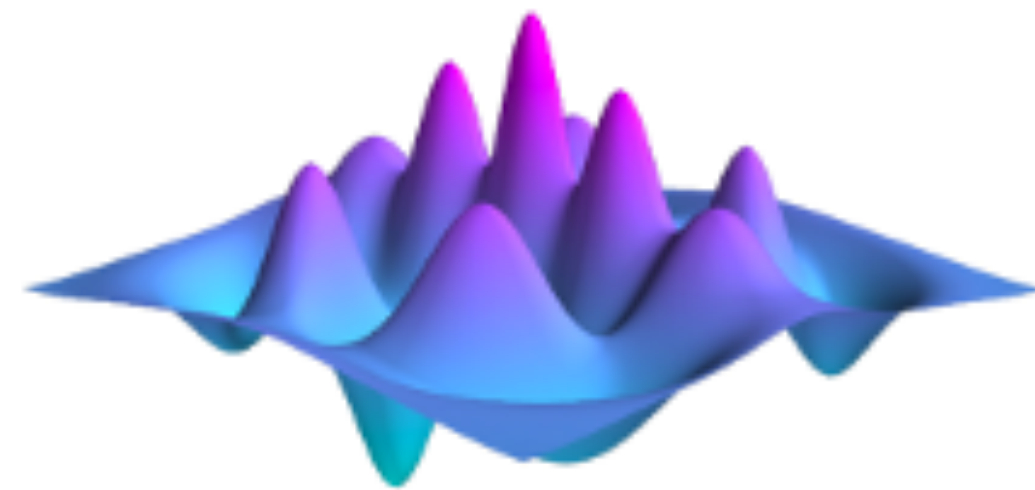


QuTiP stochastic solvers: `mcsolve`



QuTiP

Quantum Toolbox in Python



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Theoretical Quantum Physics Lab
Cluster for Pioneering Research
RIKEN, Saitama, Japan



1st July 2019
CM Seminar
ICTP, Trieste

QuTiP: The Quantum *Physics* Simulator

The **Q**uantum **T**oolbox in **P**ython: A toolbox to study the **open** quantum dynamics of realistic systems.



Interactive Lectures @ ICTP, Leonardo Building

Tue 25th June - 11:45am, Seminar Room – Driven-dissipative models in quantum physics

Wed 26th June - 11am, Seminar Room – Quantum Open Source & Introduction to QuTiP

Thur 27th June - 9am, Computer Room – Hands-on session on QuTiP's main features

Mon 1st July - 9am, Computer Room – QuTiP stochastic solvers

Tue 2nd July - 9am, Computer Room – How to Build your Own Scientific Software Library in Python

(Wed 3rd July - 9am, Computer Room – Extra meeting: SISSA/ICTP projects)

