

Open-source quantum technologies



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Theoretical Quantum Physics Lab
Cluster for Pioneering Research
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Unitary Fund, Berkeley



NathanShammah.com



Machine Learning Talks
Spaces Shinagawa
14th February 2020

AIRJ
Association of Italian
Researchers in Japan

Association of Italian Researchers in Japan



ASSOCIAZIONE
DEI RICERCATORI
ITALIANI
IN GIAPPONE

KICK-OFF EVENT: DECEMBER 2019

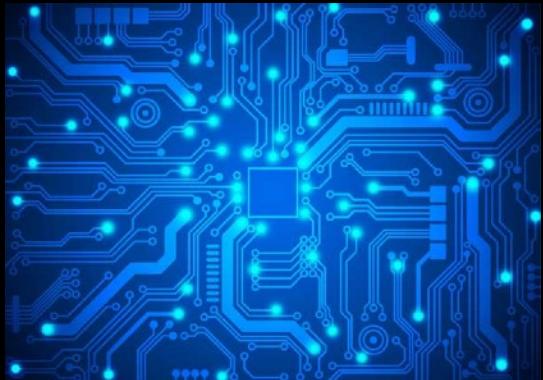
SYMPOSIUM: APRIL 2020

<http://airj.info/>

Quantum Technologies

Quantum Technologies

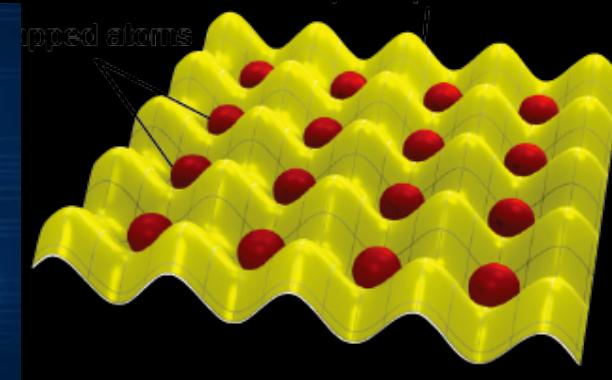
Computing



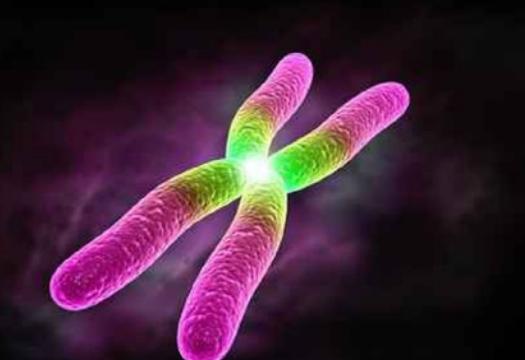
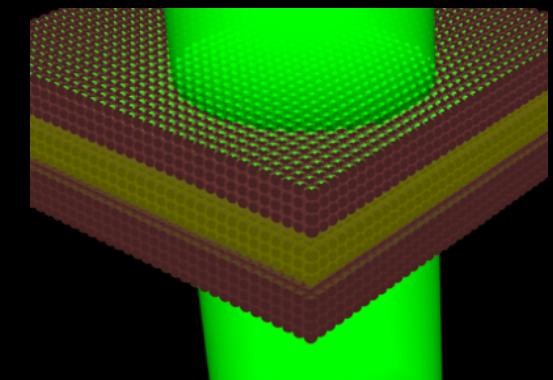
Communication



Simulation



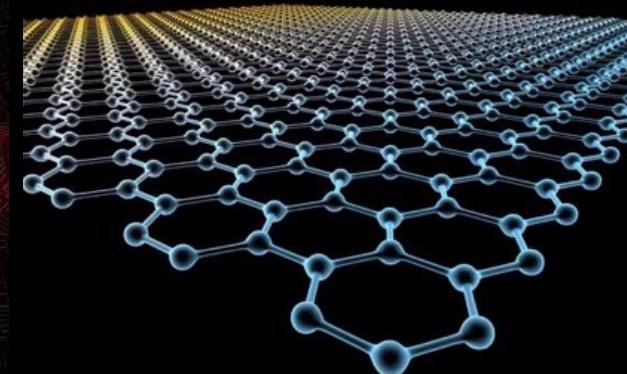
Sensors



Drug Design



Cybersecurity



Materials



Biology

Quantum Technologies

Quantum Technologies



Quantized: discrete, in ‘chunks’



Quantized: discrete, in ‘chunks’



Quantized: discrete, in ‘chunks’





W \nearrow





X





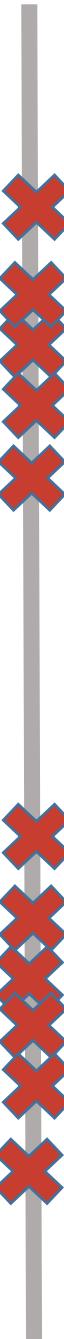


✗



X

X

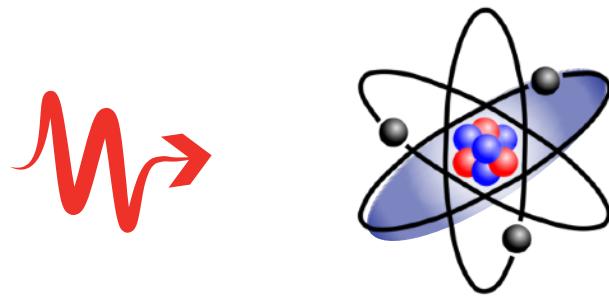




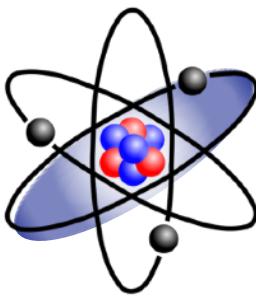
WAVE PARTICLE DUALITY

All the animations and explanations on
www.toutestquantique.fr

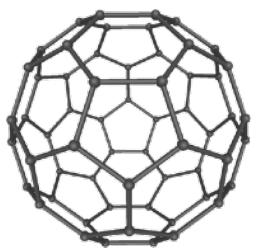
https://youtu.be/Xmq_FJd1oUQ



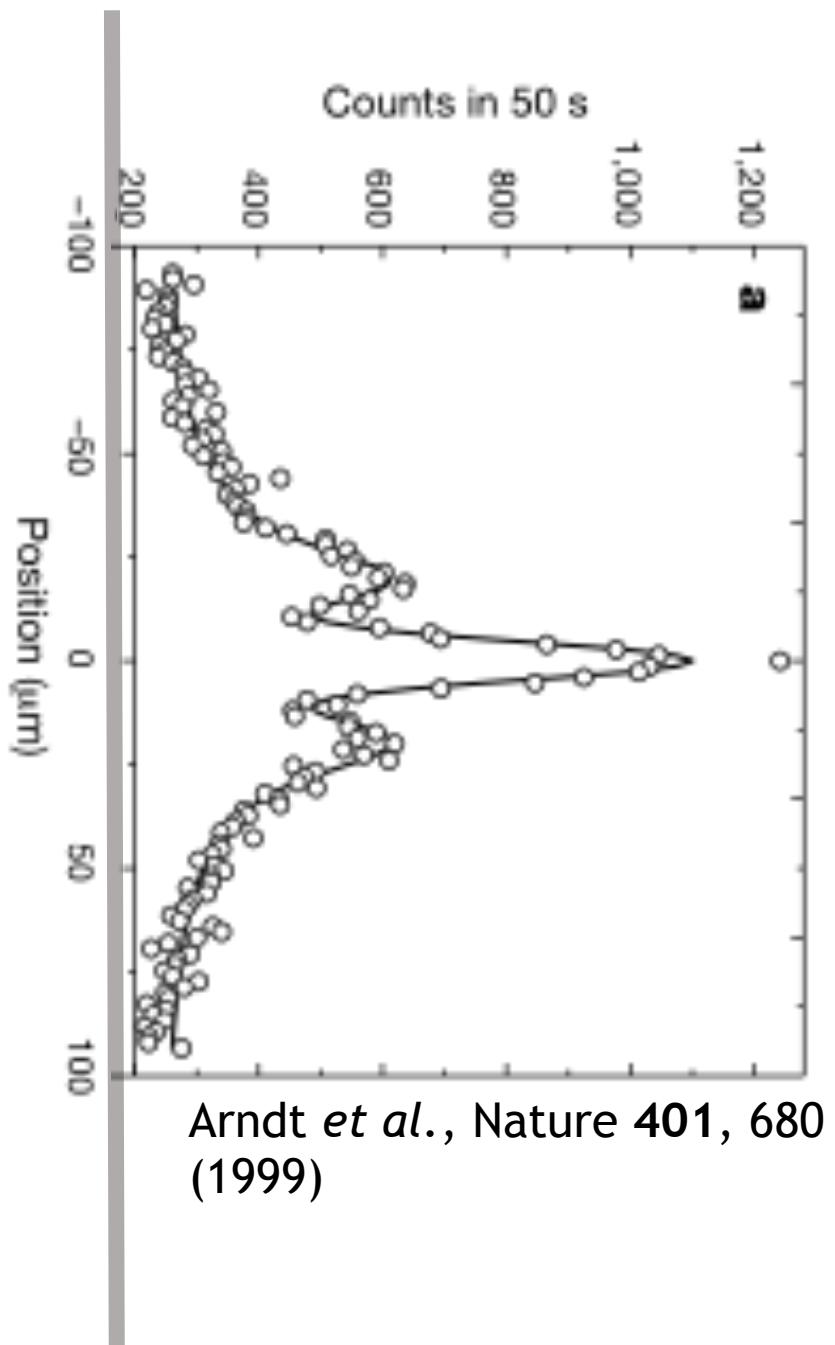
Photon



Atom

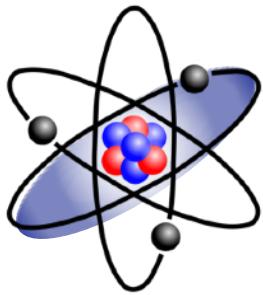


C₆₀

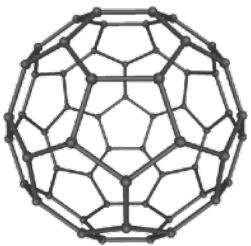




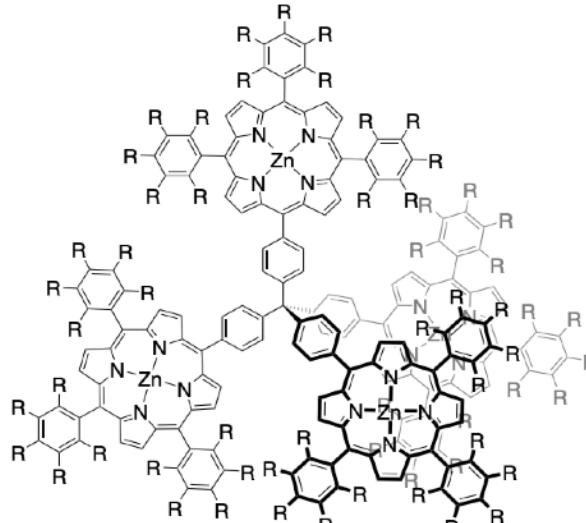
Photon



Atom



C60



$R = F$ or $C_{10}H_4F_{17}S$

Organic molecules (oligoporphyrins)

nature physics

Letter | Published: 23 September 2019

Quantum superposition of molecules beyond 25 kDa

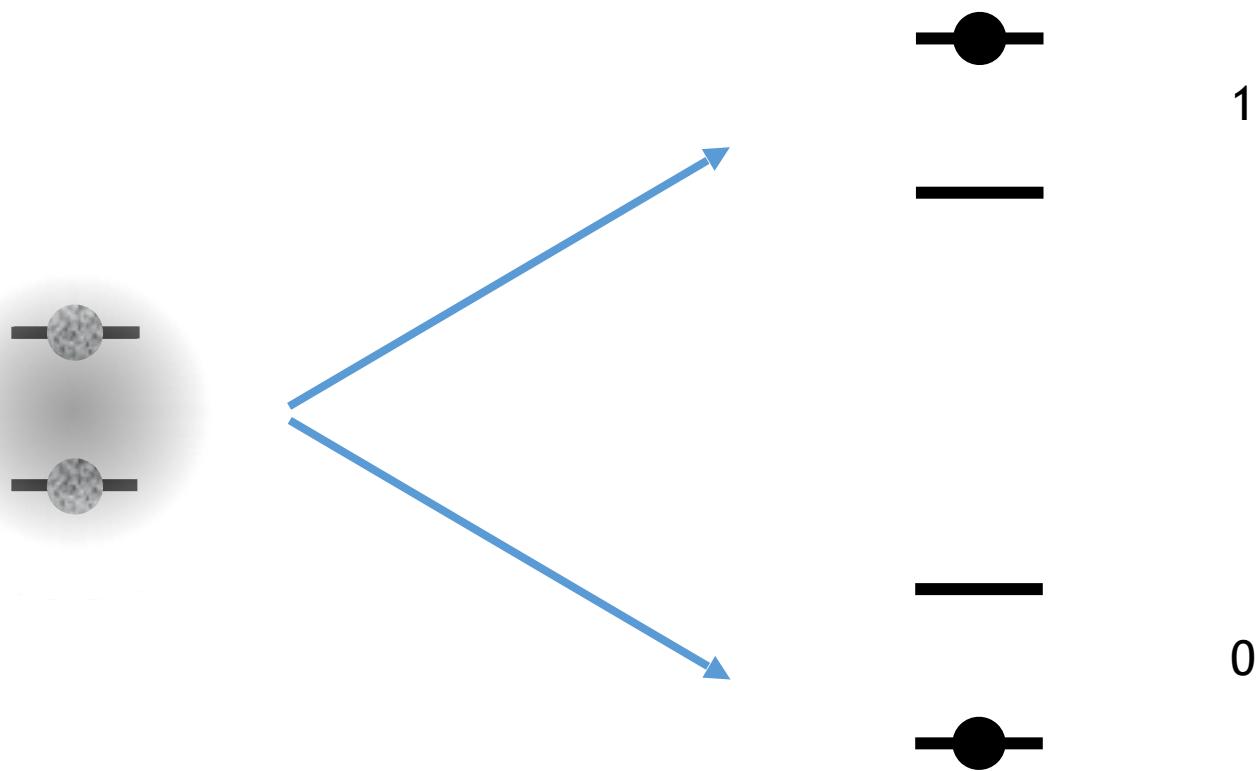
Yaakov Y. Fein, Philipp Geyer, Patrick Zwick, Filip Kiaika, Sebastian Pedalino, Marcel Mayor, Stefan Gerlich & Markus Arndt

