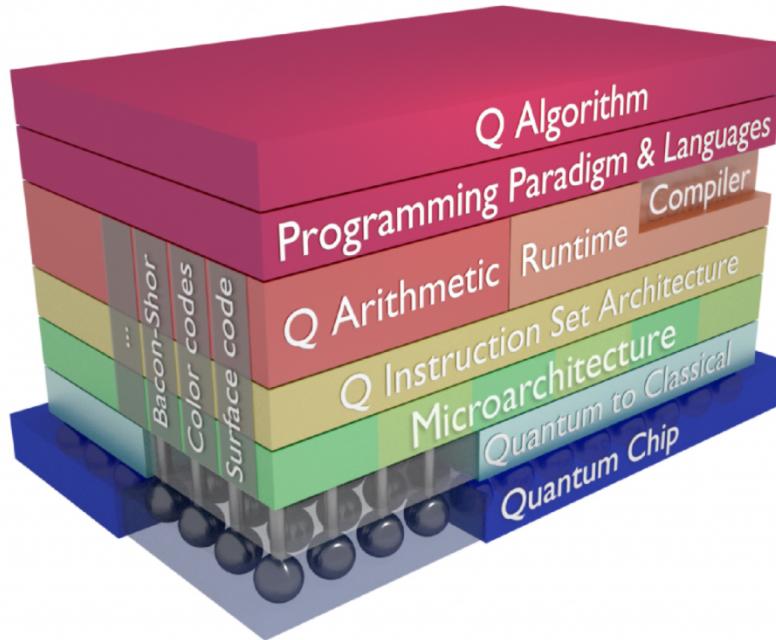


S. Bravyi and A. Kitaev. "Universal quantum computation with ideal Clifford gates and noisy ancillas". Phys. Rev. A 71, 022316 (2005)

E. Campbell, B. Terhal, C. Vuillot. "Roads towards fault-tolerant universal quantum computation". Nature 549, 172–179 (2017)

R. Sweke et al. "Reinforcement learning decoders for fault-tolerant quantum computation". arXiv:1810.07207 (2018)

Quantum software stack



Source: <https://qutech.nl/newsroom/events/workshop-quantum-computing/>

- Qiskit (IBM)
- Cirq, TensorFlow Quantum (Google)
- ProjectQ (ETH)
- Microsoft Q#
- Silq (silq.ethz.ch)
- Cambridge Quantum Computing
- PennyLane / Strawberry Fields (Xanadu)
- github.com/Qaintum/Qaintessent.jl (TUM)

...

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