Take a snapshot

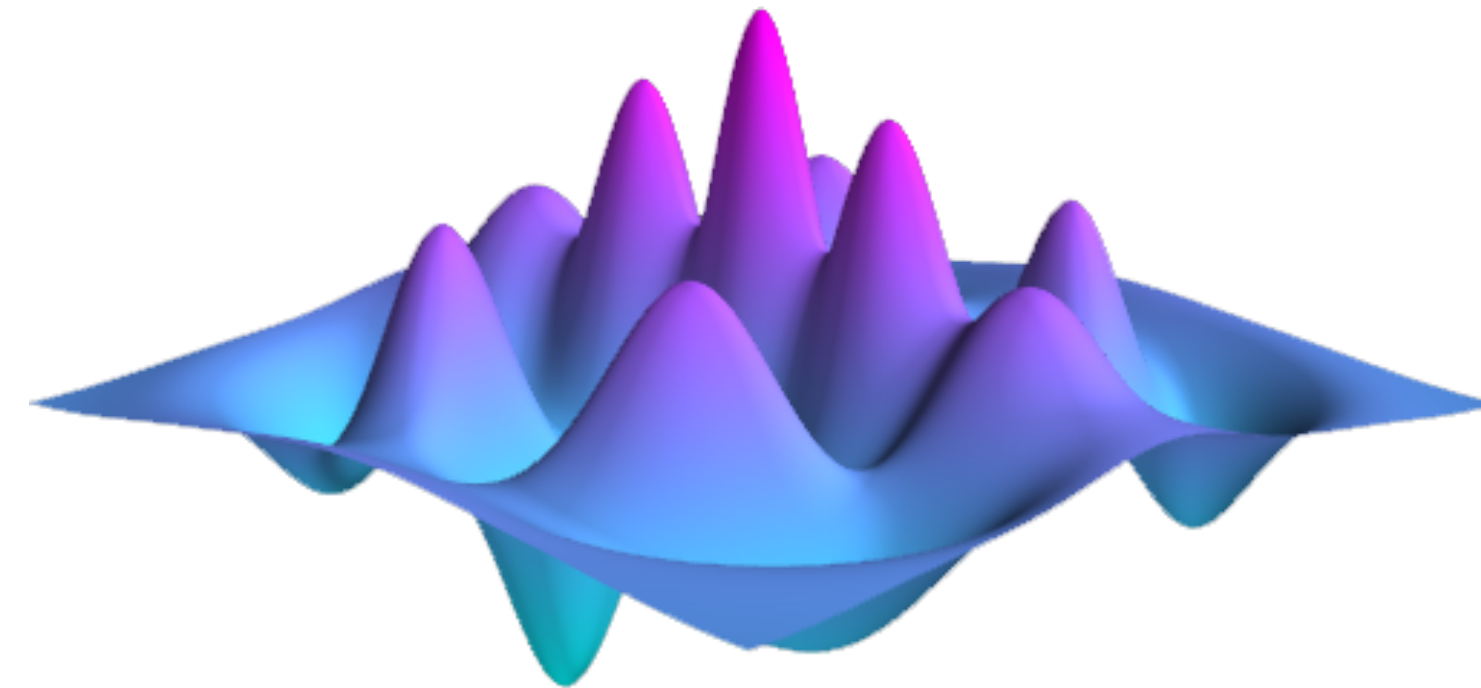


<https://github.com/nathanshammah/interactive-notebooks>

QuTiP: Interactive Notebooks

The **Q**uantum **T**oolbox in **P**ython

QuTiP



You can find an interactive notebook at

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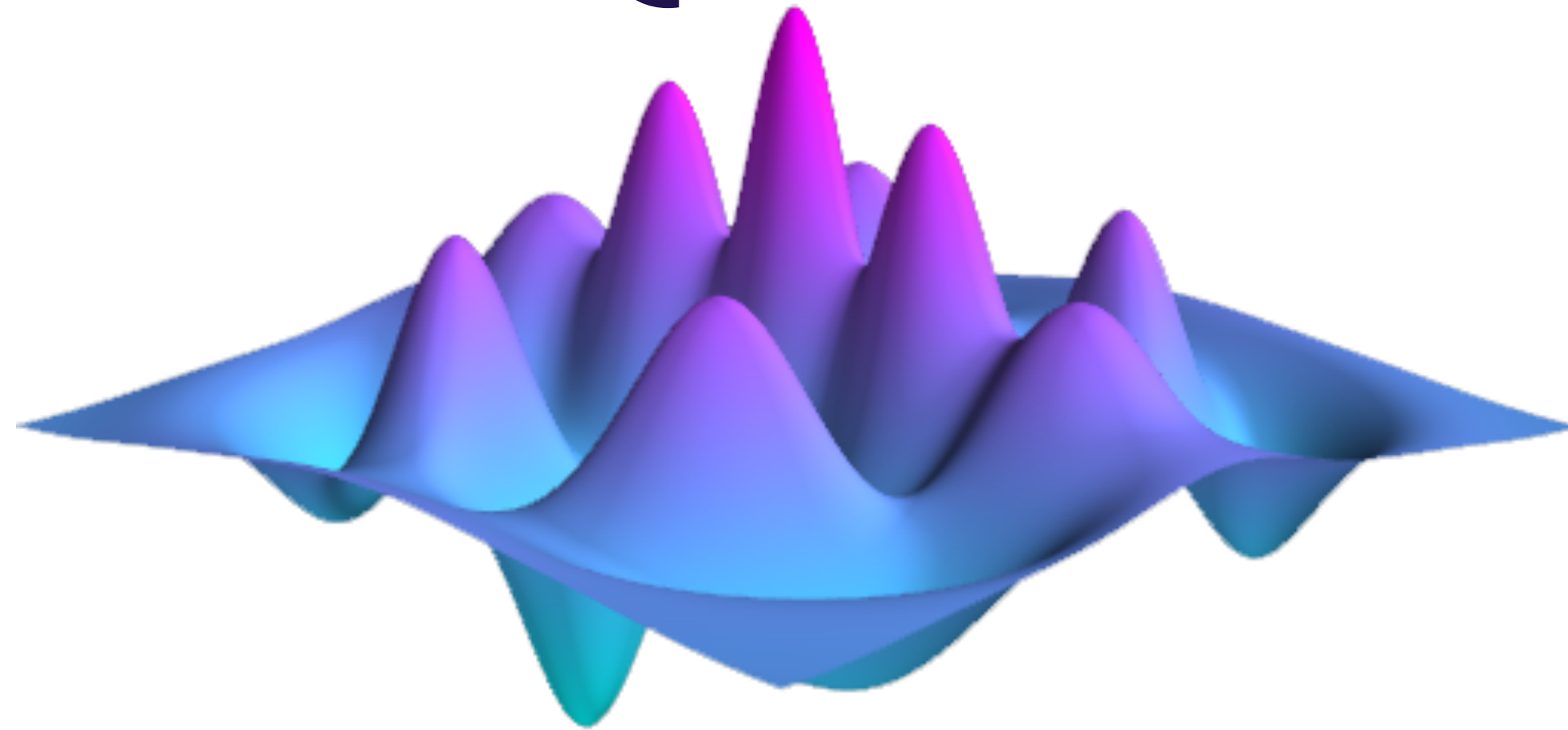
Take a snapshot