Nature Physics **15**, 1242–1245(2019) | Cite this article

<https://www.nature.com/articles/s41567-019-0663-9>

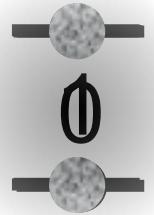
Quantum Bit

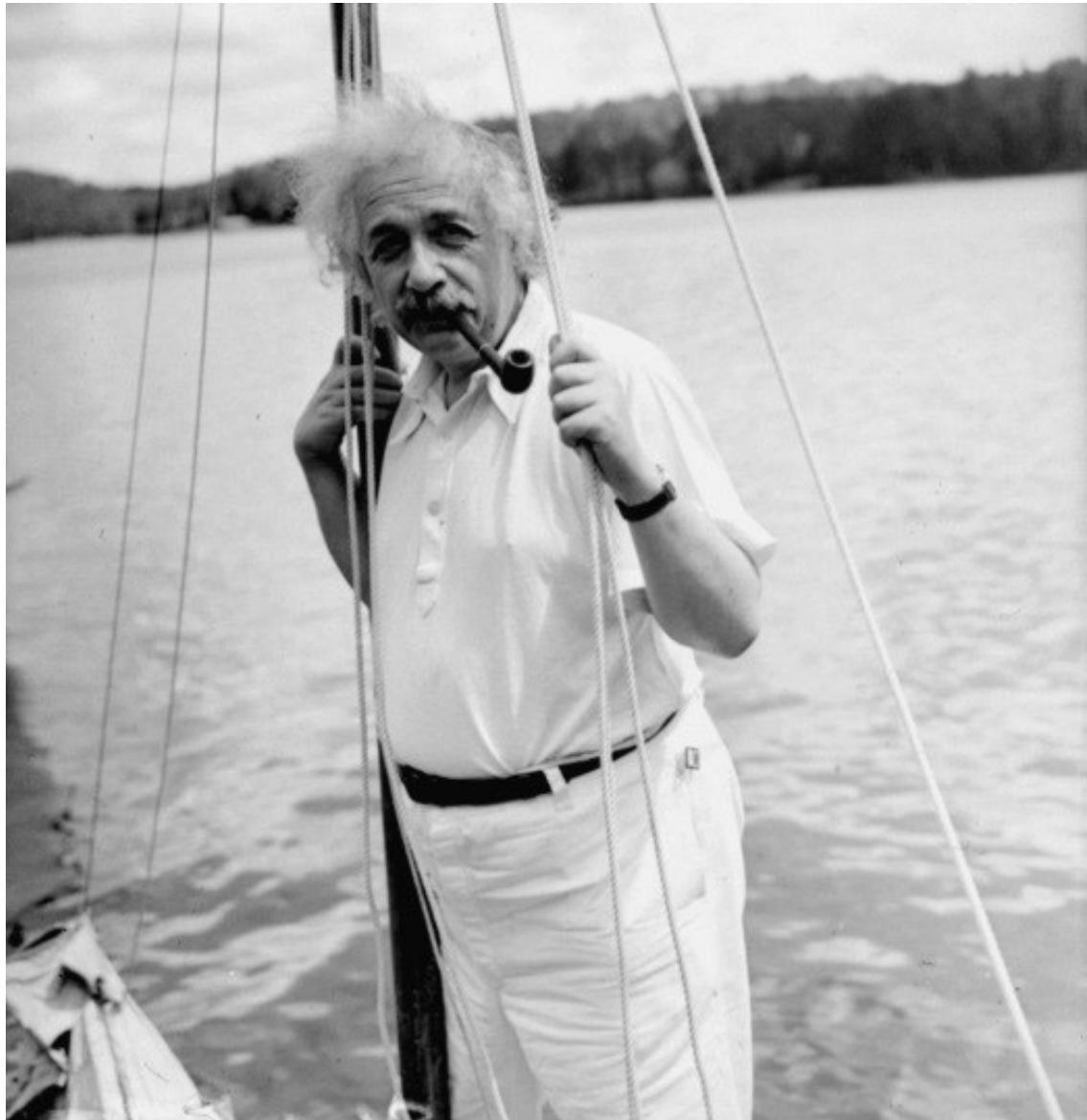
Measuring a system can modify its state



Quantum Bit

Superposition and Entanglement





Albert Einstein in 1935

EINSTEIN ATTACKS QUANTUM THEORY

**Scientist and Two Colleagues
Find It Is Not 'Complete'
Even Though 'Correct.'**

SEE FULLER ONE POSSIBLE

**Believe a Whole Description of
'the Physical Reality' Can Be
Provided Eventually.**

The New York Times, May 4th, 1935



M A Y 15, 1935

P H Y S I C A L R E V I E W

V O L U M E 47

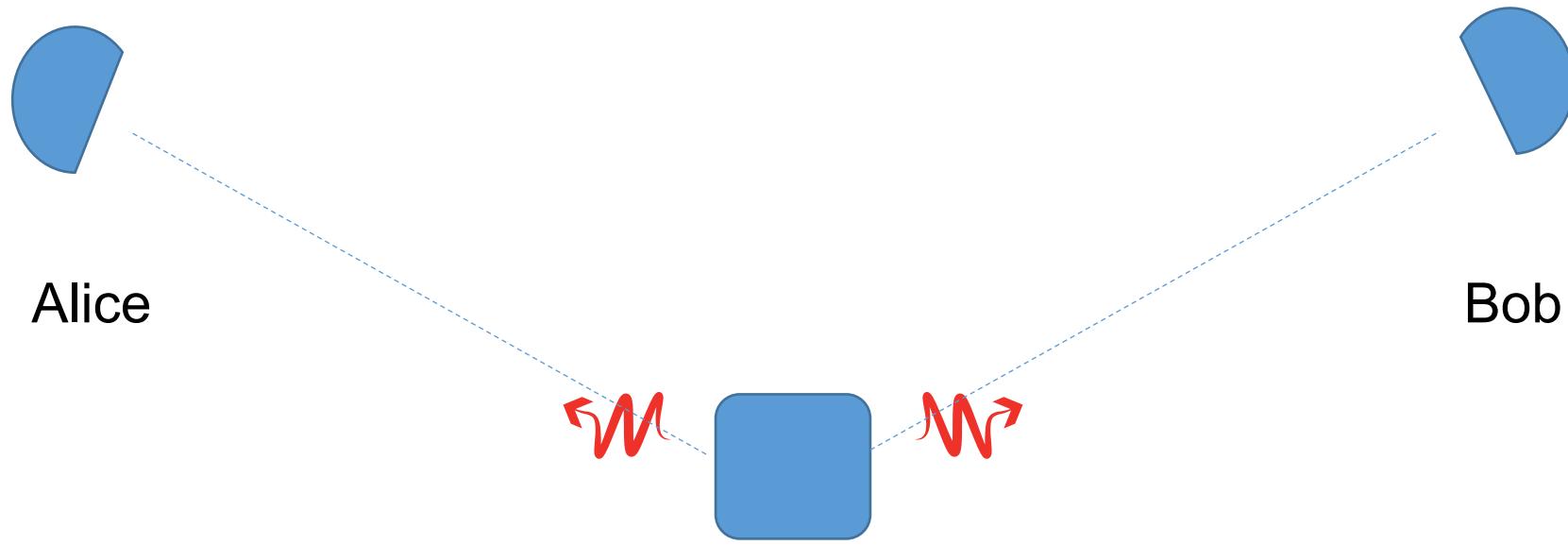
Can Quantum-Mechanical Description of Physical Reality Be Considered Complete?

A. EINSTEIN, B. PODOLSKY AND N. ROSEN, *Institute for Advanced Study, Princeton, New Jersey*

(Received March 25, 1935)

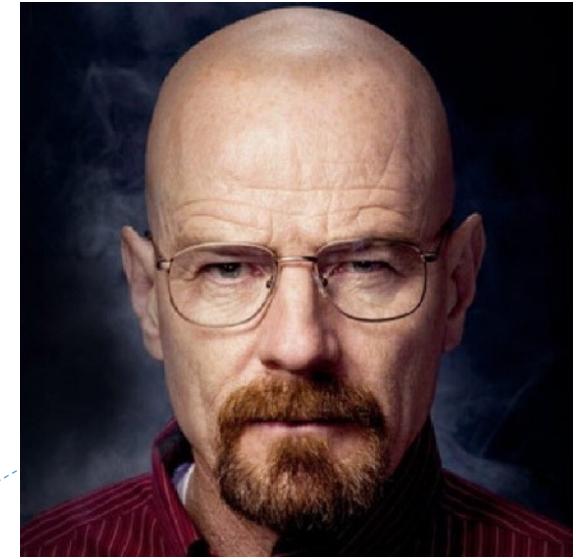
In a complete theory there is an element corresponding to each element of reality. A sufficient condition for the reality of a physical quantity is the possibility of predicting it with certainty, without disturbing the system. In quantum mechanics in the case of two physical quantities described by non-commuting operators, the knowledge of one precludes the knowledge of the other. Then either (1) the description of reality given by the wave function in

quantum mechanics is not complete or (2) these two quantities cannot have simultaneous reality. Consideration of the problem of making predictions concerning a system on the basis of measurements made on another system that had previously interacted with it leads to the result that if (1) is false then (2) is also false. One is thus led to conclude that the description of reality as given by a wave function is not complete.





Schrodinger



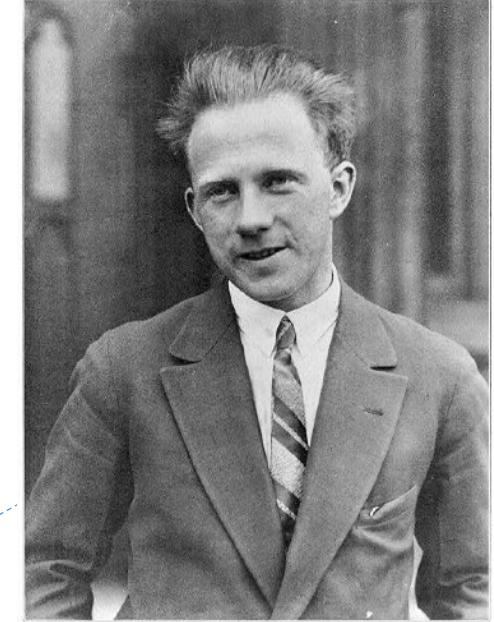
Heisenberg



Source of Correlated Quantum Objects



Erwin Schrodinger
(1887-1961)



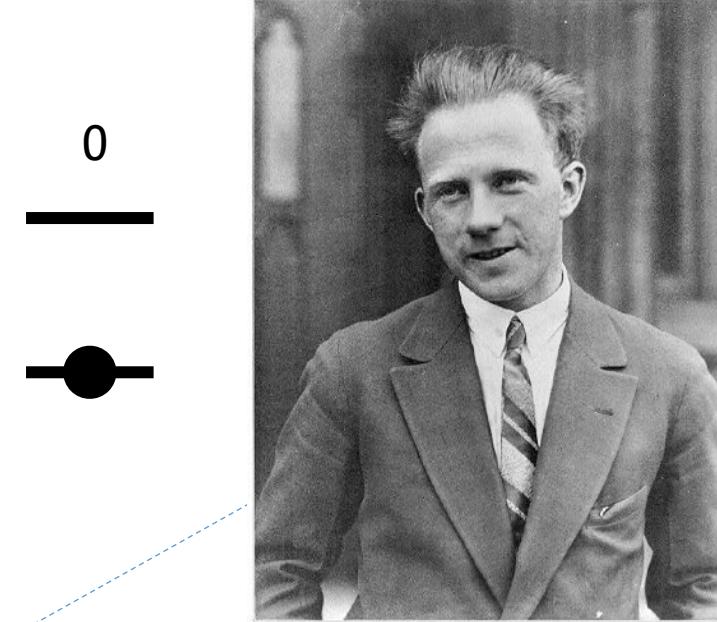
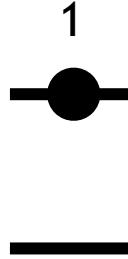
Werner Heisenberg
(1901-1976)



Source of Correlated Quantum Objects



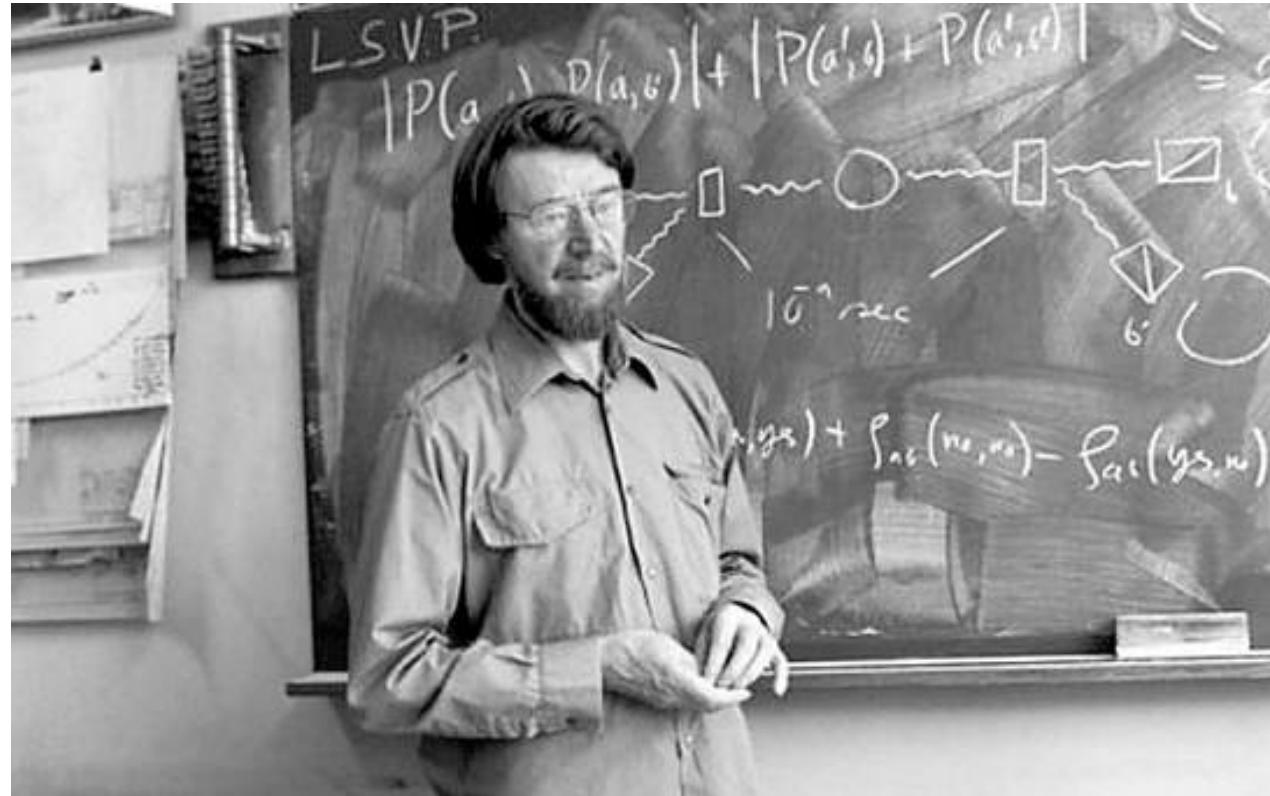
Erwin Schrodinger
(1887-1961)



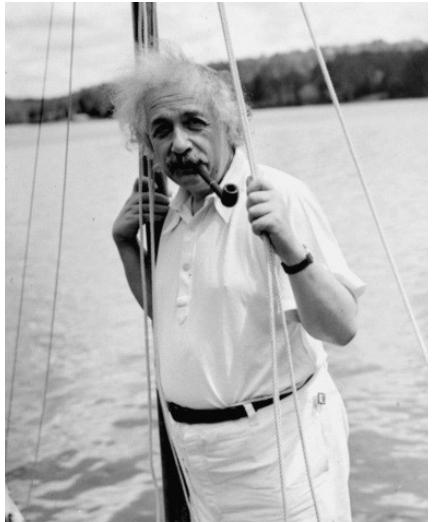
Werner Heisenberg
(1901-1976)



Source of Correlated Quantum Objects



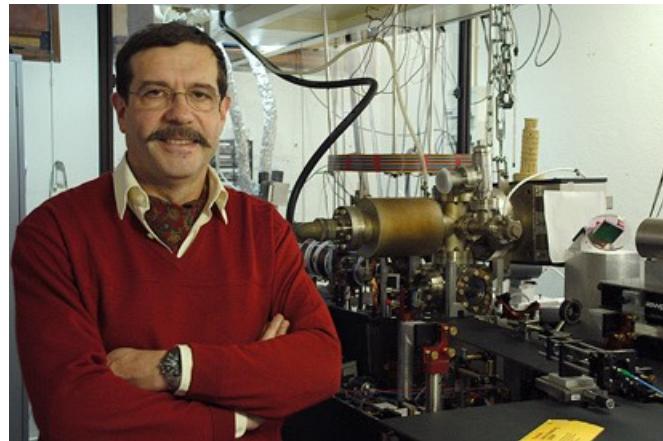
John S. Bell (1928-1991)



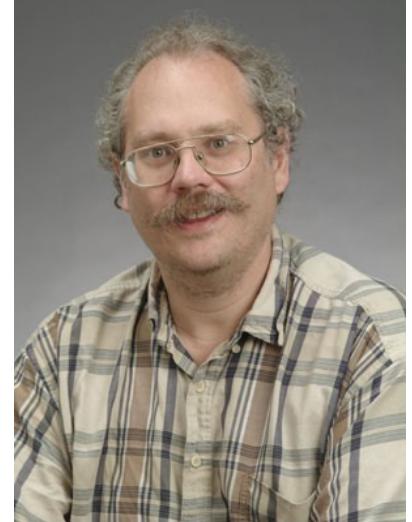
EPR Paradox
Entanglement
is defined



Bell's Inequalities
Entanglement
can be measured



Experiments
Entanglement
is measured



Shor's Algorithm
Entanglement
is useful

1935

1964

1980s

1994



Quantum Technologies

Quantum Technologies

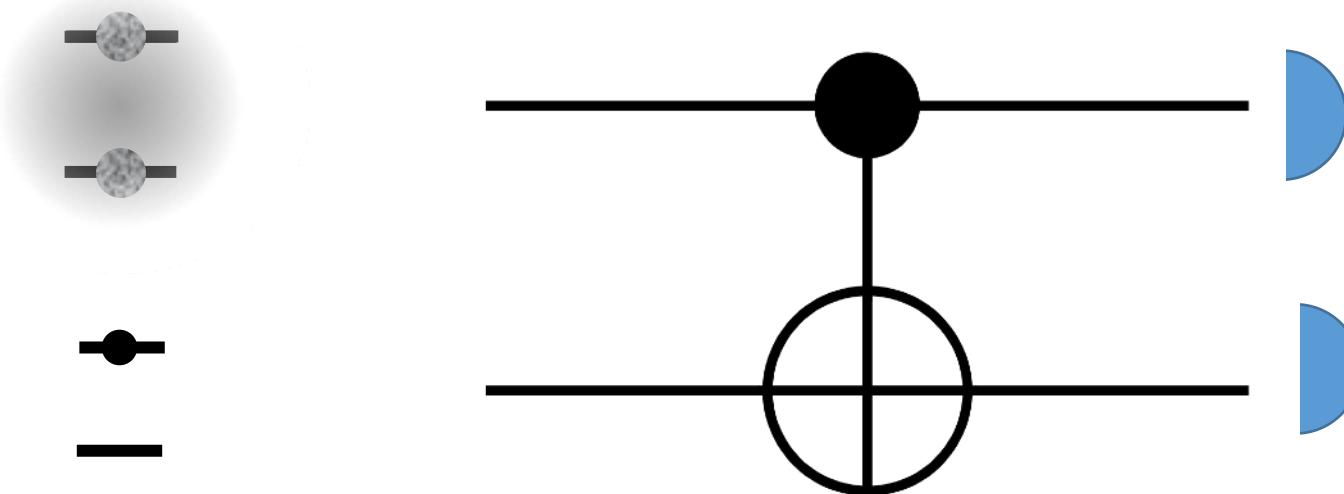
Quantum Technologies

- Quantum Computing
- Quantum Communication
- Quantum Simulation
- Quantum Sensing

Quantum Technologies

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Quantum Algorithm



Quantum Computing

Shor's Algorithm

Factoring is 'easier' with a
quantum computer



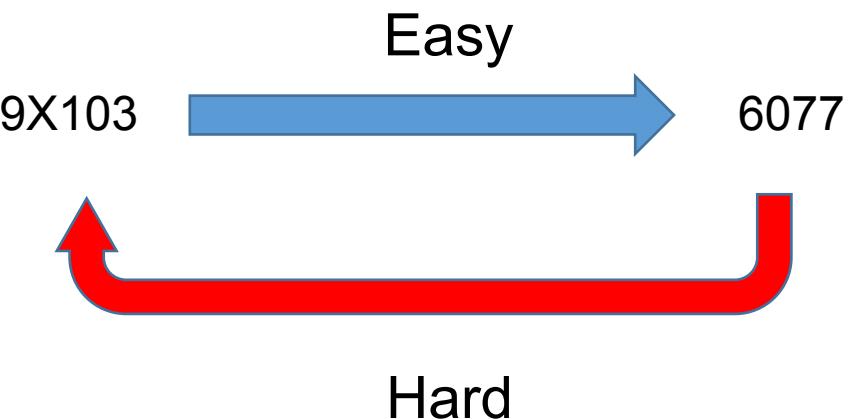
Peter Shor

Making a multiplication is **easy**
Making a division is **hard**

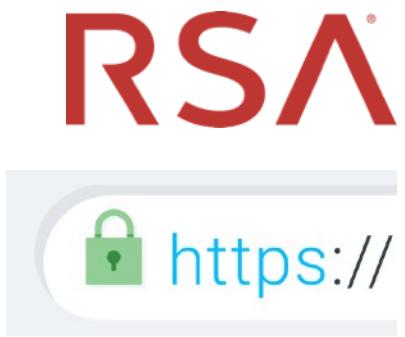
Easy

$$59 \times 103 \longrightarrow 6077$$

Making a multiplication is **easy**
Making a division is **hard**

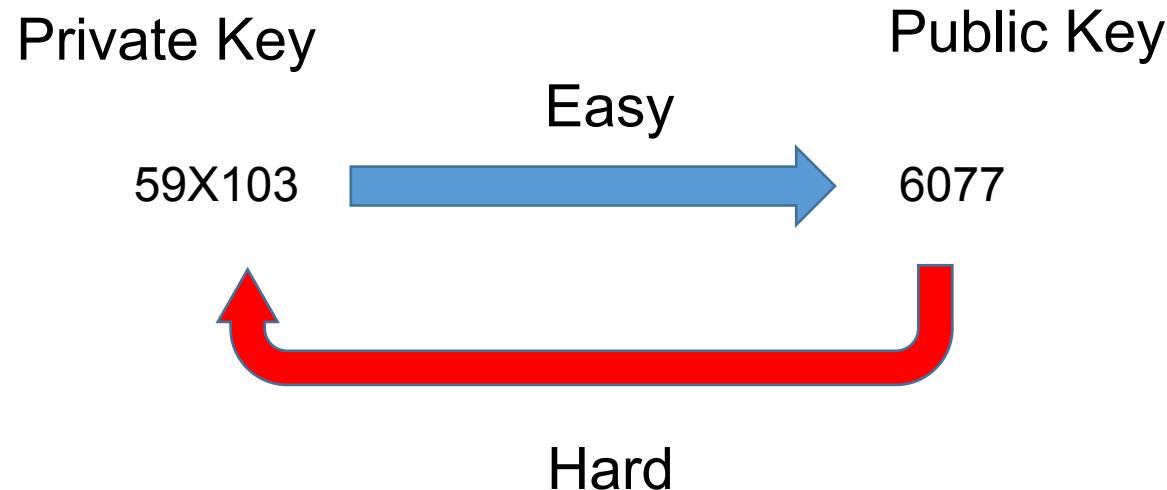


Public key distribution: Rivest, Shamir, Adelman (RSA) 1978



'One-way function' or trap-door function: Cryptography

Making a multiplication is **easy**
Making a division is **hard**



'One-way function' or trap-door function: Cryptography

Alice

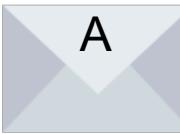
A



B



**Outside World
(Eve)**



Bob

A



B



Alice

Private Key



Outside World
(Eve)