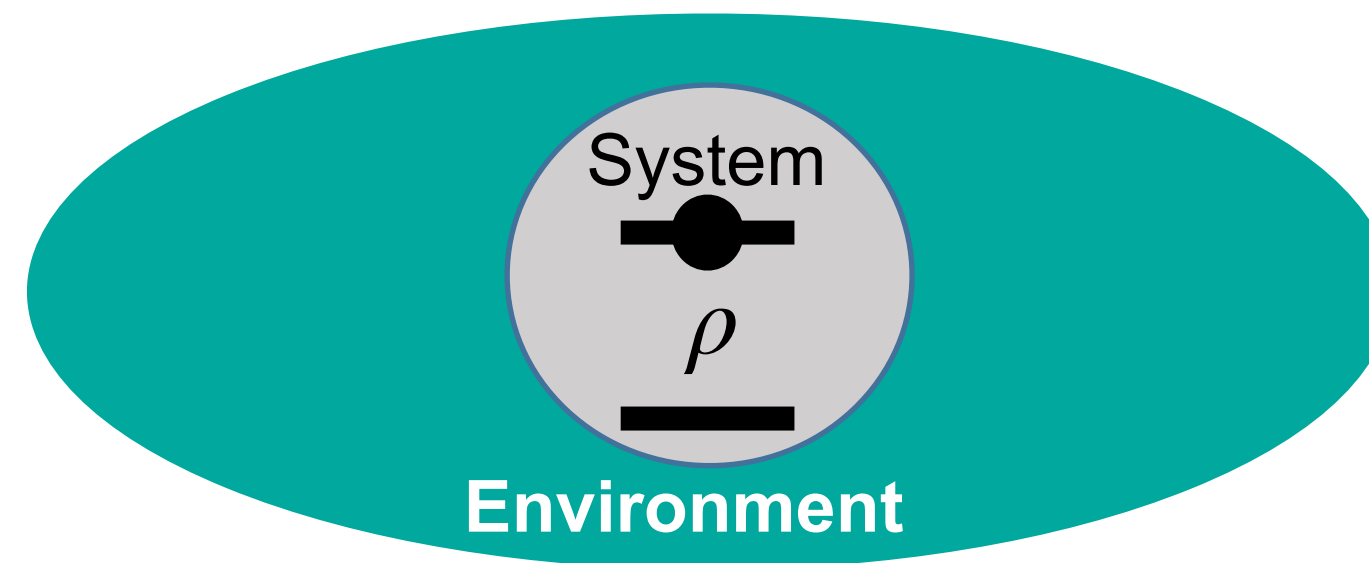
QuTiP: The Quantum *Physics* Simulator

The **Q**uantum **T**oolbox in **P**ython

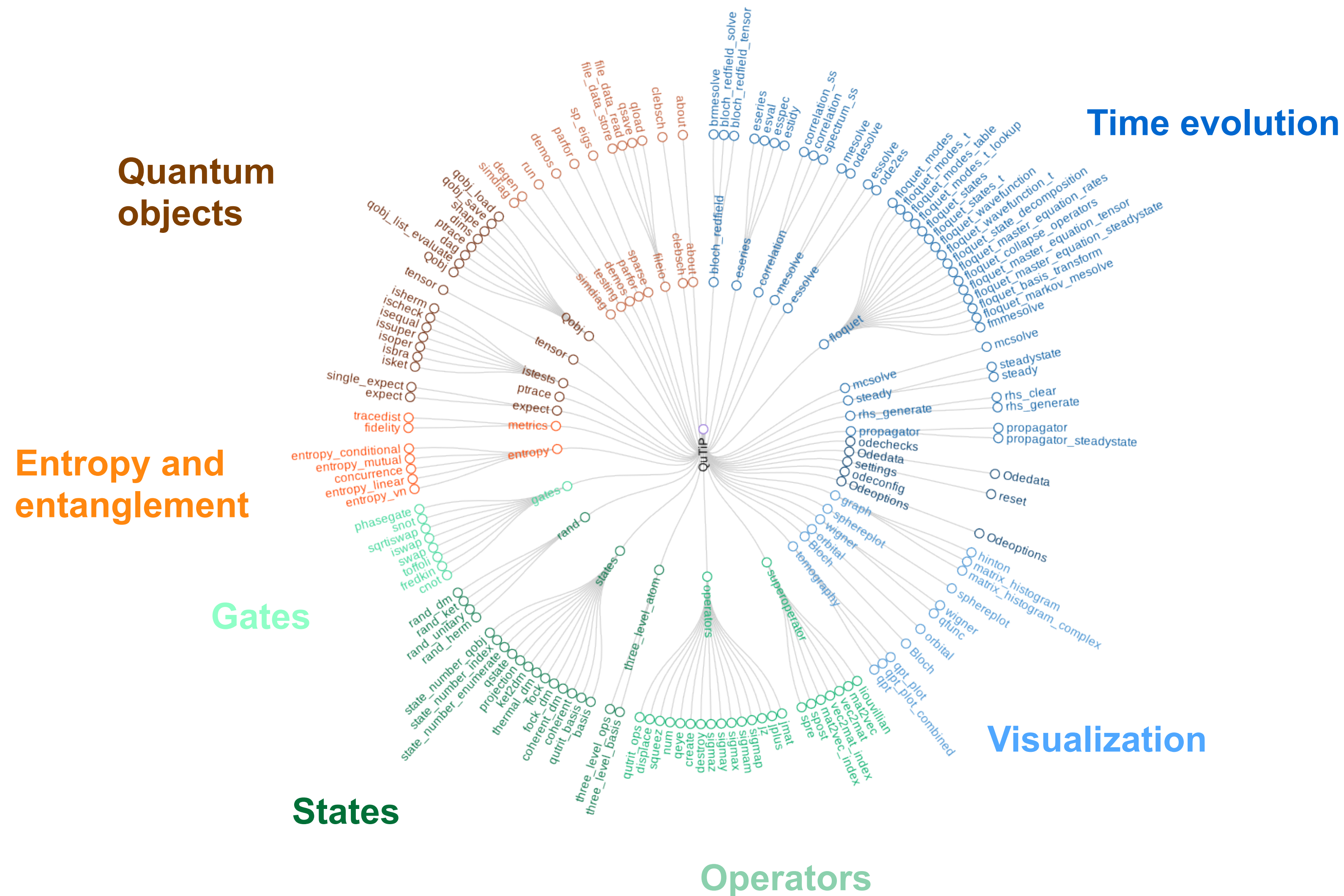
QuTiP



A toolbox to study the **open** quantum dynamics of realistic systems.