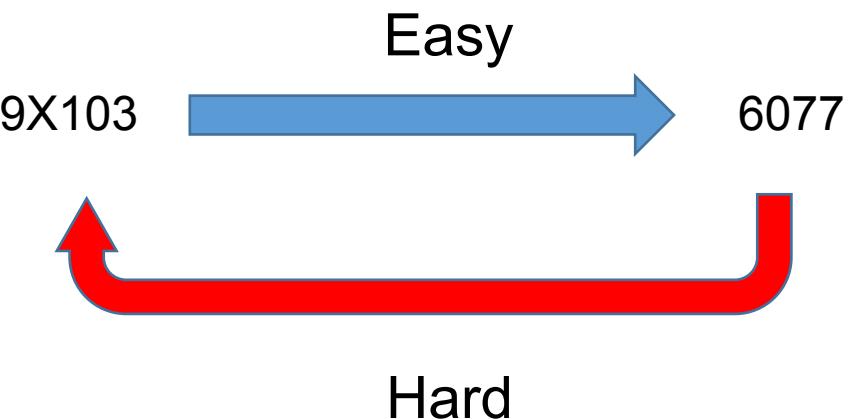
Public Key



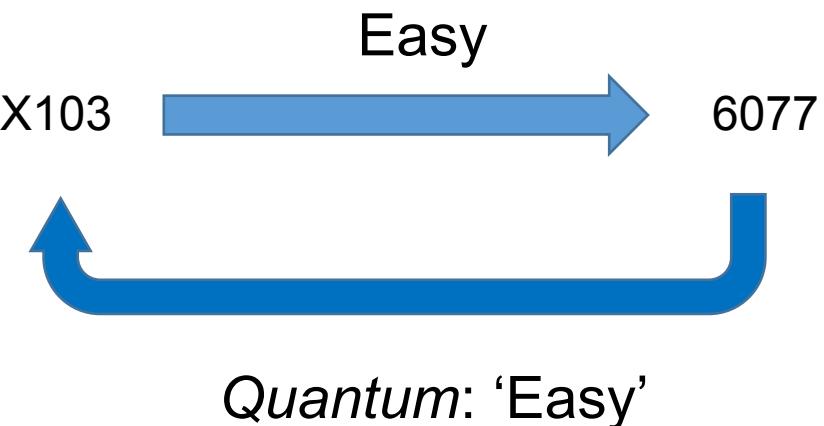
Bob



Making a multiplication is **easy**
Making a division is **hard**



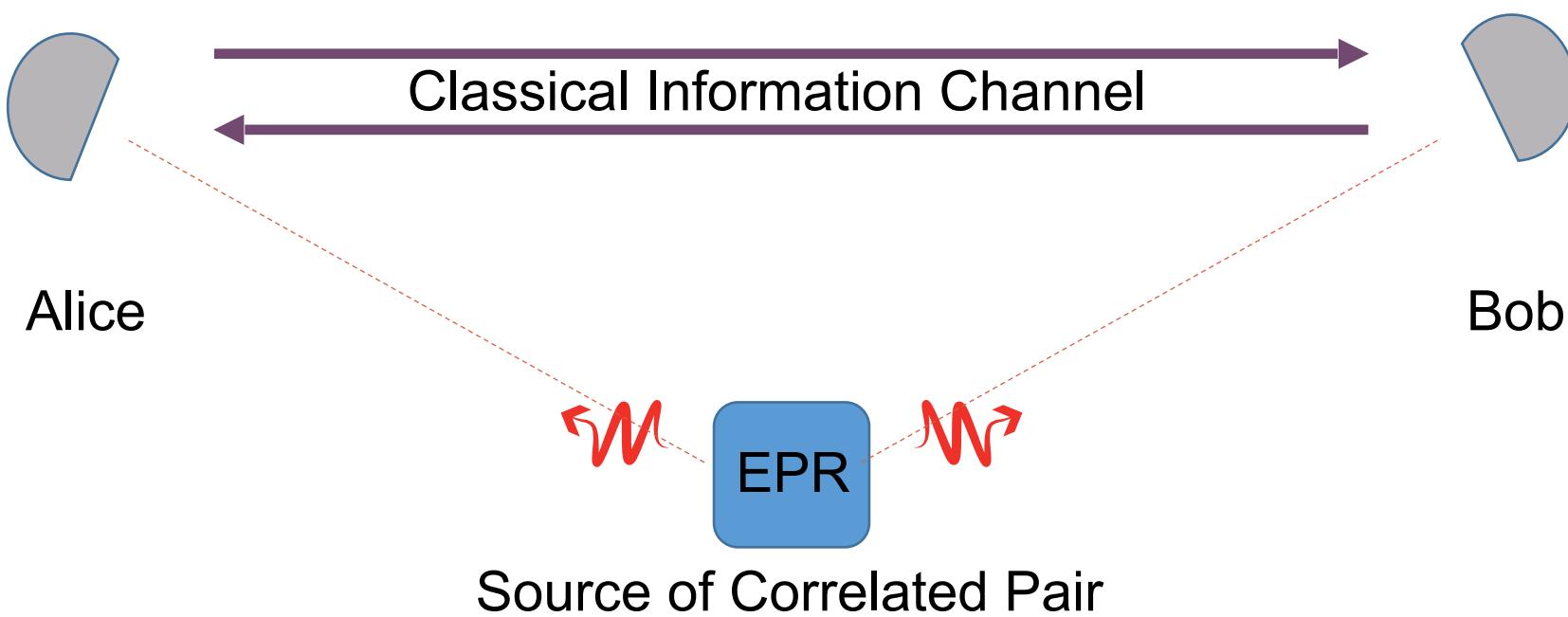
Making a multiplication is **easy**
Making a division is **hard classically**



Quantum Technologies

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- Quantum Communication
- Quantum Simulation
- Quantum Sensing

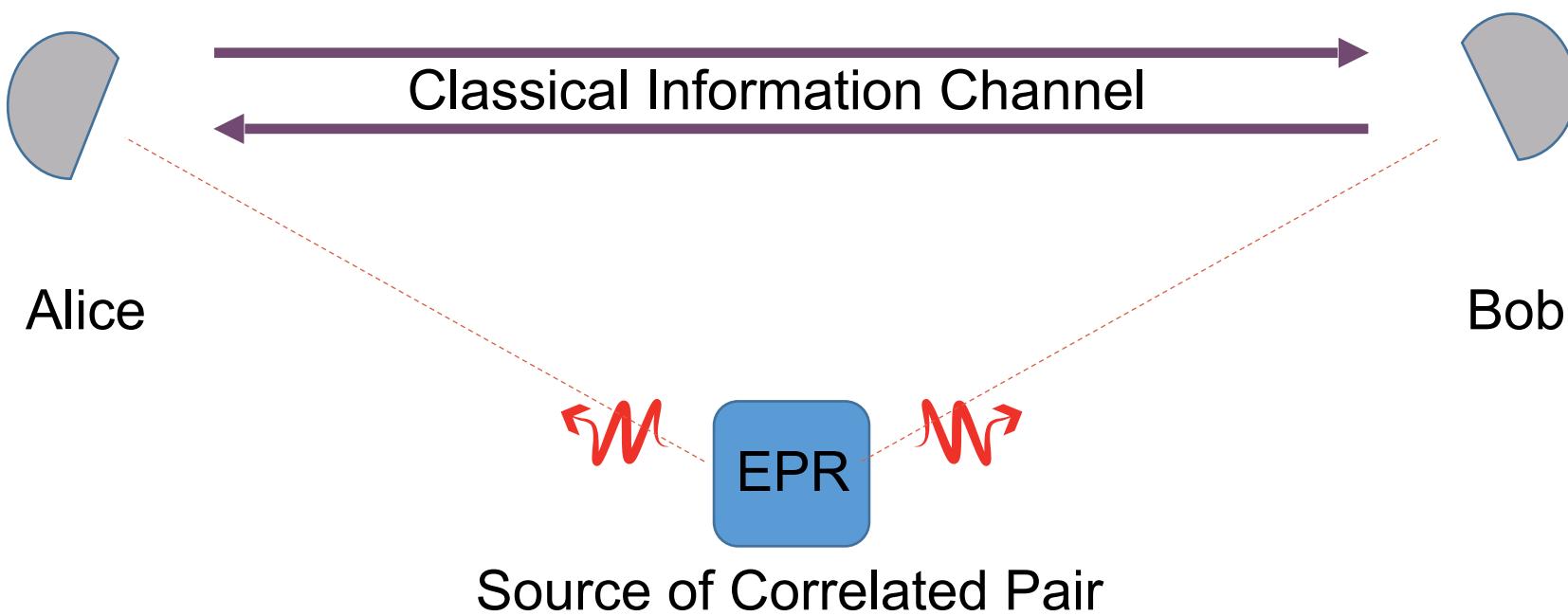
Quantum Communication

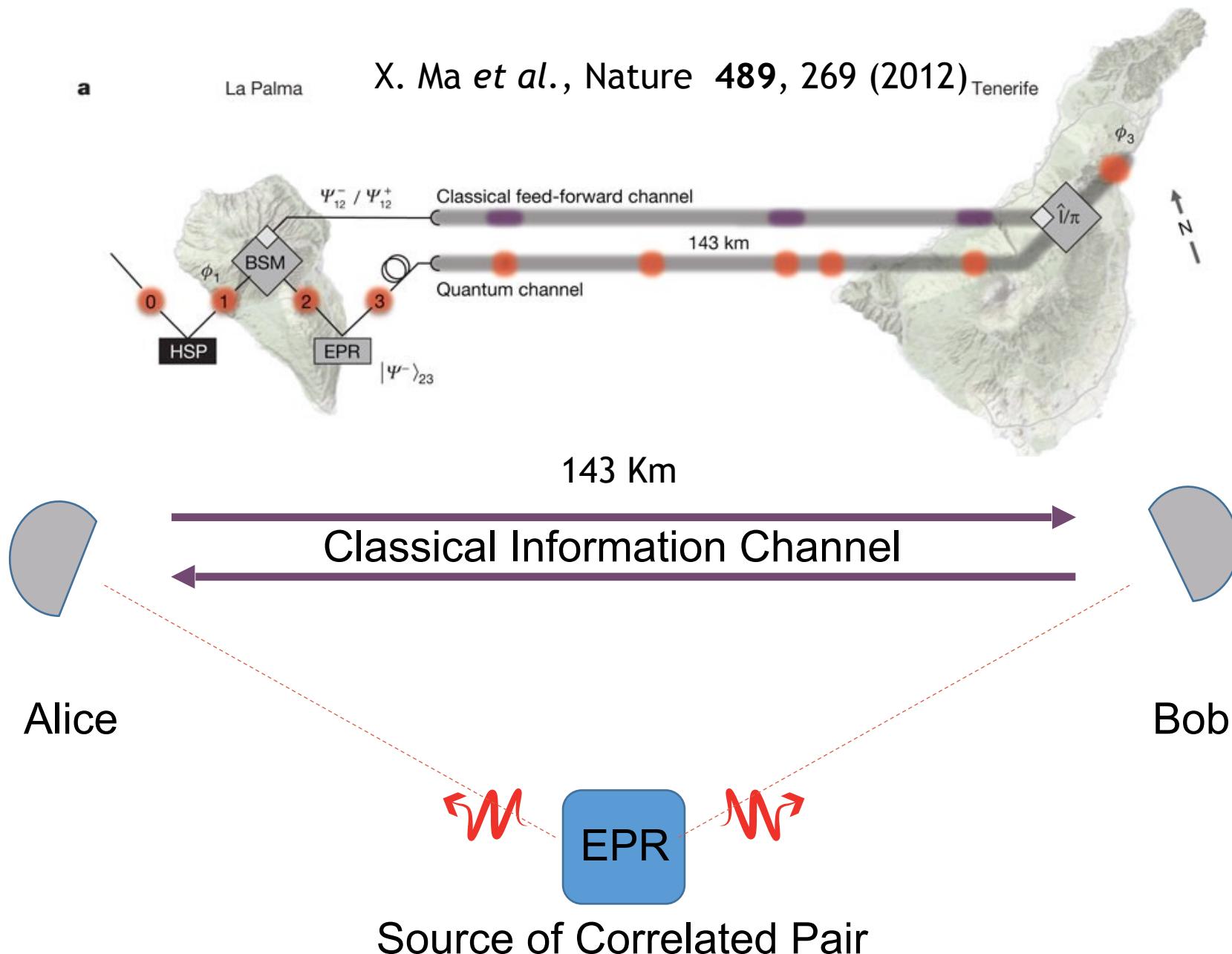


Quantum Communication

The record distance for quantum communication is ...

Quantum Communication



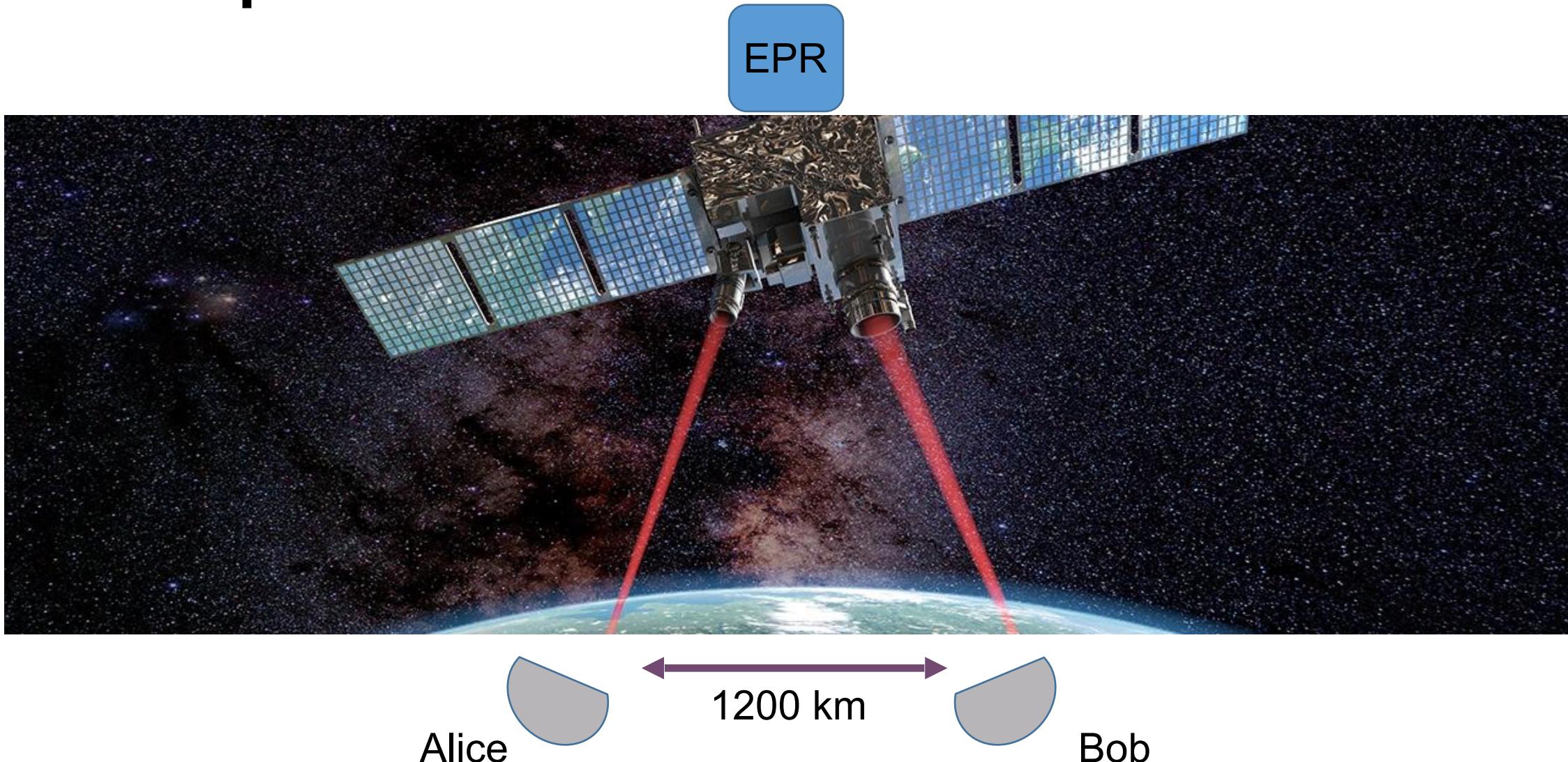
aX. Ma *et al.*, Nature 489, 269 (2012)

Space Quantum Communication



Micius

Space Quantum Communication



Quantum Technologies

- Quantum Computing
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- Quantum Sensing

1994: Shor's algorithm (prime factors)

1996: Grover's algorithm (search a database)

...