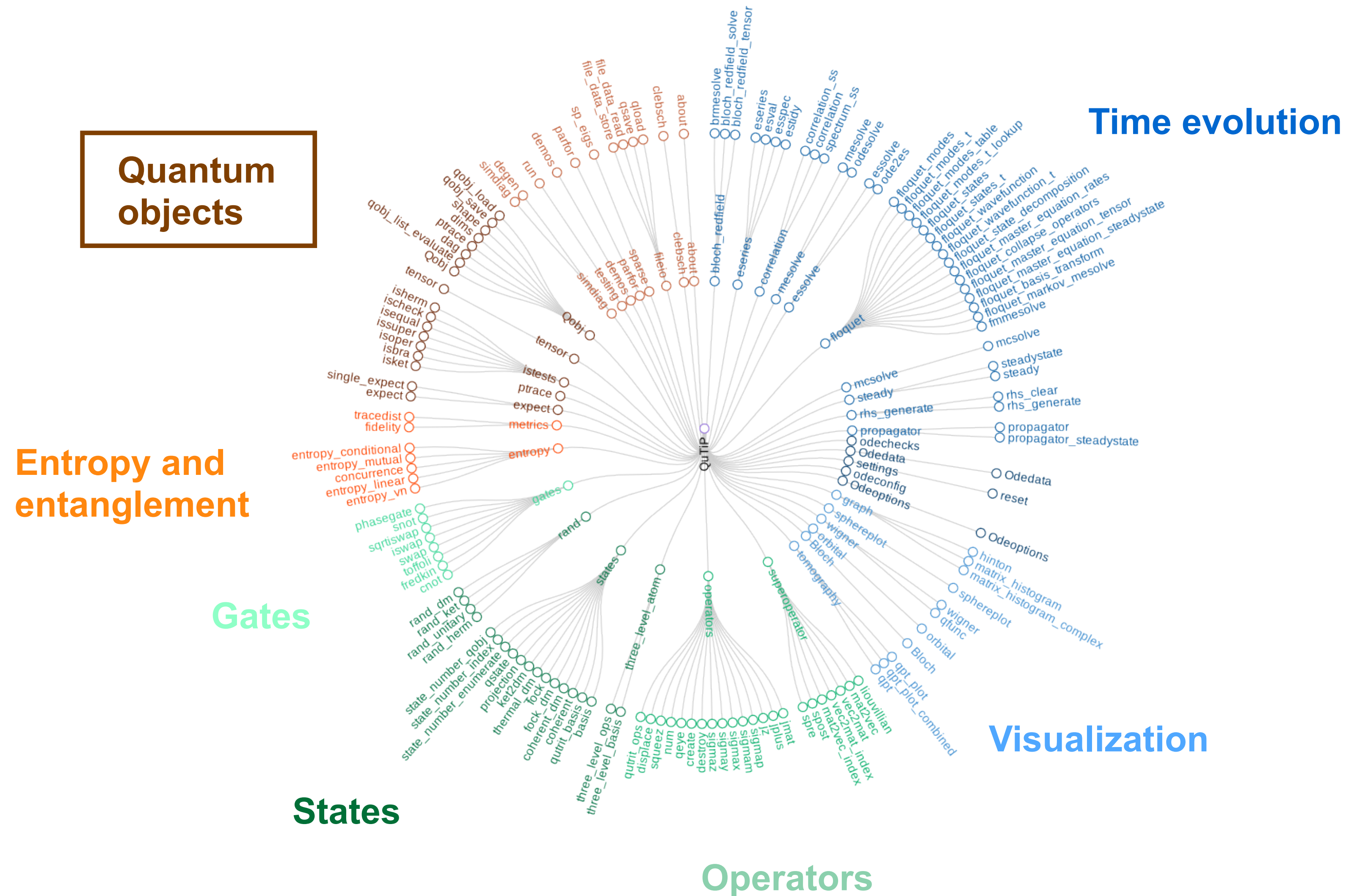


The Quantum Toolbox in Python



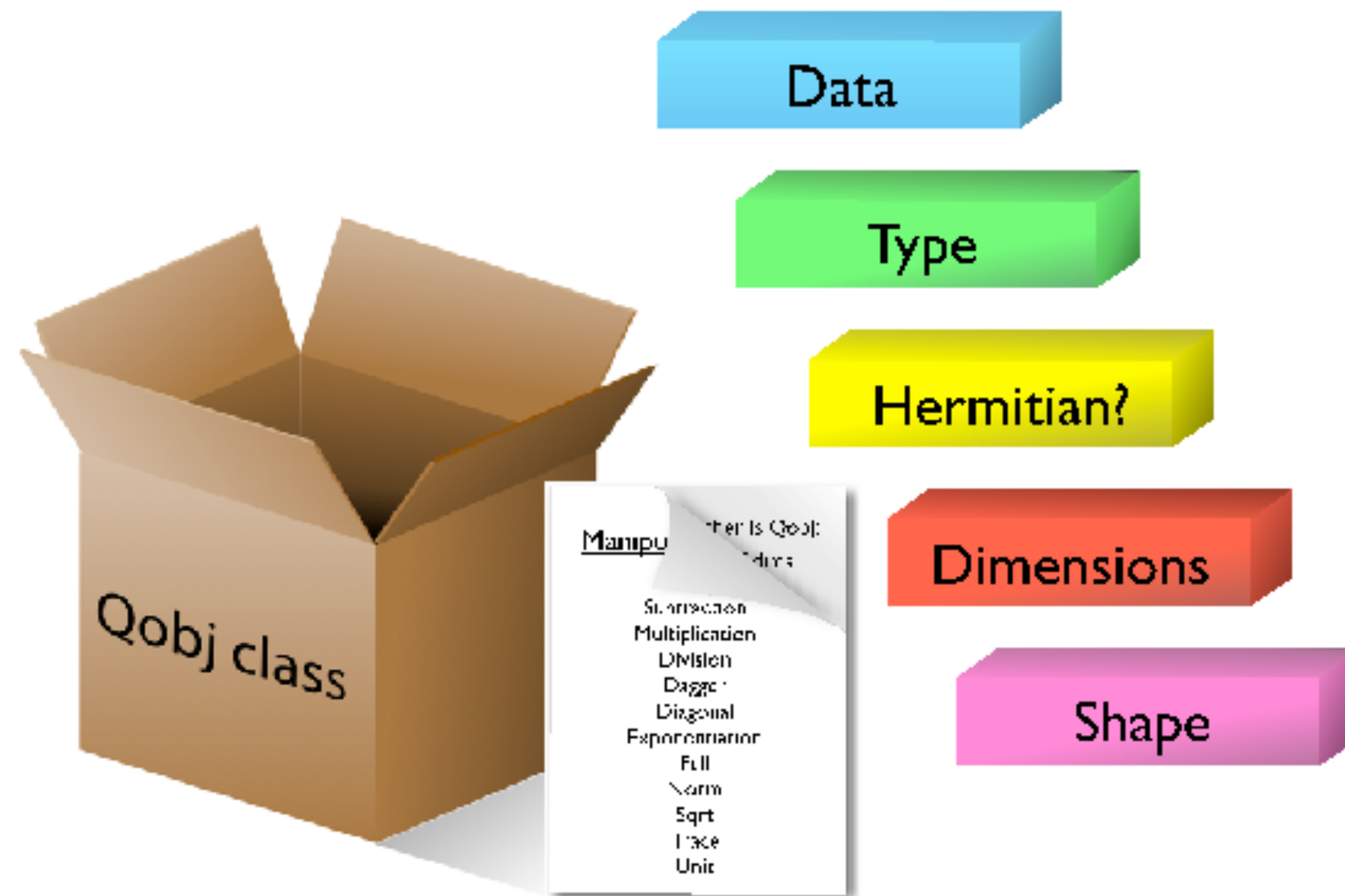
QuTiP: Map of code

The Quantum Toolbox in Python



QuTiP: The `qobj` class

The Quantum Toolbox in Python



J. R. Johansson, P. D. Nation, and F. Nori, Comp. Phys. Comm. **183**, 1760–1772 (2012)
QuTiP: An open-source Python framework for the dynamics of open quantum systems

QuTiP: The QObj class

The Quantum Toolbox in Python

- State and operators are declared as `QObj`
- **Generate states** and operators
- Algebra (bosonic)

$$AB - BA \neq 0$$

$$\mathcal{E}(\rho) = A\rho B^\dagger \longrightarrow \mathcal{D} = B^* \otimes A$$

$$\dot{\rho} = \mathcal{D}\rho$$

```
>> q = Qobj([1], [0])  
Quantum object: dims = [[2], [1]],  
shape = (2, 1), type = ket
```

$$\begin{pmatrix} 1.0 \\ 0.0 \end{pmatrix}$$

```
>> d = destroy(2)  
Quantum object: dims = [[2], [2]],  
shape = (2, 2), type = oper,  
isherm = False
```