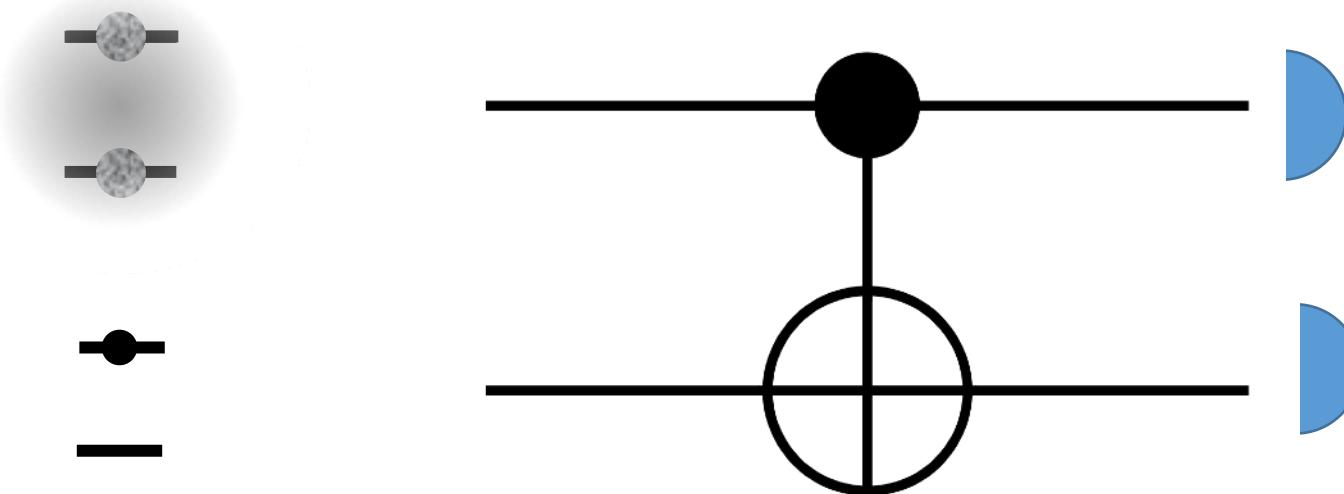
For more: <http://math.nist.gov/quantum/zoo/>

Error Correction

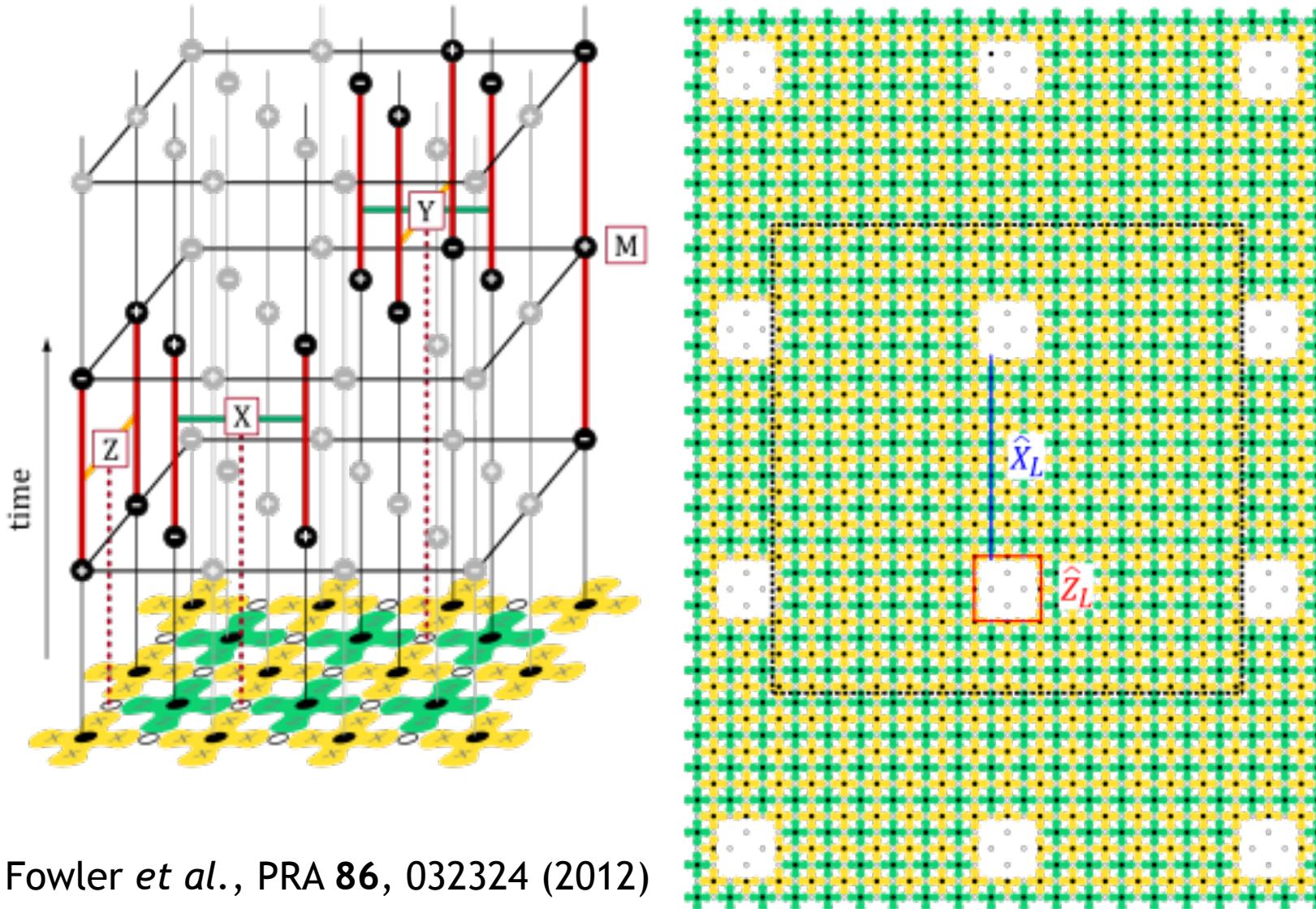
0
↓
1

000
↓
010
↓
000

Quantum Algorithm



Quantum Error Correction



A.G. Fowler *et al.*, PRA 86, 032324 (2012)

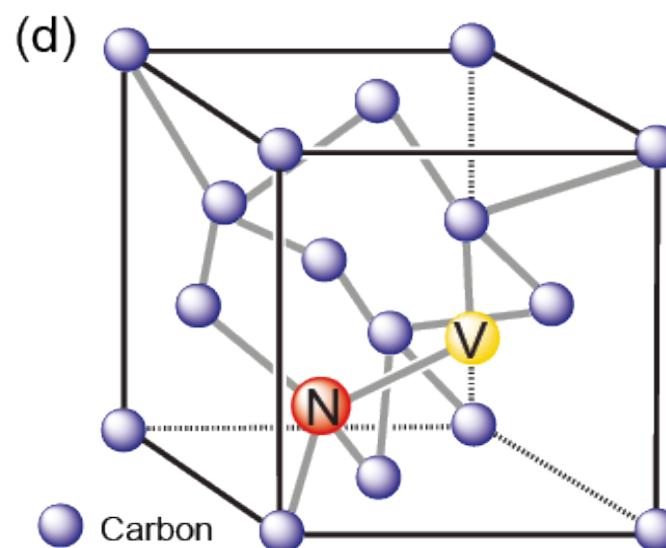
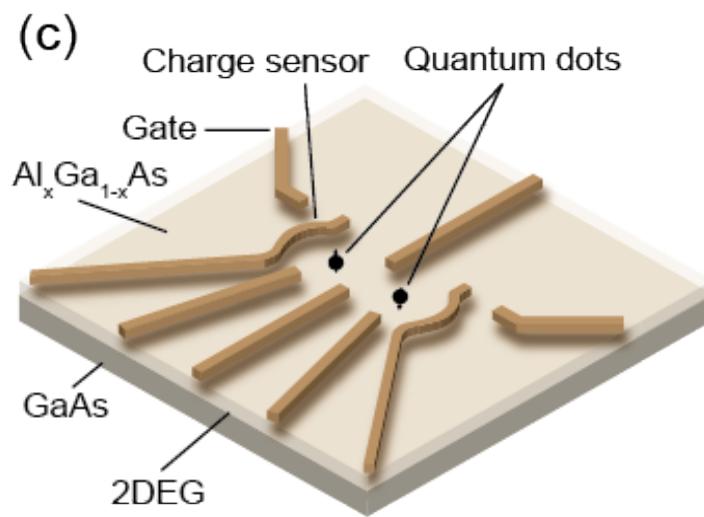
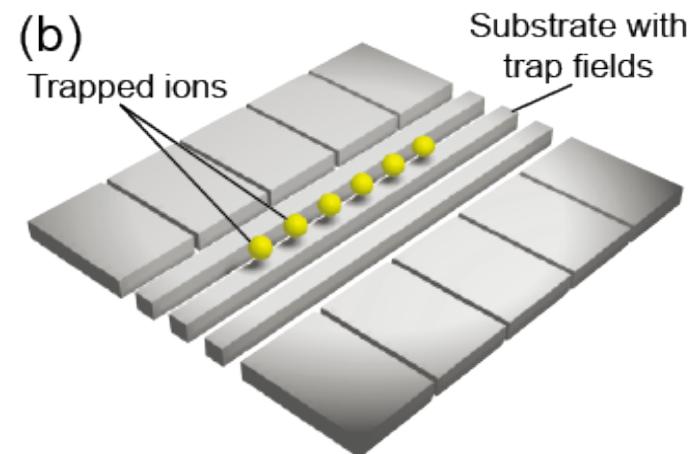
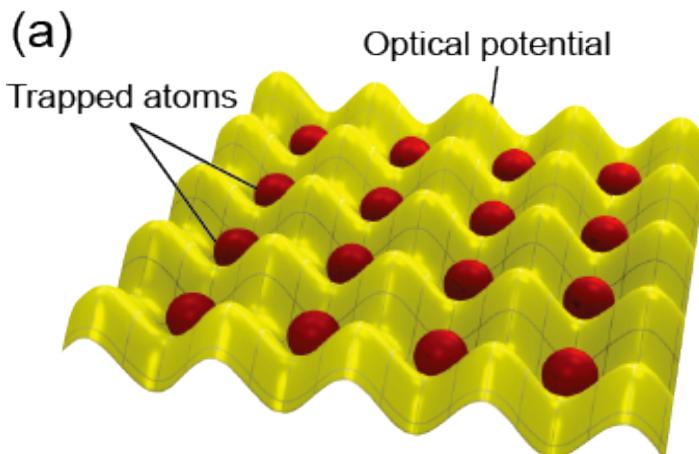
Quantum Error Correction

Logical and *physical* quantum bits

Millions of physical quantum bits

Now: 10 or so

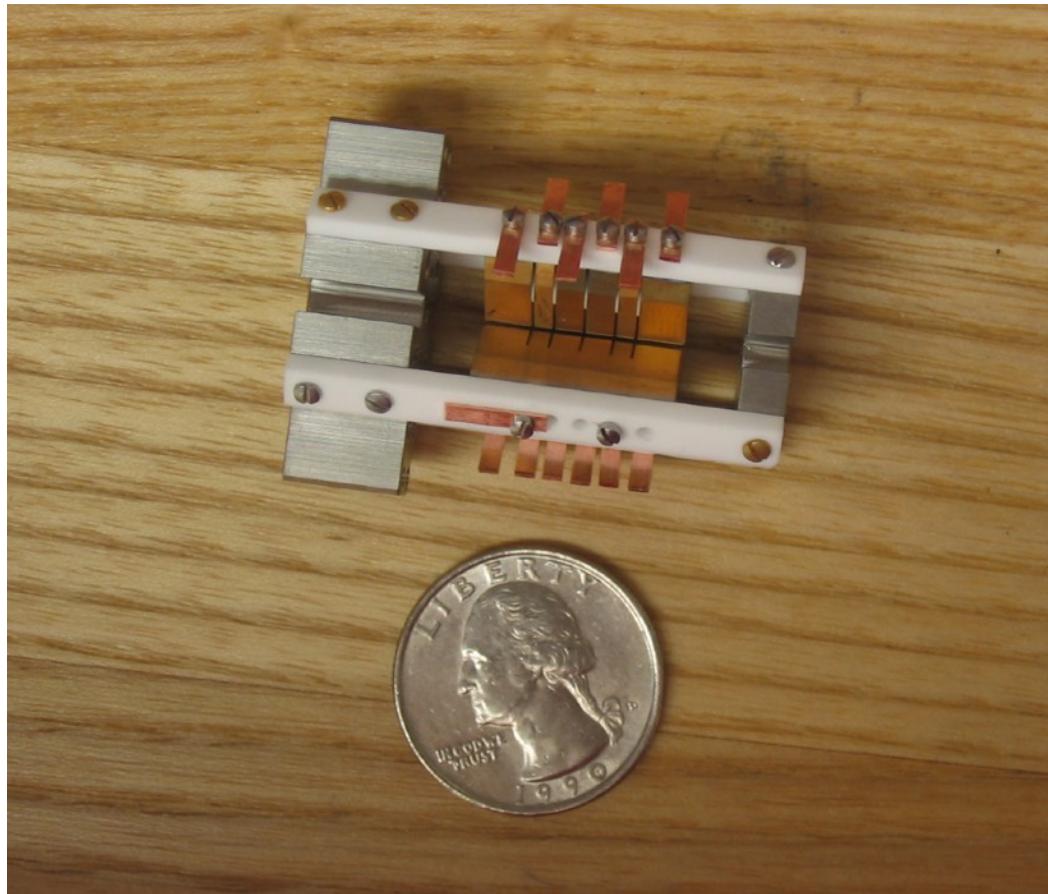
Quantum Simulation



Quantum Technologies

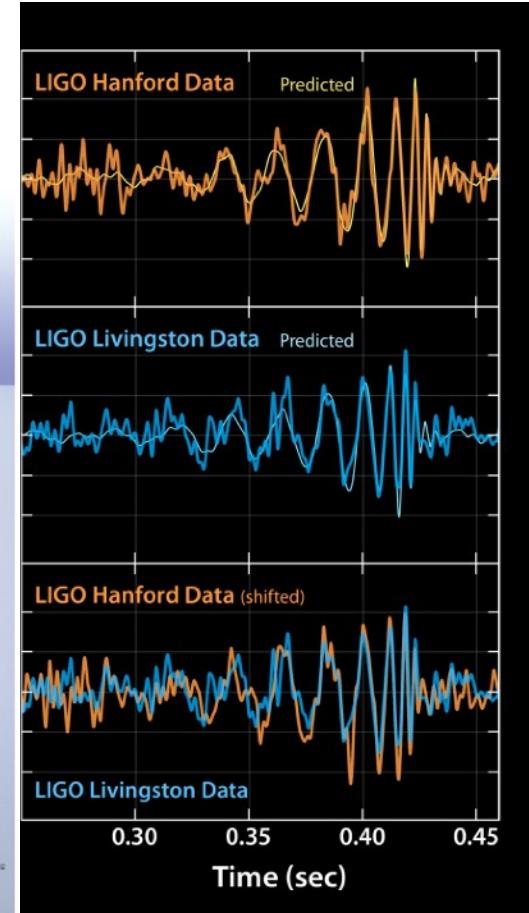
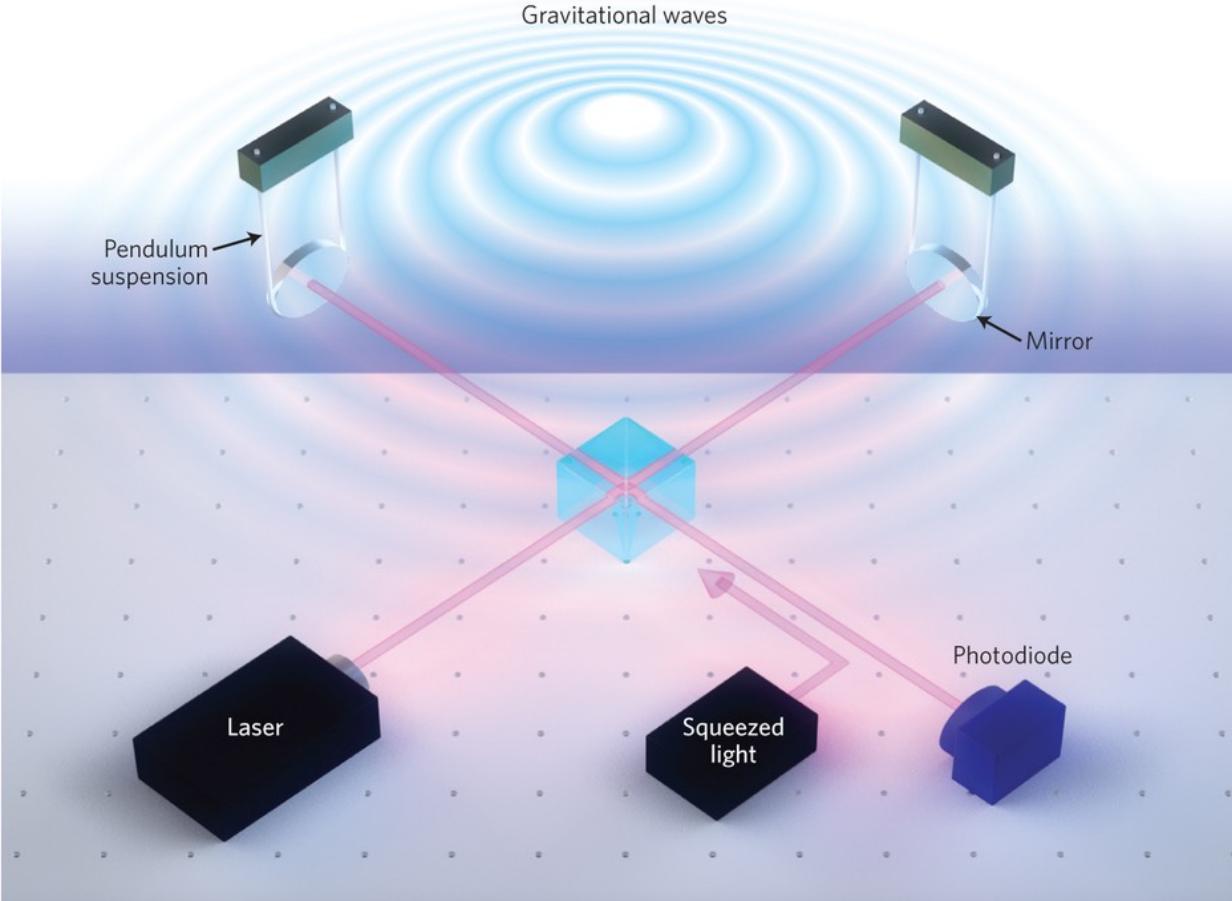
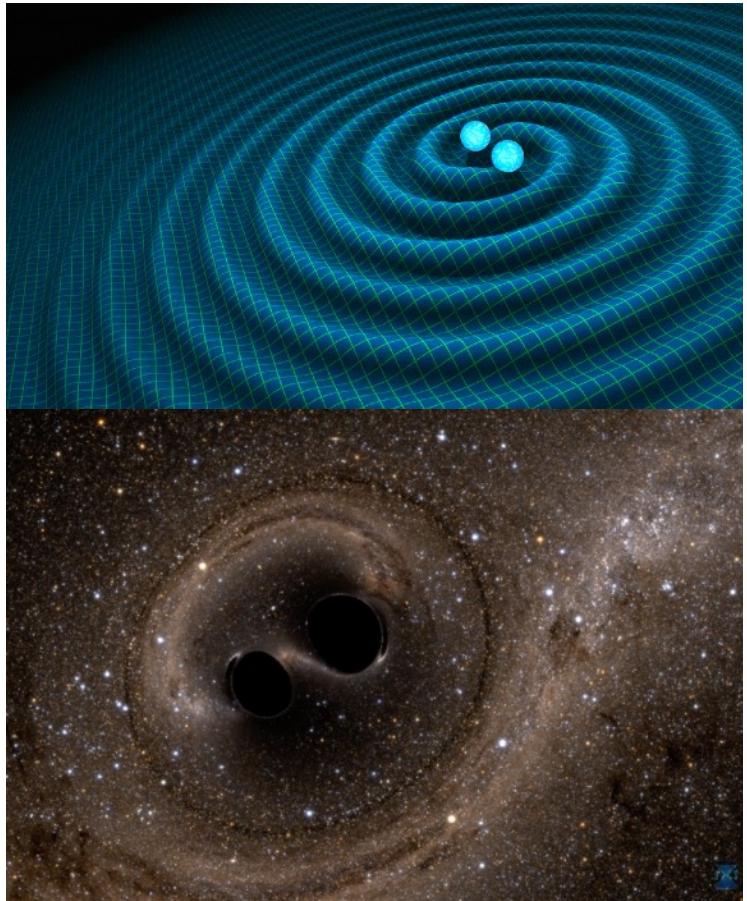
- Quantum Computing
- Quantum Communication
- Quantum Simulation
- Quantum Sensing

Quantum Sensors



Quantum Logic Clock - Time measurement

Quantum Sensors



Interferometry using squeezed light - Position measurement
Advanced LIGO Proposal (MIT)

Quantum Sensors

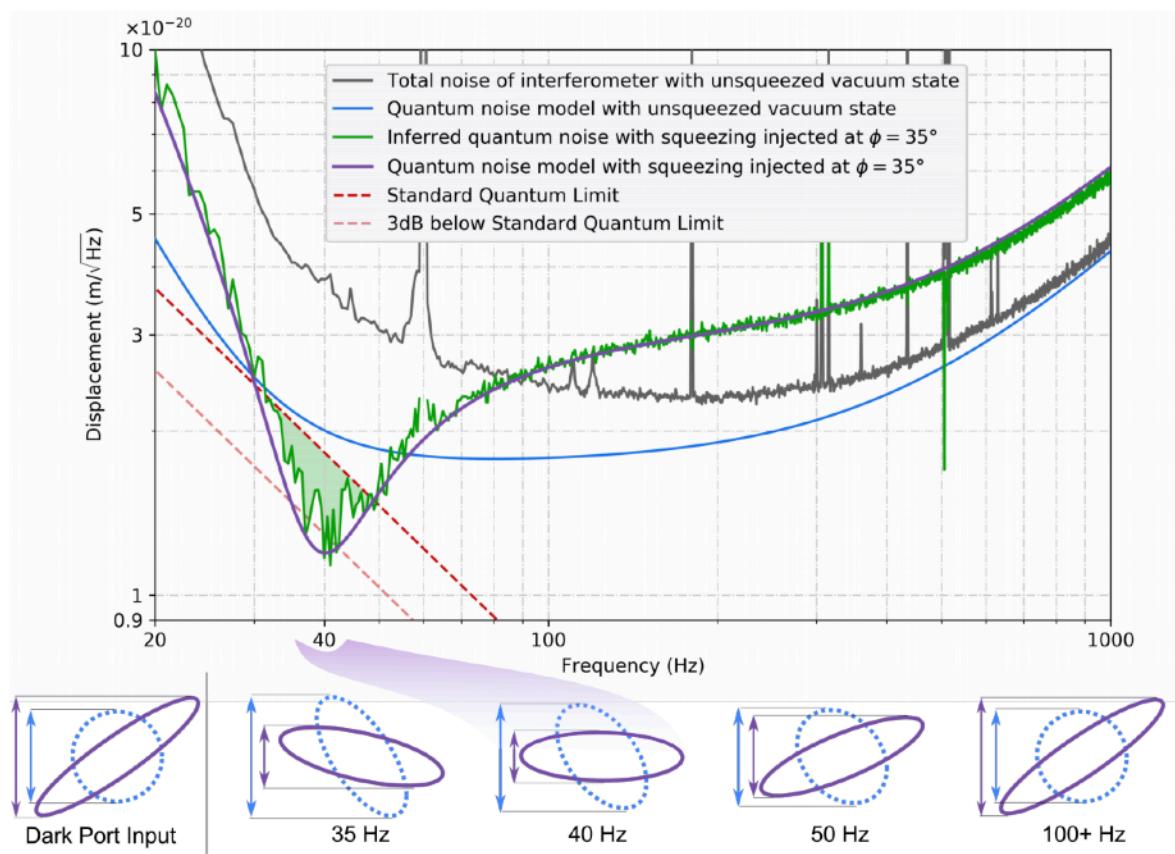
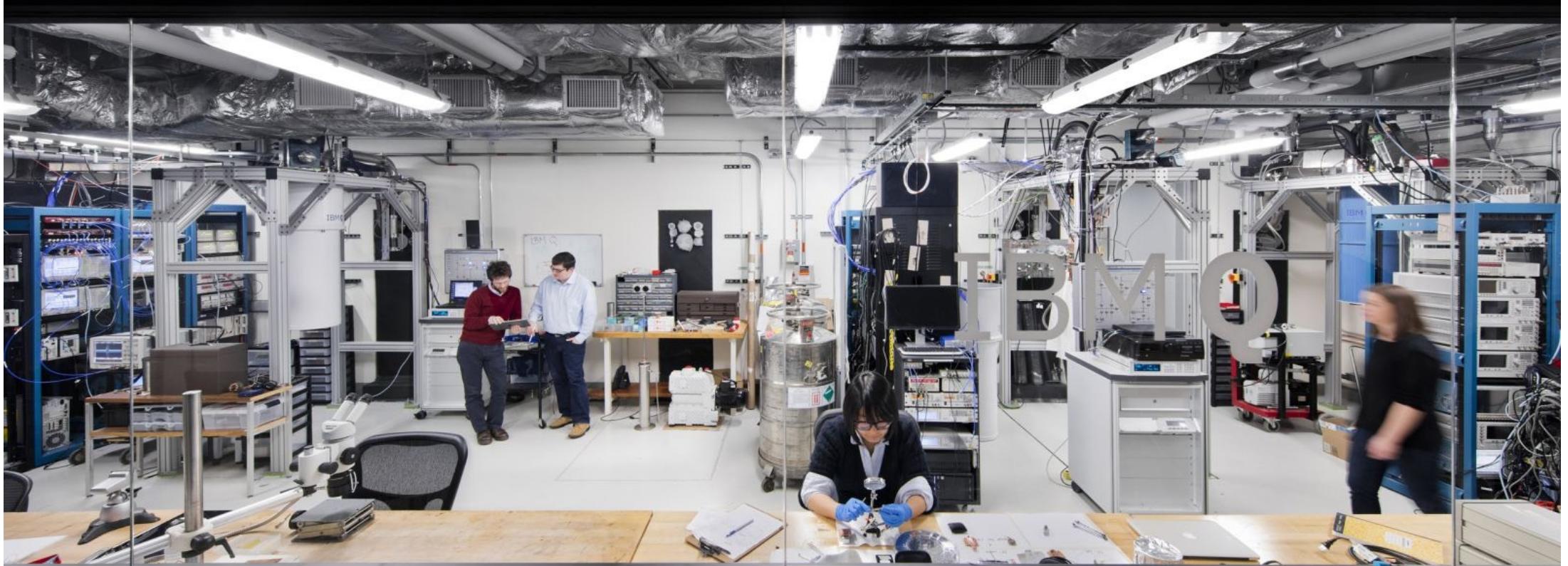


FIG. 2. Top: Differential displacement (Δx) noise spectral density of the interferometer. The grey trace shows the measured total noise level of the interferometer with unsqueezed vacuum state (i.e. the reference). The blue trace is the model of quantum noise during the reference measurement. The green trace shows the inferred quantum noise of the interferometer with injected squeezing at 35° , and its corresponding model is the purple trace. The notch feature, or “dip,” results from the ponderomotive squeezing affecting the injected optical squeezed states. It reaches -3 dB of the free-mass SQL (red dashed trace, given by Eqn. 3) at 40 Hz. Bottom: Phase-space representation of the modeled quantum states entering through the dark port of the interferometer (left) and the output states (right), which are indexed to indicate their frequency dependence. Drawn are the unsqueezed vacuum (dotted blue) and squeezing at $\phi=35^\circ$ (solid purple). In the unsqueezed vacuum case, ponderomotive squeezing distorts the ellipse for frequencies below 100 Hz, increasing QRPN in the readout quadrature (blue arrows). In the injected squeezing case, the same physical process creates a state with reduced noise at 40 Hz (purple arrows).

IBMQ





IBM Research



pyquil + Grove

<https://github.com/rigetticomputing/pyquil>
<https://github.com/rigetticomputing/grove>

Requires Python 2.7:

```
pip install pyquil  
pip install quantum-grove
```

Documented on readthedocs.io

Shown at QIP 2017 – From Microsoft Research YouTube channel

FOREST



> Introducing forest.rigetti.com : Tools for experimental quantum programming

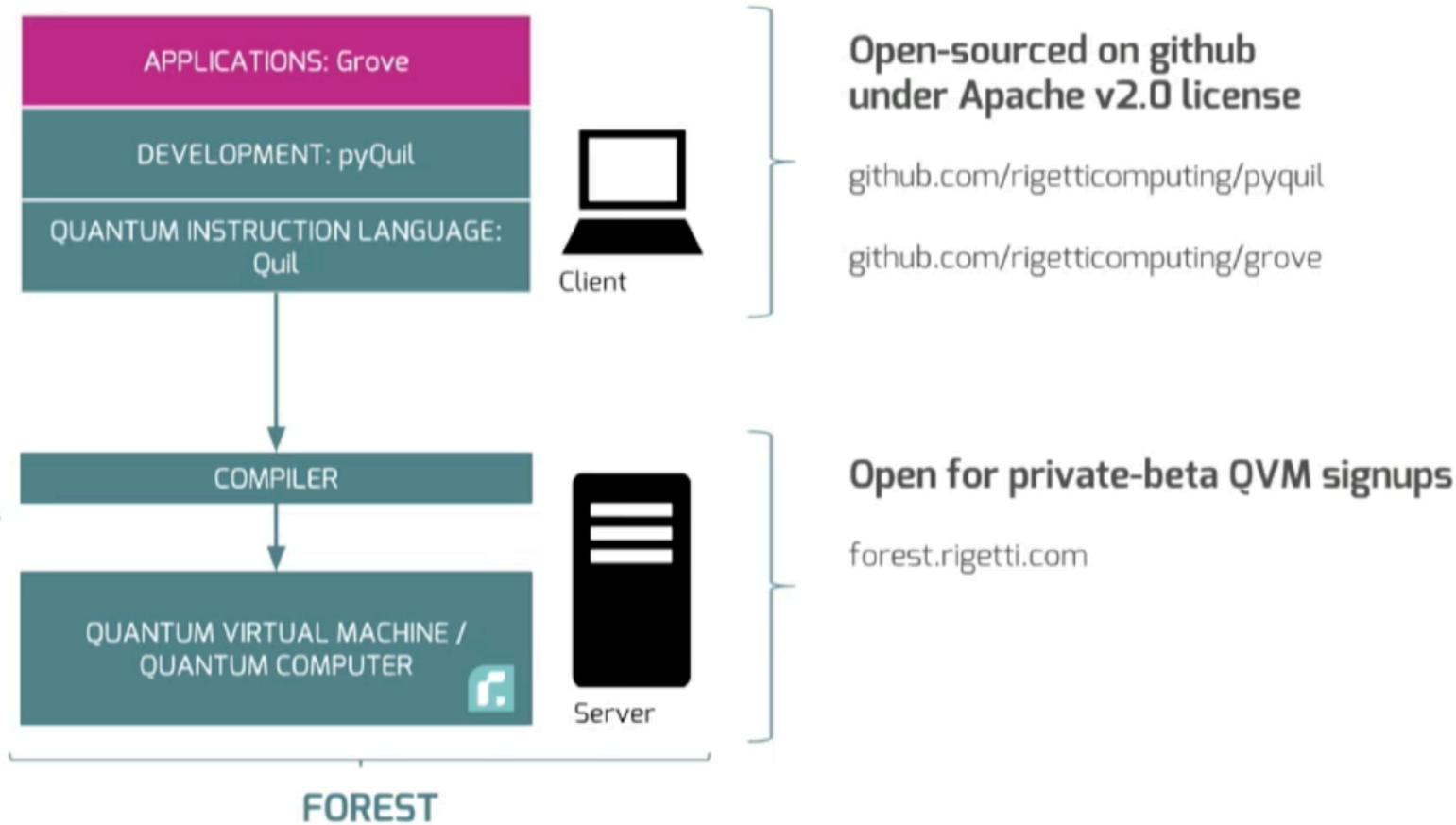
> Write applications...

> using tools...

> that build quantum programs...

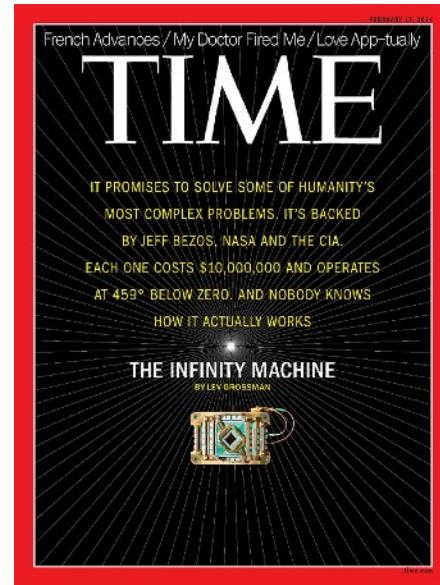
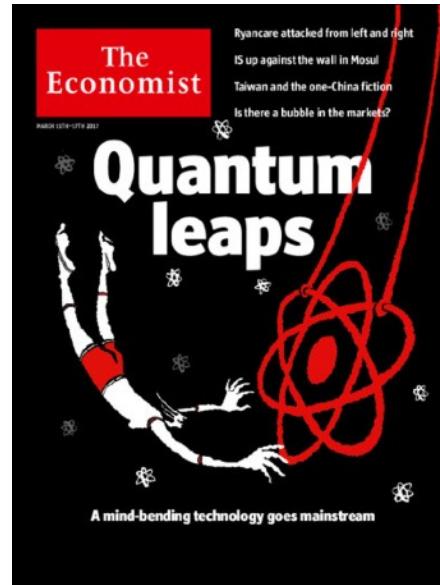
> that compile onto quantum hardware...

> that execute on a real or virtual quantum processor.



Shown at QIP 2017 – From Microsoft Research YouTube channel

The Economist, March 2017



€ 1 billion EU project (2018)



Japan R&D



ADVANCING QUANTUM INFORMATION SCIENCE:
NATIONAL CHALLENGES AND OPPORTUNITIES

A JOINT REPORT OF THE
Committee on Science and
Committee on Homeland and National Security
OF THE NATIONAL SCIENCE AND TECHNOLOGY COUNCIL

Produced by the
Interagency Working Group on Quantum Information Science
of the Subcommittee on Physical Sciences



July 2016

(2019)

Open Source

Quantum Tech: Quantum computing

Open-source and quantum technologies

NATURE | COMMENT



Commercialize quantum technologies in five years

Masoud Mohseni, Peter Read, Hartmut Neven, Sergio Boixo, Vasil Denchev,
Ryan Babbush, Austin Fowler, Vadim Smelyanskiy & John Martinis

03 March 2017



IBM adds new API to quantum computing cloud service

Posted yesterday by Ron Miller (@ron_miller)

A Recent Review:

Mark Fingerhuth, Tomáš Babej, and Peter Wittek,
Open source software in quantum computing,
PLoS ONE 13 (12): e0208561 (2019).

The screenshot shows the header of the Nature journal website. The title "nature" is prominently displayed, followed by "International weekly journal of science". Below the title is a navigation bar with links to Home, News & Comment, Research, Careers & Jobs, Current Issue, Archive, Audio & Video, and Forum. Underneath the navigation bar, the breadcrumb navigation shows "Archive > Volume 549 > Issue 7671 > Comment > Article".

NATURE | COMMENT



First quantum computers need smart software

Will Zeng, Blake Johnson, Robert Smith, Nick Rubin, Matt Reagor, Colm Ryan & Chad Rigetti

13 September 2017

Early devices must solve real-world problems, urge Will Zeng and colleagues.