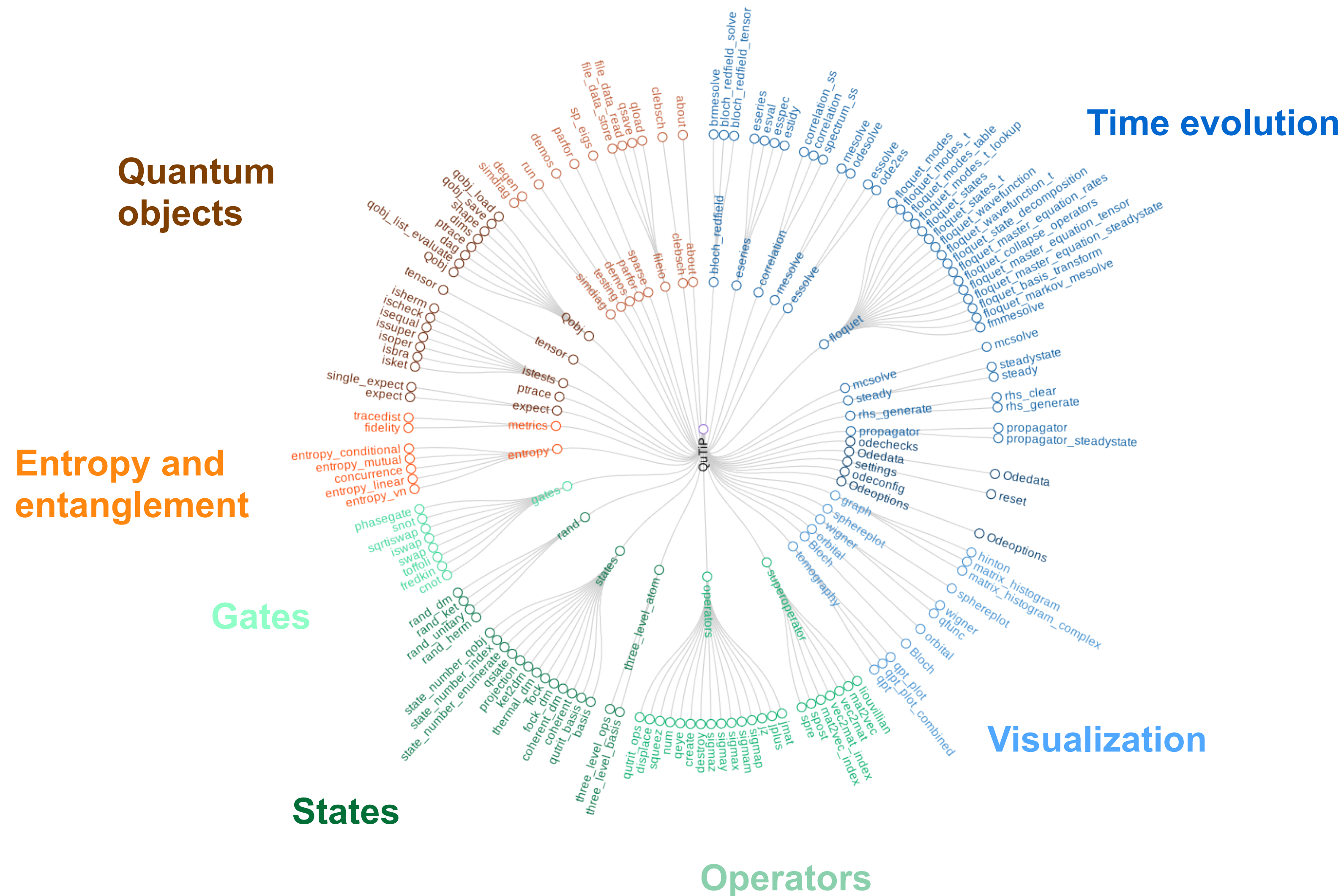
$$\begin{pmatrix} 0.0 & 1.0 \\ 0.0 & 0.0 \end{pmatrix}$$

```
>> q.dag()  
Quantum object: dims = [[1], [2]],  
shape = (1, 2), type = bra
```