PDF



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Subject terms: Quantum physics • Quantum information • Mathematics and computing •

Quantum Tech: Quantum Circuit Simulators

Open-Source Quantum Computing

	Language	Library	Quantum Compiler	Features
D-Wave	Python	qbsolv	Not a circuit-based computer	Optimization problems
IBM Q	Python	QISKit	20 qubits***	Thousands of experiments from the cloud by online users on the <i>IBM quantum experience</i>
Rigetti	Python; pyquil	Forest toolkit Grove	19 qubits*** 128 qubits*	Open to research collaborations. Proof-of-concept clustering
Google	Python	Cirq (simulation)	49 qubits*** 72-qubit SC chip: Bristlecone*	<i>Cirq</i> : an open-source platform for noisy quantum computing
Microsoft	Python; Q#	Liquid Quantum Dev Kit	NA	Topological quantum computing with Majorana particles
Alibaba	NA	NA	11-qubit SC chip* unknown architecture	Cloud computing announced

*announced only. *** limited connectivity

Quantum Tech: Quantum Circuit Simulators

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For the first time theorists can run online quantum experiments				
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Quantum Tech: Quantum Circuit Simulators

Open-Source Quantum Computing

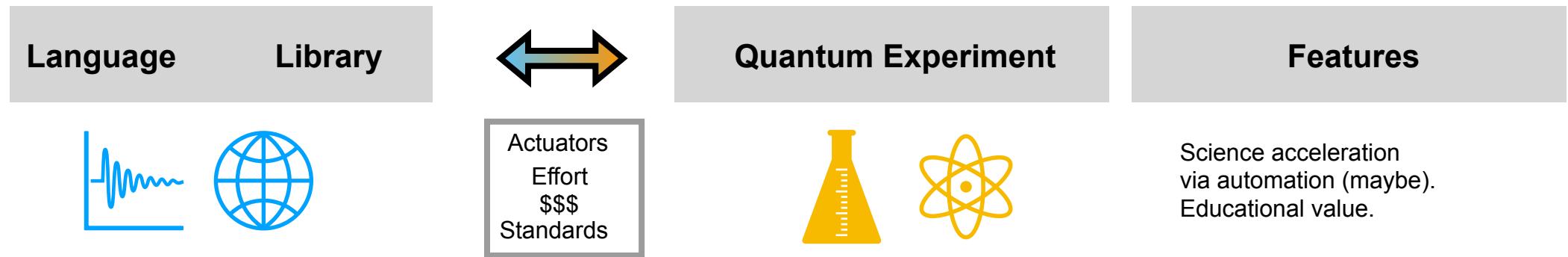
	Language	Library	Quantum Hardware	Features
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Google	Python	Cirq (simulation)	49 qubits*** 72-qubit SC chip: Bristlecone* 53-qubit SC chip: Sycamore*	<i>Cirq</i> : an open-source platform for noisy quantum computing Quantum supremacy
Microsoft	Python; Q#	Liquid Quantum Dev Kit	NA	Topological quantum computing with Majorana particles
Alibaba	NA	NA	11-qubit SC chip* unknown architecture	Cloud computing announced

*announced only. *** limited connectivity

Open-source cloud quantum labs

Extending the Open-Source Quantum Computing Paradigm

For the first time theorists can run online quantum experiments



Could academic institutions, physicists replicate this model?

Open Labs, Open Hardware

See: github.com/SteeleLab-Delft

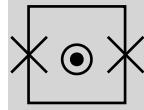


Quantum Tech: Quantum computing

Different platforms and hardware

Gate-based

Annealing



Superconducting circuits



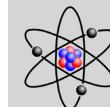
Trapped ions



Photonics



Spins



Neutral Atoms

Superconducting circuits

Advantages

15 years of exponential improvement in extending dephasing time (x10 / 3yrs).

'Perfect' qubits due to identical ions.
Long coherence time even @ room Temp.
Long-range interaction: Full connectivity.

'Flying' qubits for quantum internet.
Silicon integrated chips (CMOS industry).
Very long coherence time.

CMOS and SiMOS integration.
Long coherence time.
Up to room temperature qubits.

Atoms are identical components.
Long-range interactions.
Recently: two-Rydberg-atom entanglement.

Encode optimization problems.
No error correction required.

Challenges

Artificial atoms: defects, off-resonances.
Wiring leads to qubit cross-talk.
Requires cooling @ micro K Temp.

Photonic link/ion shuttling needed to create entanglement between distant modules.

Small interaction hampers two-qubit gates.
Hard to have identical photons on demand.
Requires interface for storing memory.

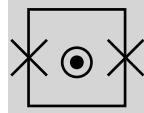
Charge and nuclear spin noise.
Weak interaction with controlling fields.

Hard to trap atom and control qubit.
Linear optics, low Temp required @ micro K.

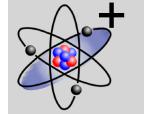
Not a universal quantum computer.
Unclear implementation of adiabatic QC.
Uncertain entanglement role and scalability.

Quantum Tech: Quantum *and* optical computing

Different platforms and hardware



Superconducting circuits

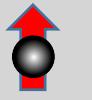


Trapped ions

Gate-based



Photonics



Spins



Neutral Atoms

Annealing

Superconducting circuits

Neuromorphic

Photonics

(classical, from quantum photonics community)

Startups

rigetti



IQM

Corporate

IBM Q

Microsoft



Google



Alibaba.com

Academia (selection)

**UCSB, U Berkley
Yale, ETH Zurich
RIKEN, NTT Labs**



IONQ

Alpine QT

**U Maryland, NIST
IQOQI, Oxford**

PsiQ



**U Bristol, Paris Telecom
Equus (Australia)**



**QuTech, U Chicago
UNSW, RIKEN**



**Harvard MIT, LMU Munich
NIST, U Chicago**

D-Wave
The Quantum Computing Company™



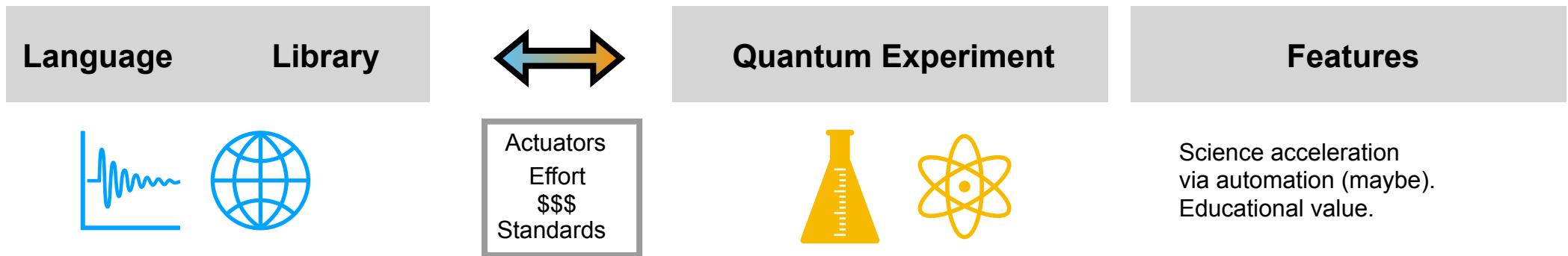
LIGHTMATTER
LightOn
LASOLV

**MIT, Stanford
RIKEN, JST**

Open-source cloud quantum labs

Copying Open-Source Quantum Computing

Could academic institutions, physicists replicate this model?

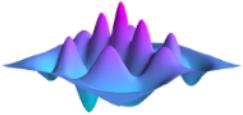


Open Labs

*announced only. *** limited connectivity

Quantum Tech: Open Source Libraries

More open-source is empowering broad research in the field

Library	Year	Creators	Institution	Language	Description
 QuTiP Quantum Toolbox in Python	2012	Rob Johannson Paul Nation Franco Nori	RIKEN	Python	Simulation of open quantum systems; quantum optics, cavity QED.
 QNet	2012	Nikolas Tezak, Michael Goerz Hideo Mabuchi	Stanford	Python	Computer algebra package for quantum mechanics and photonic quantum networks
 QuantumOptics.jl	2017	Sebastian Krämer <i>et al.</i>	U Innsbruck IQOQI	Julia	Quantum optics and open quantum systems framework inspired by the QO toolbox in Matlab and QuTiP
 ProjectQ	2016	Damian S. Steiger Thomas Häner Matthias Troyer	ETH Zurich	Python	Hardware-agnostic framework with compiler and simulator with emulation capabilities.
 OpenFermion	2017	Ryan Babbush <i>et al.</i>	Google (unofficial)	Python	Fermionic potential calculations for quantum chemistry
 NetKet	2018	Giuseppe Carleo	The Simons Foundation	C++ Python	Studying many-body quantum systems with artificial neural networks and ML techniques.
 STRAWBERRY FIELDS	2018	Nathan Killoran <i>et al.</i>	Xanadu Inc	Python	Photonic quantum computing with continuous-variable optical circuits

Checkout more open-source projects at <https://qosf.github.io>

Open-Source Quantum Technologies

In-house Research and Projects for the Ecosystem

Unitary Fund

1. microgrant program



2. Own research in-house



Team: Will Zeng, Andrea Mari, Ryan LaRose

Checkout funded open-source projects at <https://unitary.fund>

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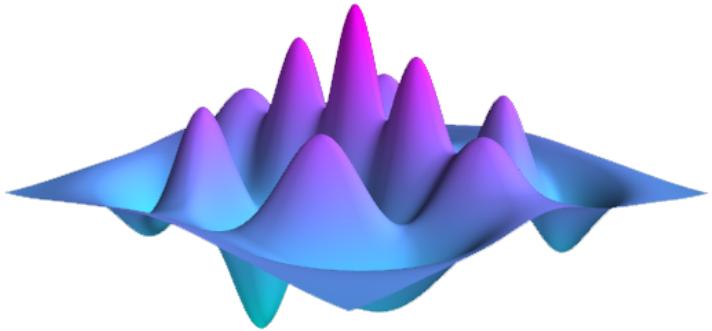
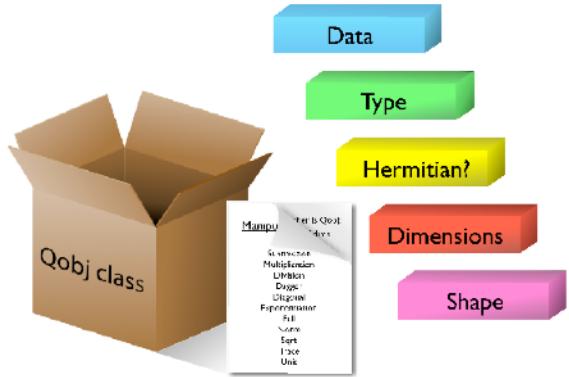


Team: Will Zeng, Andrea Mari, Ryan LaRose

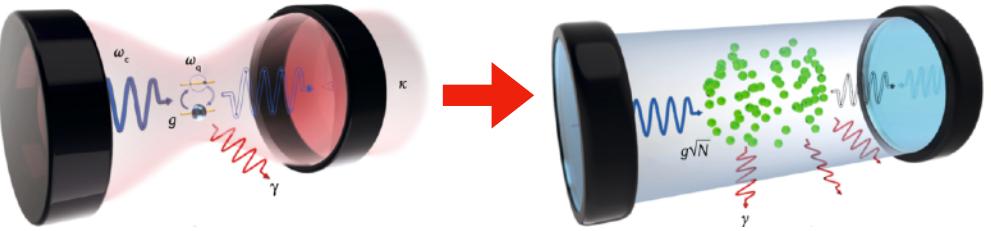
Checkout funded open-source projects at <https://unitary.fund>

QuTiP

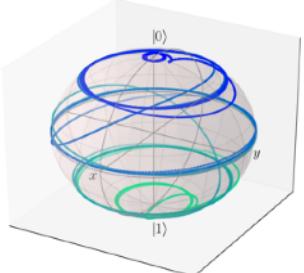
Python Classes full power



Many-body quantum dynamics



downloads 203k total

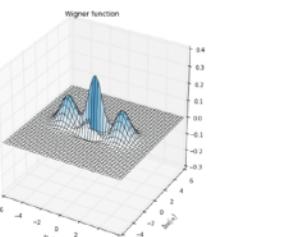
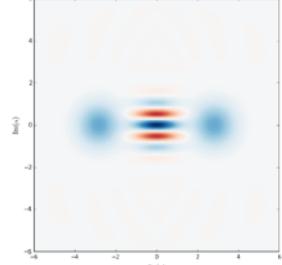


Take a snapshot



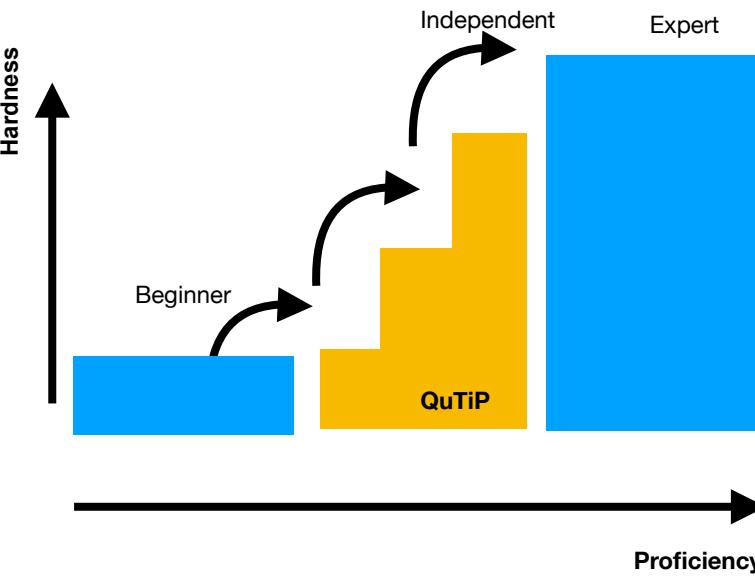
```
In [9]: psi = (coherent(N, -2.0) + coherent(N, 2.0)) / np.sqrt(2)
plot wigner 2d 3d(psi)
```

Out[9]: Wigner function



launch binder

Quantum mechanics made easy



- **Over 60** Jupyter notebook tutorials
 - **Over 20** quantum mechanics lectures

Python Introduction

- Quick Introduction to Python
 - Overview of NumPy Arrays
 - Brief Introduction to Matplotlib

For a more in depth discussion see: [Lectures on scientific computing with Python](#)

Python

- Introduction to QuTIP
 - Exponential series
 - Groundstates: Jaynes-Cummings model in the ultrastrong coupling regime

* Superoper

- Visualization demos
 - Energy-level diagrams
 - Bloch-sphere animation
 - Bloch Sphere with Colorbar
 - Wigner functions
 - Pseudo-probability functions
 - Process tomography
 - Quantum visualizations

Quantum information processing

- Quantum gates and circuits
 - Toffoli gate to CNOT
 - Spin Chain Qubit model

Time evolution

- Master equation solver: Qubit dynamics
 - Master equation solver: Vacuum Rabi oscillations
 - Master equation solver: Spin chain
 - Monte-Carlo solver: Trilinear oscillators
 - Monte-Carlo solver: Birth and Death of Photons in a Cavity
 - Bloch-Redfield master equation solver
 - Time-dependent Bloch-Redfield Quantum Dot
 - Flocquet formalism
 - Quasi-stationary of time-dependent (periodic) systems
 - Time-dependent master equation: Landau-Zener transitions
 - Time-dependent master equation: Landau-Zener-Stückelberg Interference
 - Stochastic master equation: Heterodyne detection
 - Stochastic master equation: Inefficient detection
 - Stochastic master equation: Jaynes-Cummings model with photocurrent detection
 - Stochastic master equation: Feedback control
 - Steady state solvers: Optomechanical system
 - Homodyned Jaynes-Cummings Emission

- Homodymed Jai

- Overview
 - Hadamard
 - QFT
 - Linebladian
 - Symplectic
 - QFT (CRAB)
 - state to state (CRAB)
 - CNOT
 - iSWAP
 - Single-qubit rotation
 - Toffoli gate

QuTiP: Empowering scientific research

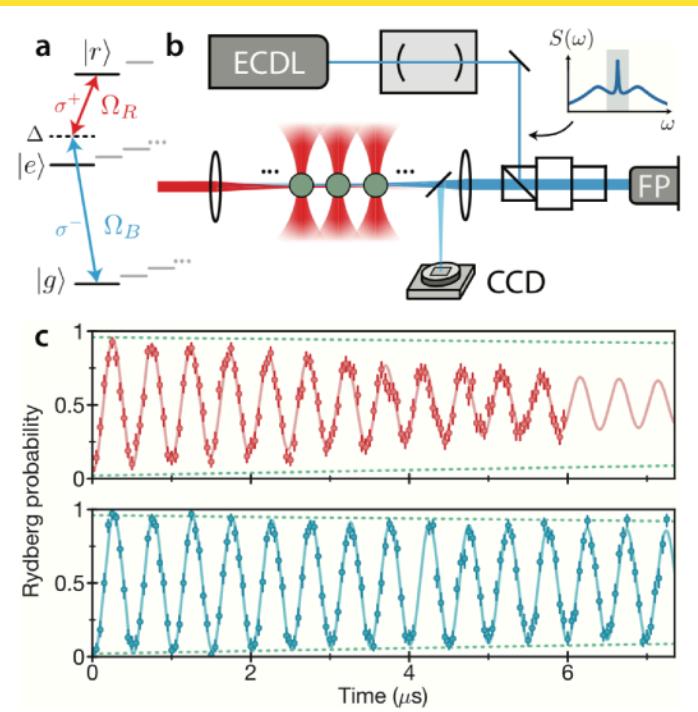
The Quantum Toolbox in Python

Experimental Research

arXiv:1806.04682v1 [quant-ph] 12 Jun 2018

High-fidelity control and entanglement of Rydberg atom qubits

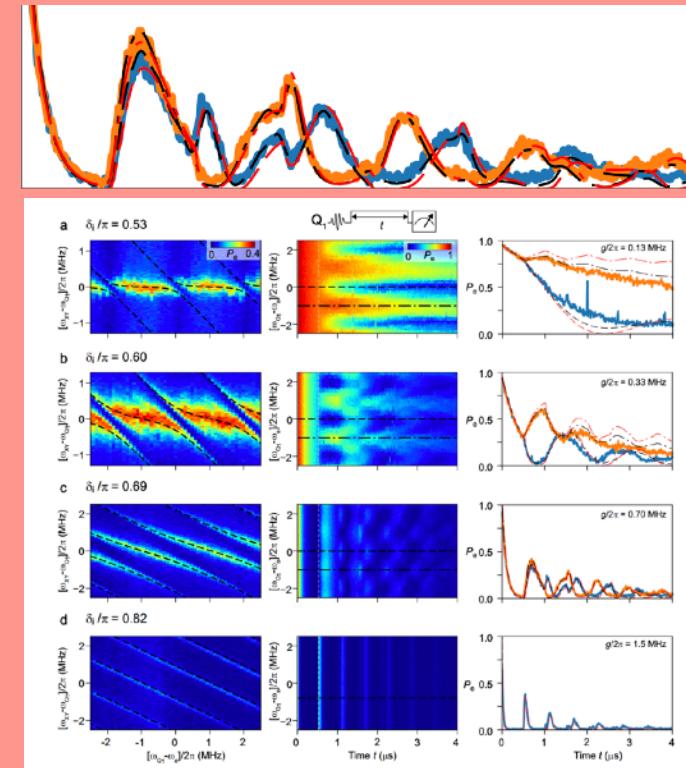
H. Levine, [...] and M.D. Lukin Phys. Rev. Lett (2018)



arXiv:1903.05672 [quant-ph] 13 Mar 2019

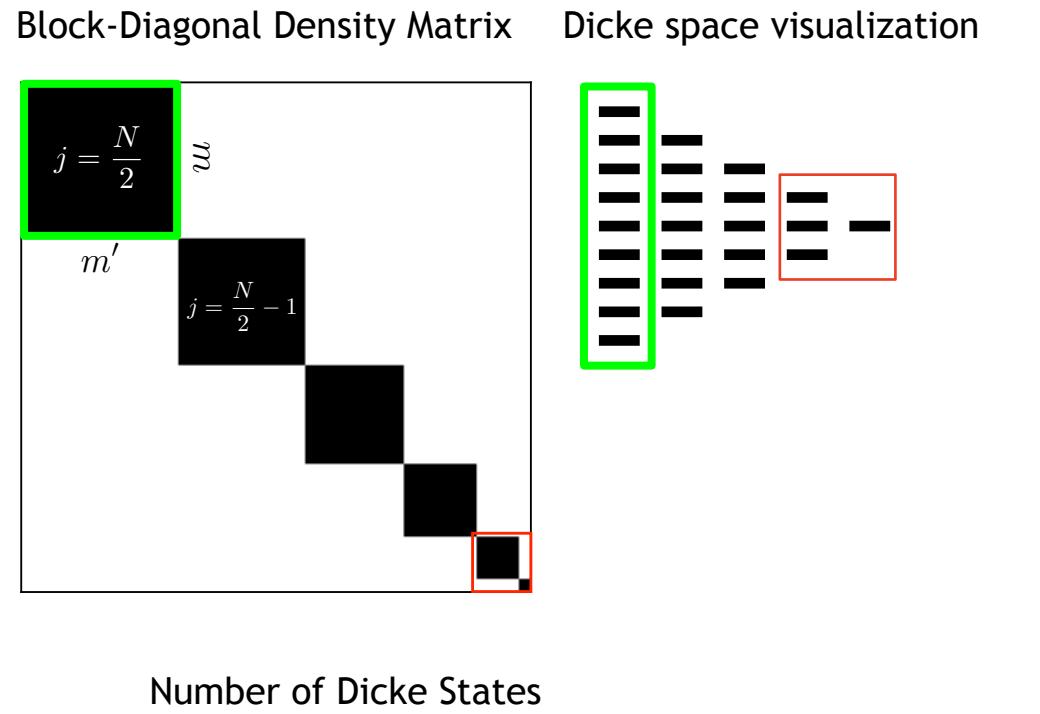
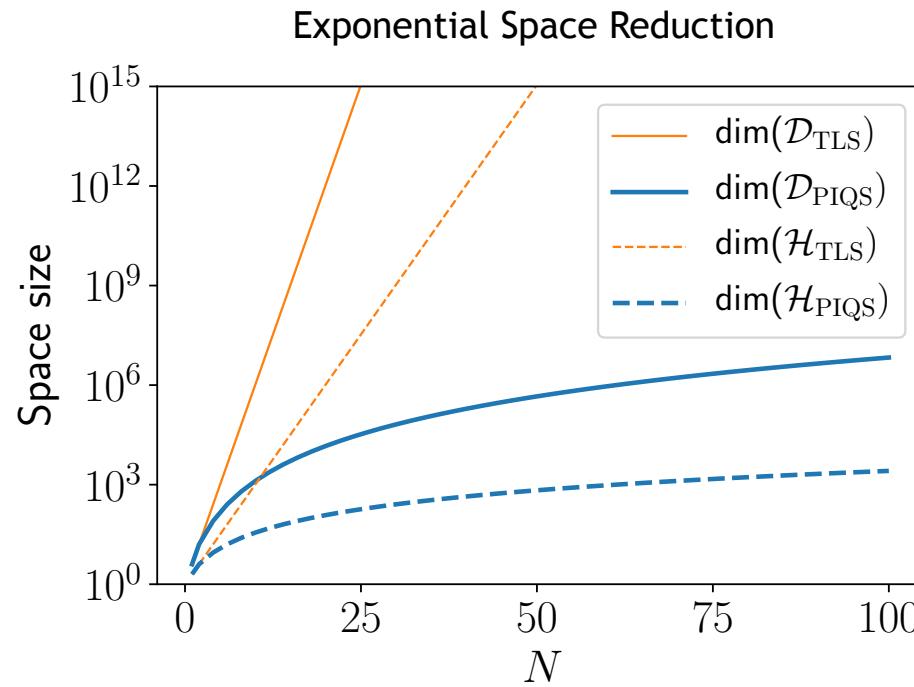
Phonon-mediated quantum state transfer and remote qubit entanglement

A. Bienfait, [...] and A.N. Cleland, Science **10**, 1126 (2019)



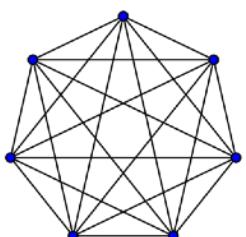
Permutational symmetric method in the Dicke space

Homogeneous local dissipation can be included in the dynamical model



Number of Dicke States

$$n_{\text{DS}}(N) = \sum_{j=0}^{N/2} (2j+1) = \left(\frac{N}{2} + 1\right)^2$$



Hamiltonian

Collective spin operators only
Complete graph (fully connected).
Constant edges weight: no lattice distance.

Dissipation

Homogeneous local couplings.

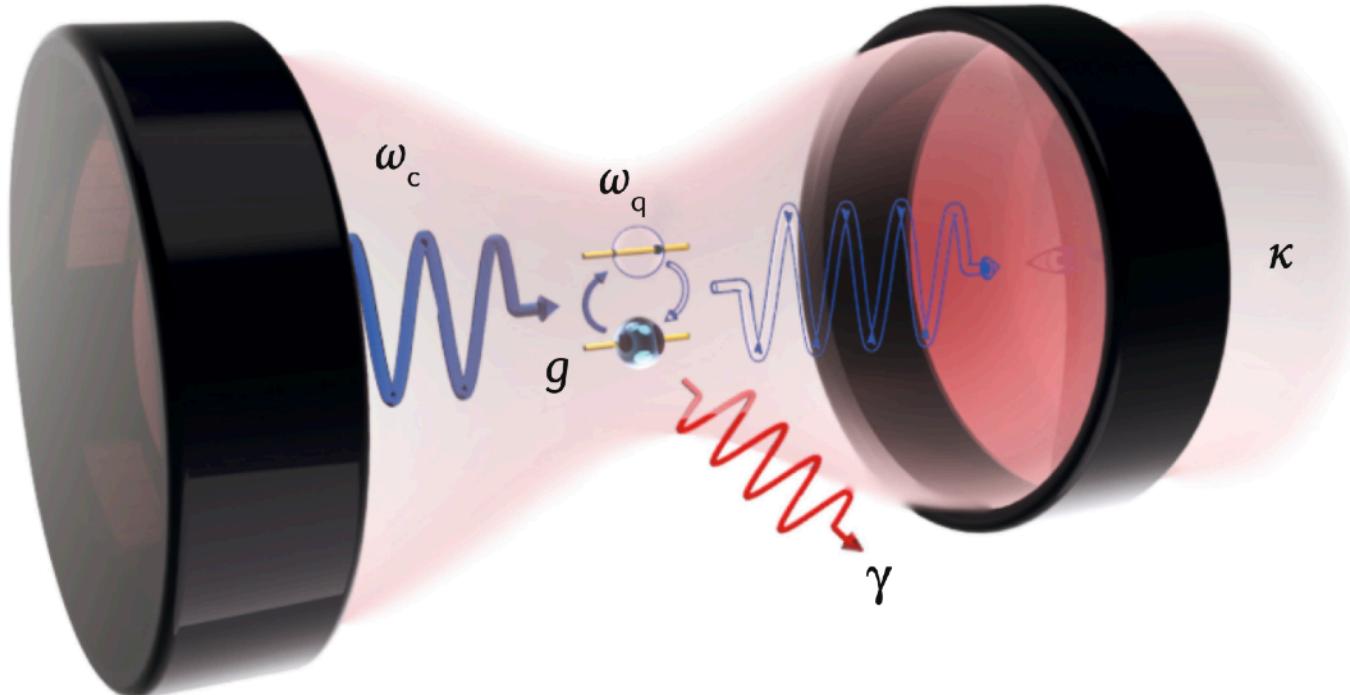
States

Limited to identical qubit states.

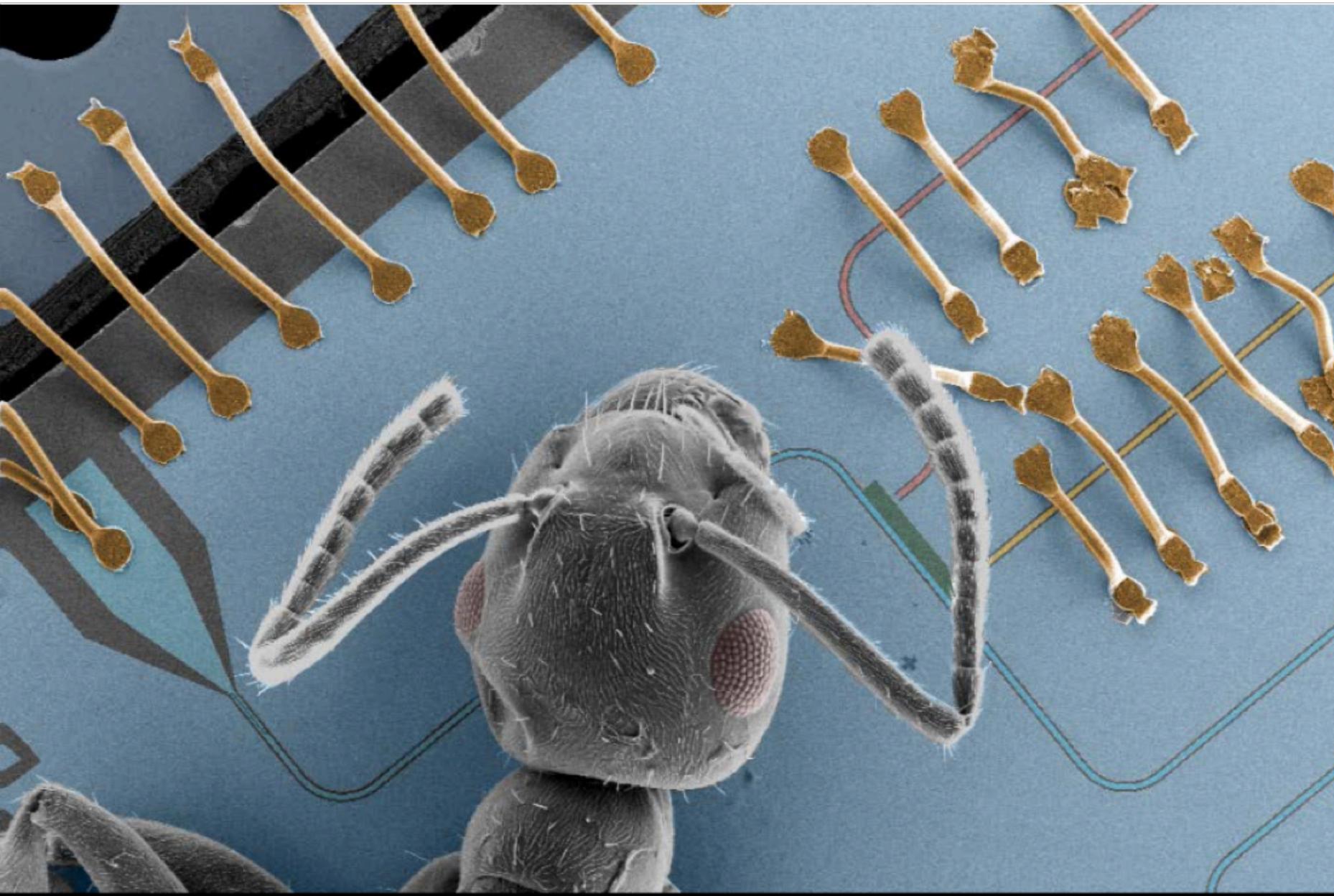
- B. A. Chase and J. M. Geremia, Phys. Rev. A **78**, 052101 (2008)
F. Damanet, D. Braun, and J. Martin, Rev. A **94**, 033838 (2016)
N. Shammah et al. Phys. Rev. A (2017)

Cavity Quantum Electrodynamics (Cavity QED)

Using the **Quantum Toolbox** in Python to study physics



A. F. Kockum, A. Miranowicz, S. De Liberato, S. Savasta & Franco Nori, Nature Reviews Physics, 1 19 (2019)



ETH

Eidgenössische Technische Hochschule Zürich
Swiss Federal Institute of Technology Zurich

J. Mlynek *et al.*, Quantum Device Lab, ETH Zurich (2012)

QuTiP: A Growing Ecosystem for Quantum Physics

What's going on

- 2018: Joined NumFOCUS, foundation for scientific code (NumPy)



- 2019: Participating to Google Summer of Code 2019:

Student Applications opened March 26th. Closed April 9th. 3 students working on summer projects.

2019: Applied to 1st Google Season of Docs 2019: Technical writers projects for documentation.



Google
Summer of Code

downloads 203k total (conda forge)

- 2018-2019: Reaching out to the sci-dev community.

EuroScipy 2018
July 2018
Trento, Italy

PyData 2018
November 2018
Warsaw, Poland

FOSDEM'19 (Quantum Computing)
February 2, 2019,
Brussels, Belgium

1st QuTiP developers workshop
February 19-21, 2019
RIKEN, Wako, Japan

EuroScipy 2019
September 2019
Bilbao, Spain

- 2018-2019: A growing QuTiP ecosystem of satellite libraries:

piqs

QuTiP library
Now a qutip module

krotov

QuTiP-based quantum
optimal control library

matsubara

A qutip plugin for
non-Markovian dynamics

QuTiP ecosystem:
Like AstroPy,
but for Quantum

New in QuTiP 4.5.0 (2020): Noisy Quantum Circuits

qutip.nisq

Model noise in quantum information processing (QIP)

QuTiP's QIP module represents ideal quantum circuits.

Student: Boxi Li (ETH Zurich)

Objectives:

- Go beyond gates as instantaneous unitary transformation
- Noise model for realistic devices
- Noise model for dissipative dynamics

Deployed results:

- Added Mølmer-Sørensen gate
- Allowed user-defined gates
- Added optical pulses for gate shaping

Code: Boxi Li. Github: [BoxiLi](#)

Mentors: Alex Pitchford,
Neill Lambert,
Shahnawaz Ahmed,
Nathan Shammah



piqs

QuTiP library
Now a qutip module

krotov

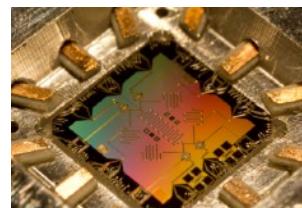
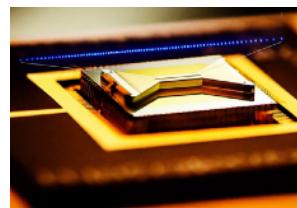
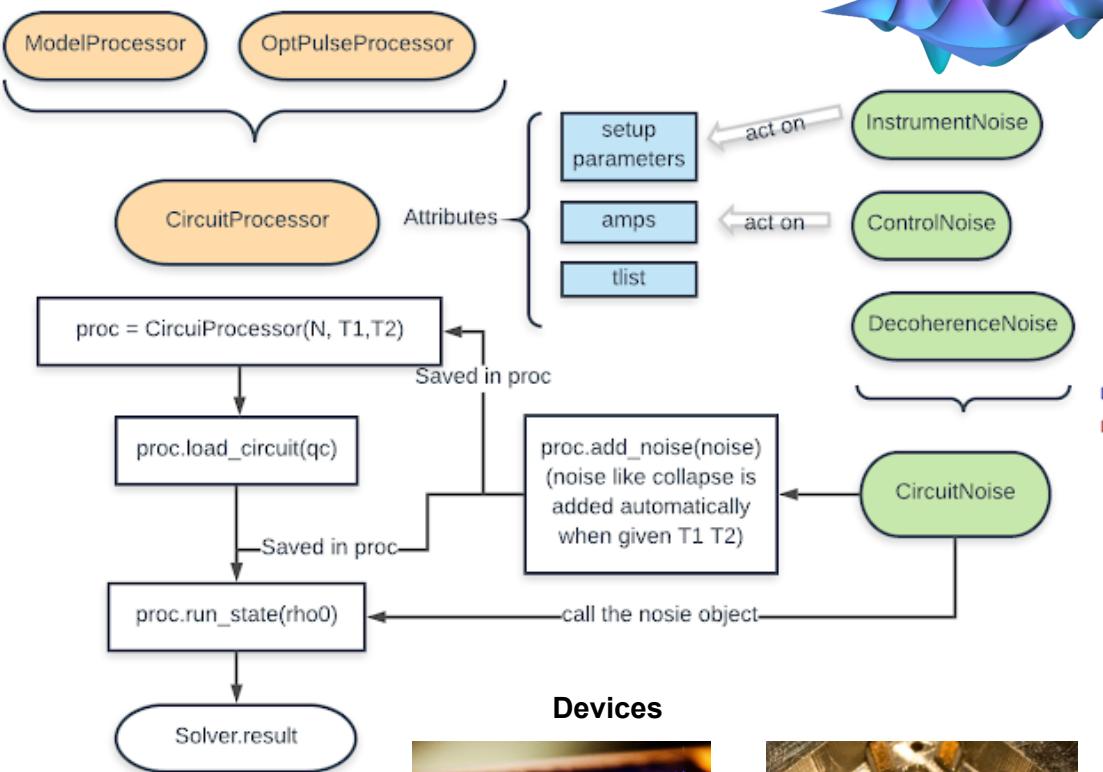
QuTiP-based quantum optimal control library

matsubara

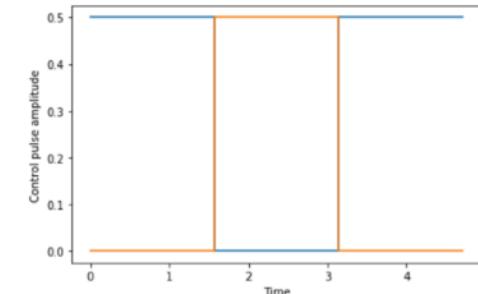
A qutip plugin for non-Markovian dynamics

qutip.noise

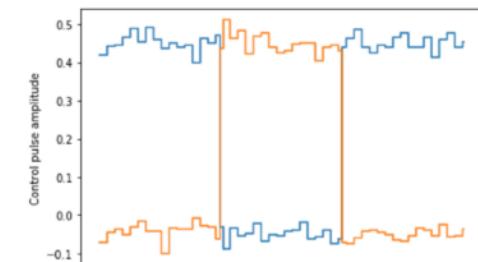
Noisy quantum circuits using QuTiP solvers