$$\begin{pmatrix} 1.0 & 0.0 \end{pmatrix}$$

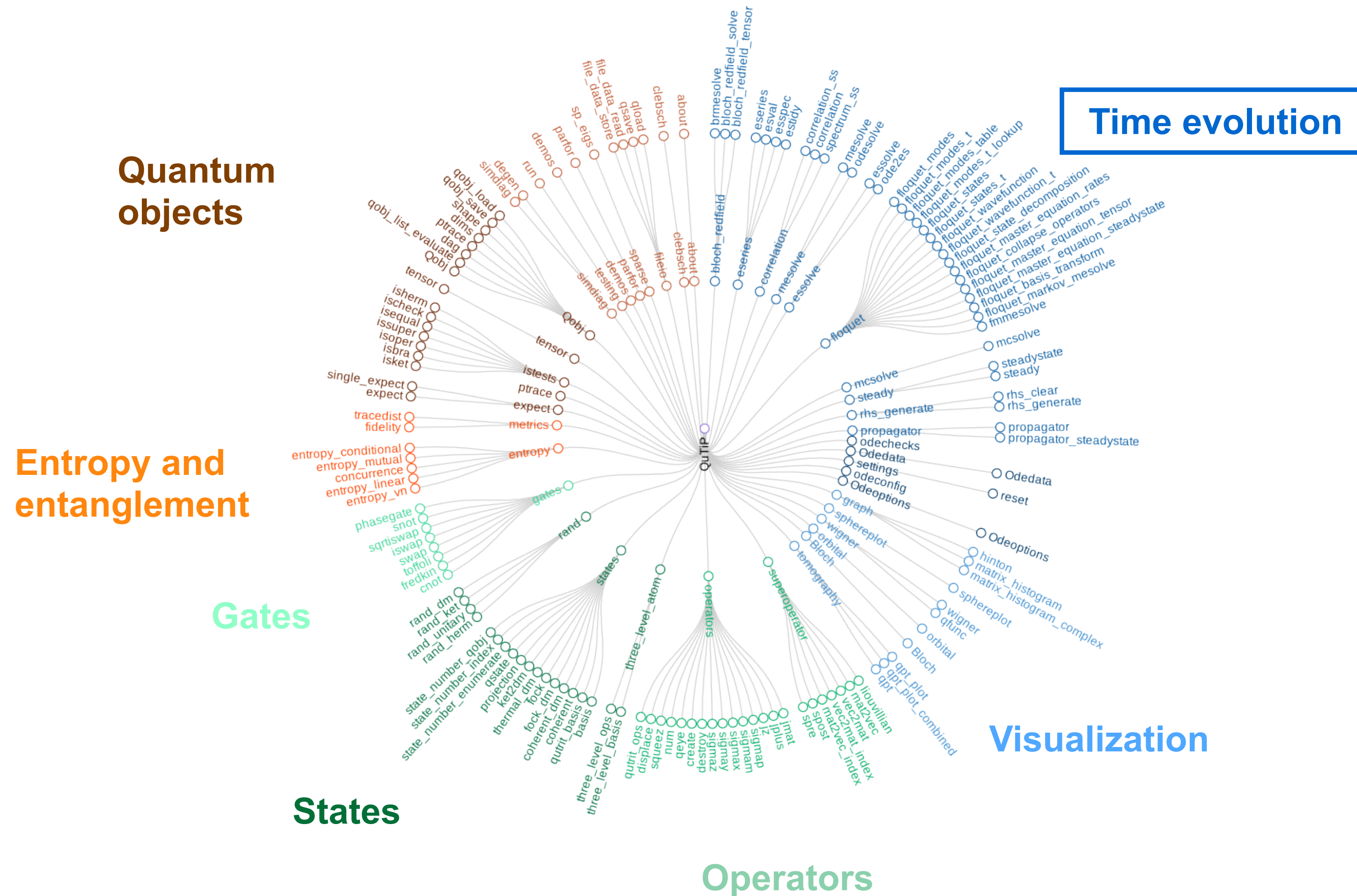
QuTiP: Map of code

The Quantum Toolbox in Python



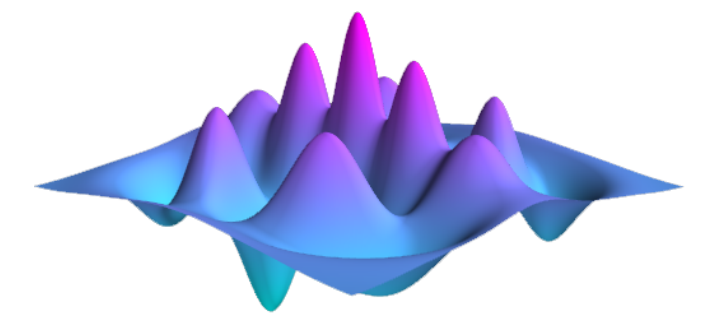
QuTiP: Map of code

The Quantum Toolbox in Python



QuTiP: Numerical Solvers

The **Q**uantum **T**oolbox in **P**ython



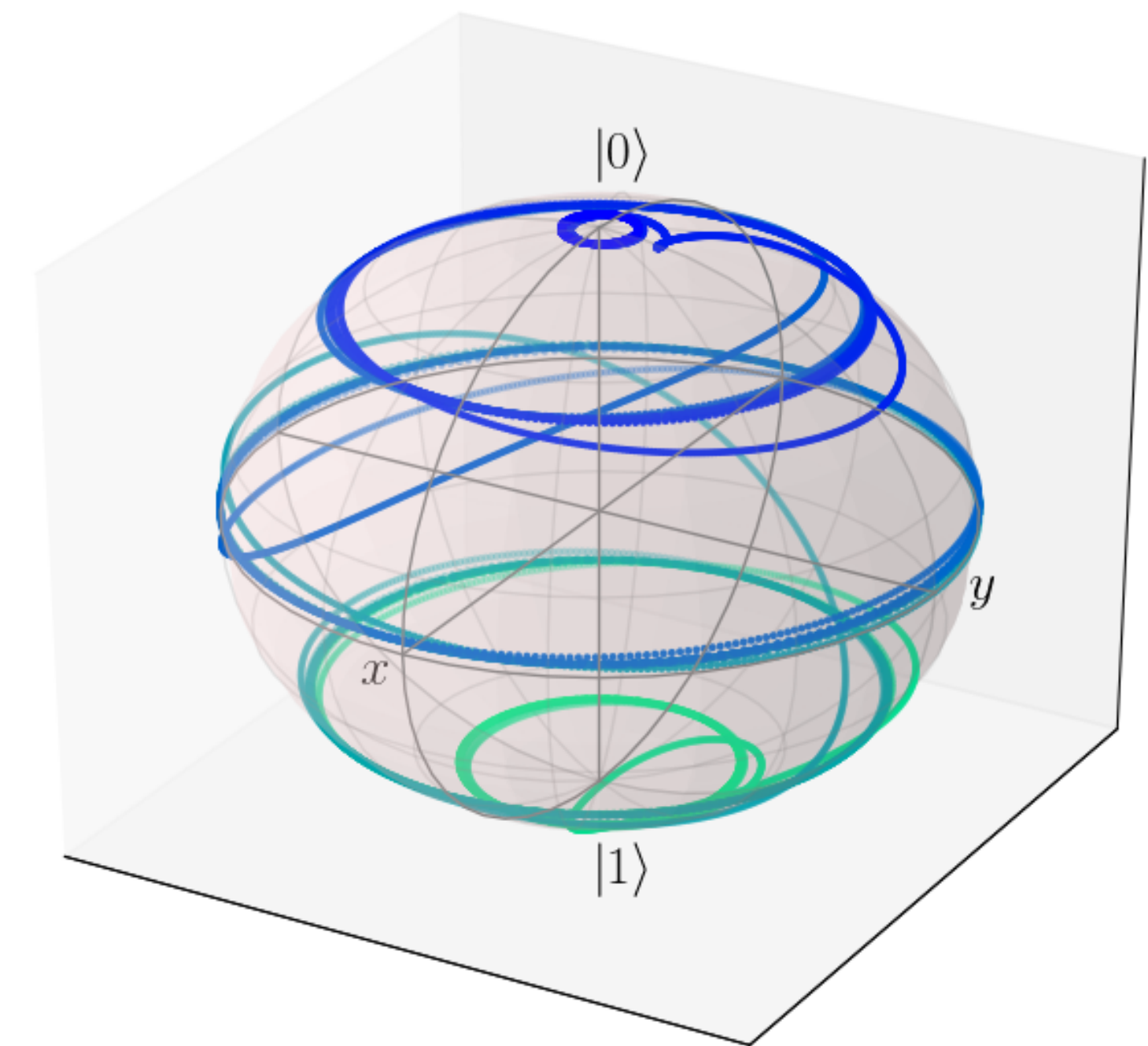
The `Result` class stores the expectation values of the operators passed to the solver.