Perfect Unitary



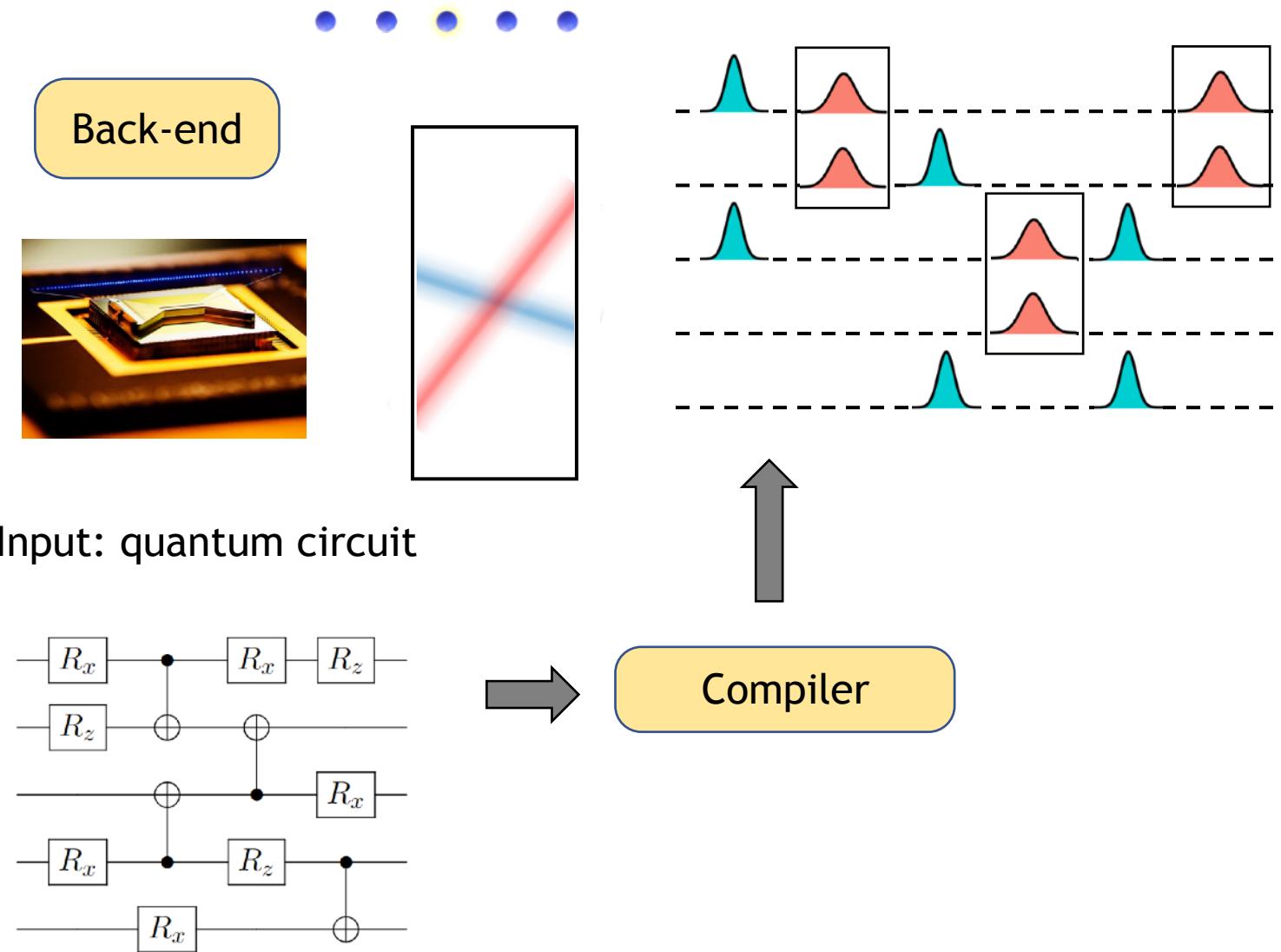
```
[20]: processor_white.plot_pulses(noisy=True)
[20]: <Figure size 432x288 with 1 Axes,
<matplotlib.axes._subplots.AxesSubplot at 0x269999bb710>
```



Noisy pulses

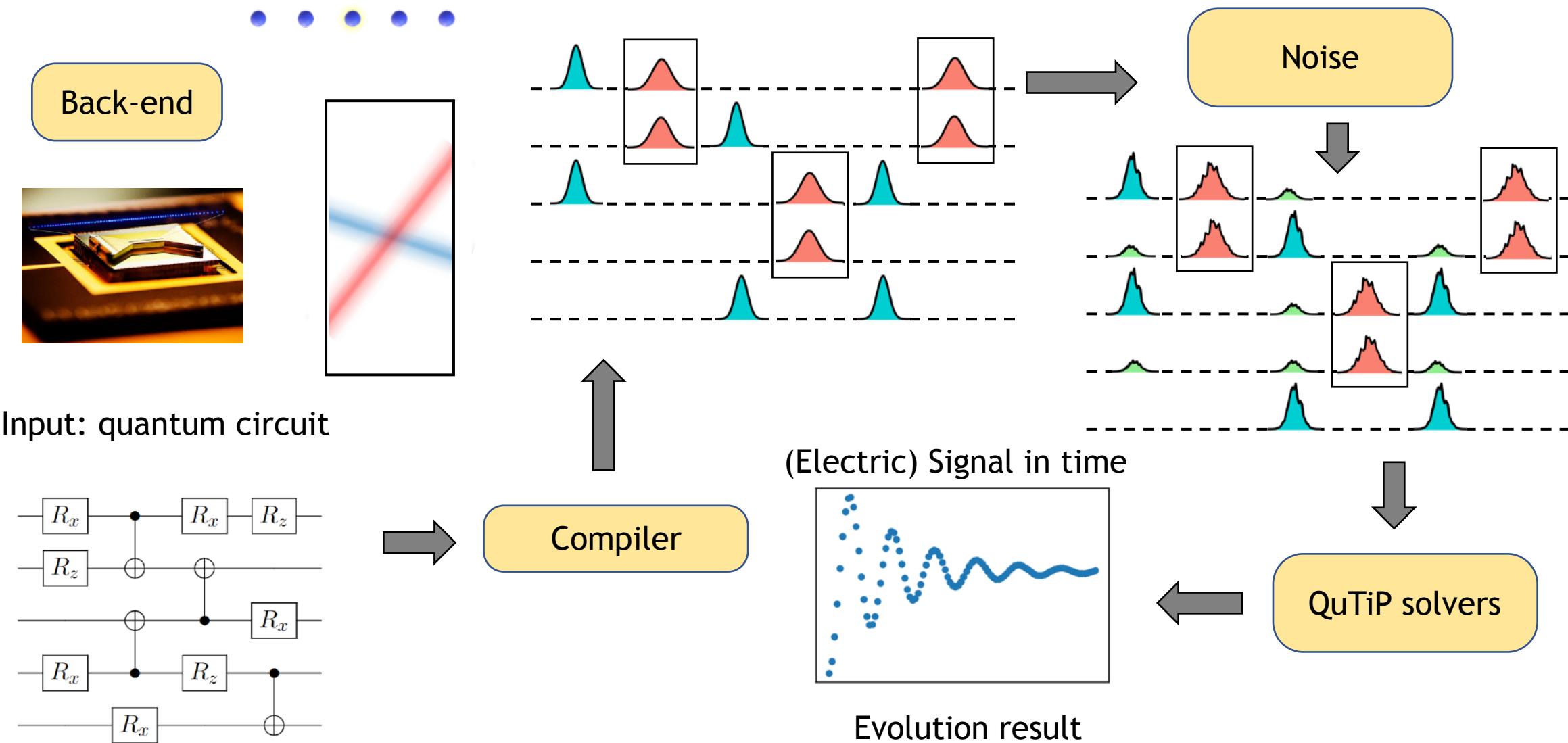
New in QuTiP 4.5.0 (2020): Noisy Quantum Circuits

Boxi Li (ETH Zurich)



New in QuTiP 4.5.0 (2020): Noisy Quantum Circuits

Boxi Li (ETH Zurich)



QuTiP project



Paul Nation



Robert Johansson

Johansson, J. Robert, P. D. Nation, and Franco Nori. "QuTiP: An open-source Python framework for the dynamics of open quantum systems." *Computer Physics Communications* 183.8 (2012): 1760-1772.

Johansson, J. Robert, Paul D. Nation, and Franco Nori. "QuTiP 2: A Python framework for the dynamics of open quantum systems." *Computer Physics Communications* 184.4 (2013): 1234-1240.

Chris Granade, Arne Grimsmo, +60 contributors



日本学術振興会
Japan Society for the Promotion of Science



Japan Science and
Technology Agency
Q-LEAP

NUMFOCUS
OPEN CODE = BETTER SCIENCE

Google
Summer of Code

UNIVERSITÉ DE
SHERBROOKE



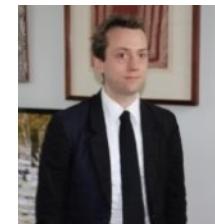
Franco Nori's Group



Shahnawaz Ahmed
Chalmers, Sweden



Alex Pitchford
Aberystwyth University
United Kingdom



Eric Giguère
U. de Sherbrooke
Canada



Nathan Shammah
RIKEN, Japan
Unitary Fund, USA



Neill Lambert
RIKEN, Japan

PRIFYSGOL
ABERYSTWYTH
UNIVERSITY

Machine Learning

Quantum Technologies

Quantum Tech: Open Source Libraries

More open-source is empowering broad research in the field

The screenshot shows the 'Quantum machine learning' section of the PennyLane website. At the top, there's a navigation bar with links for 'PENNYLANE', 'Quantum machine learning' (which is underlined), 'Install', 'Plugins', and 'Documentation'. Below the navigation is a banner with the text: 'Take a deeper dive into quantum machine learning by exploring cutting-edge algorithms using PennyLane and near-term quantum hardware.' The main content area displays a grid of 12 cards, each representing a different implementation:

- XANADU** logo
- State preparation with Rigetti Forest + PyTorch**: An image of a 3D surface plot.
- 3-qubit Ising model in PyTorch**: An image of three spheres with arrows.
- Quantum Generative Adversarial Networks with Cirq + TensorFlow**: A diagram showing data flow from 'Raw data' through 'Encoder' (labeled R), 'Generator' (labeled G), and 'Discriminator' (labeled D) to 'Fake' data.
- Variational classifier**: A 2D scatter plot with a decision boundary.
- Function fitting with a quantum neural network**: A 2D plot showing a function fit.
- Variational quantum eigensolver**: A 3D surface plot.
- Data-reuploading classifier**: A diagram showing a circuit with three layers labeled A, B, and C.
- Quantum natural gradient**: A diagram showing a green elliptical contour with axes labeled ϕ_1 and ϕ_2 .
- QAOA for MaxCut**: A diagram of a graph with nodes A, B, 0, 1, 2, 3 and edges connecting them.
- Barren plateaus in quantum neural networks**: A diagram of a quantum circuit and a 3D surface plot.
- Quantum circuit structure learning**: A diagram of a quantum circuit with two blocks labeled $U(\theta_1, P_1)$ and $U(\theta_2, P_2)$.
- Doubly stochastic gradient descent**: A 2D plot showing a curve with points and a mathematical expression for the Hamiltonian: $H = x \otimes x + 5z \otimes x + 2z \otimes z$.

<https://pennylane.ai/qml/implementations.html>

Machine Learning and Quantum do not commute

Define: Commutator

$$[A, B] = AB - BA$$

$$[\mathbf{ML}, \textit{Quantum}] \neq 0$$

MLQ

Machine Learning of Quantum Systems

Apply “standard” Machine Learning to
Study Quantum Physics Systems

QML

Quantum-enhanced Machine Learning

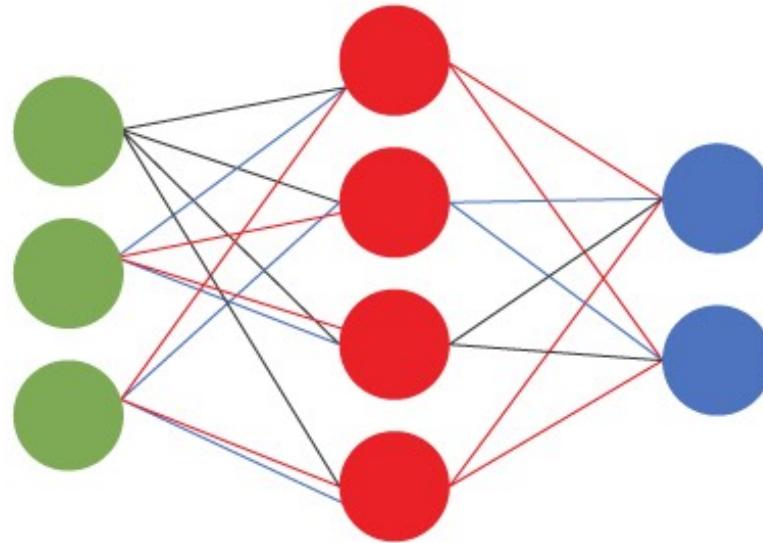
Exploit quantum correlations
for new algorithms and frameworks (QNN)

J. Carrasquilla & R. Melko, *Nature Phys.* (2017)

J. Biamonte, ..., S. Loyd, *Nature* (2017)

Deep Neural Networks

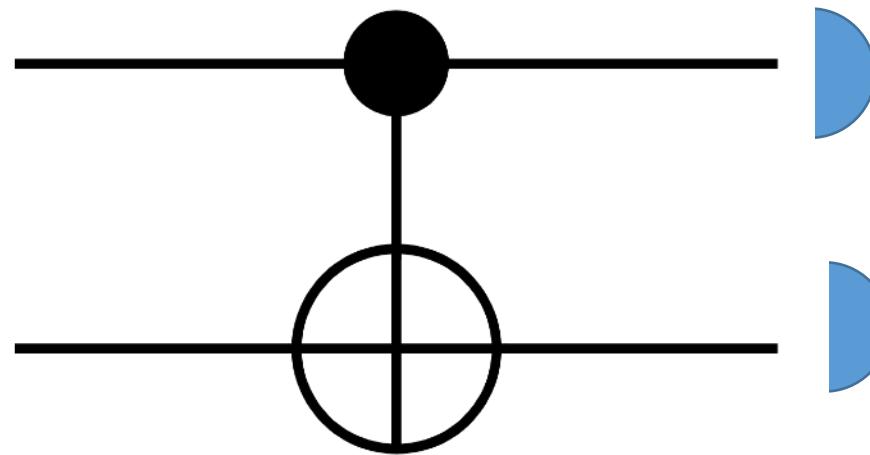
Feed-Forward basics



$$L(n0 \rightarrow n1): \quad \mathbf{x} \rightarrow \mathbf{y} = \phi(W\mathbf{x} + \mathbf{b})$$

Quantum Circuit

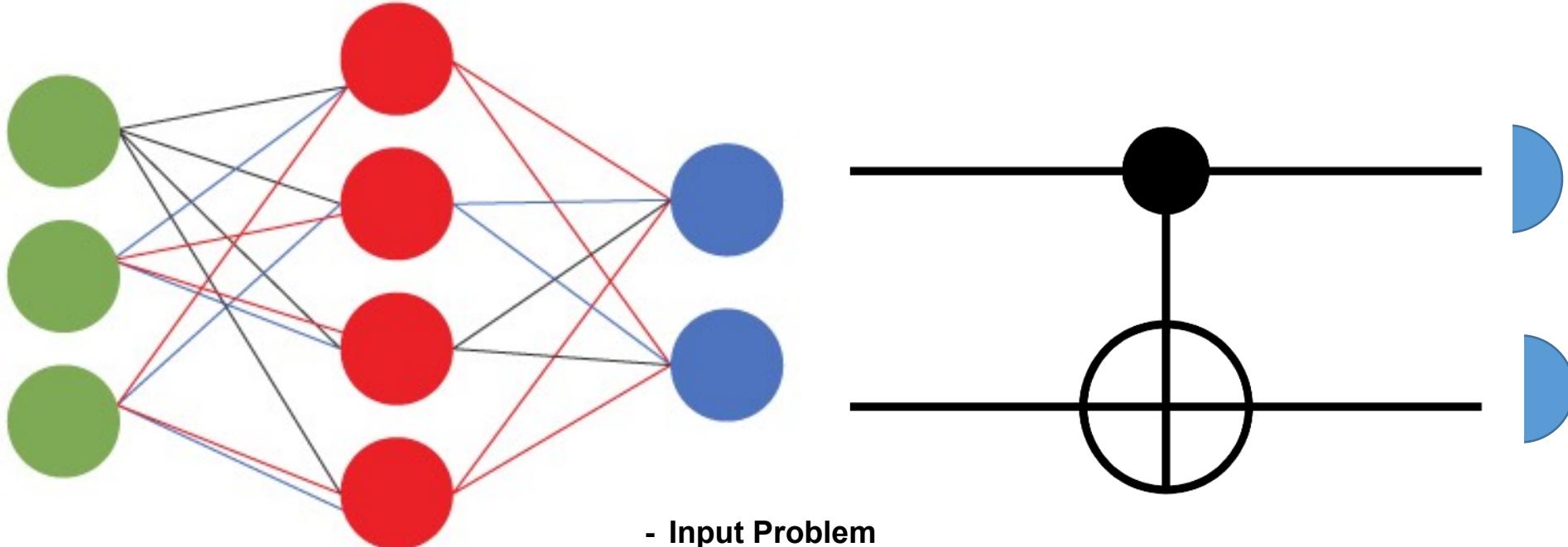
Basics



$$\mathbf{x} \rightarrow \mathbf{y} = W\mathbf{x}$$

Quantum Machine Learning

Basic example



- Input Problem
- Output Problem
- Costing Problem
- Benchmarking Problem