Simple Example: A driven, damped single mode cavity.

```
result_ref = mesolve(H, rho0, times, c_ops, e_ops)
plot_expectation_values(result_ref, y_labels = "E[a'a], ...,)
```

Solvers:

- `mesolve`: Lindblad master equations
- `mcsolve`: Monte-Carlo quantum trajectory
- `floquet_modes`: Floquet theory for strong driving
- `bloch_redfield`: Bloch-Redfield solver
- `sesolve`, `ssesolve`, `smesolve`: Stochastic solvers



Solving a many-qubit dynamics

Closed vs. Open dynamics

Schrödinger Equation

$$i\hbar \frac{d}{dt} |\psi\rangle = H |\psi\rangle$$

Master Equation

$$i\hbar \frac{d}{dt} \rho = [H, \rho] + \textbf{Noise}$$

| | Schrödinger Equation | Lindblad Master Equation |
|-----------------------|--------------------------|---|
| Probability | Conserved | Conserved |
| Evolution | Unitary, $H = H^\dagger$ | Non-Unitary |
| Time reversal | Preserved | Broken |
| Features | Closed system | Open system: noise and dissipation |
| Scaling with N qubits | 2^N | |

Solving a many-qubit dynamics

Exponential scaling even with Lindblad dynamics

$$\frac{d}{dt}\rho = -i[H,\rho] + \gamma \sum_i^N \left(L_i \rho L_i^\dagger - \frac{1}{2} L_i^\dagger L_i \rho - \frac{1}{2} \rho L_i^\dagger L_i \right)$$

| | Von Neumann Equation | Lindblad Master Equation |
|-----------------------|--------------------------|---|
| Probability | Conserved | Conserved |
| Evolution | Unitary, $H = H^\dagger$ | Non-Unitary |
| Features | Closed system | Open system: noise and dissipation |
| Scaling with N qubits | 2^N | 4^N |

$$\frac{d}{dt}|\rho\rangle = \mathcal{L}|\rho\rangle$$

Solving a many-qubit dynamics: Quantum Trajectories

Photon counting statistics

**Lindblad
master equation**

$$\frac{d}{dt}\rho = -\frac{i}{\hbar}[H, \rho] + \gamma \left(L\rho L^\dagger - \frac{1}{2}L^\dagger L\rho - \frac{1}{2}\rho L^\dagger L \right)$$

Solving a many-qubit dynamics: Quantum Trajectories

Photon counting statistics

$$\frac{d}{dt}\rho = -\frac{i}{\hbar}[H, \rho] + \gamma \left(\overset{\text{"quantum jump"}}{\overbrace{L\rho L^\dagger}^{\text{.....}}} - \underbrace{\frac{1}{2}L^\dagger L\rho - \frac{1}{2}\rho L^\dagger L}_{\text{continuous decay}} \right)$$

Effective Hamiltonian:
shrinking the state

$$H_{\text{eff}} = H_{\text{sys}} - \frac{i\hbar}{2}L^\dagger L$$

$$|\psi(t + \delta t)\rangle = \frac{L|\psi(t)\rangle}{\left\langle \psi(t) \left| L^\dagger L \right| \psi(t) \right\rangle^{1/2}}$$

Solving a many-qubit dynamics: Quantum Trajectories

Photon counting statistics

$$\frac{d}{dt}\rho = -\frac{i}{\hbar}[H, \rho] + \gamma \left(\overset{\text{"quantum jump"}}{\overbrace{L\rho L^\dagger}^{\text{.....}}} - \underbrace{\frac{1}{2}L^\dagger L\rho - \frac{1}{2}\rho L^\dagger L}_{\text{continuous decay}} \right)$$

A. **Effective Hamiltonian:**
shrinking the state

$$H_{\text{eff}} = H_{\text{sys}} - \frac{i\hbar}{2}L^\dagger L$$

B. **Quantum jump:**

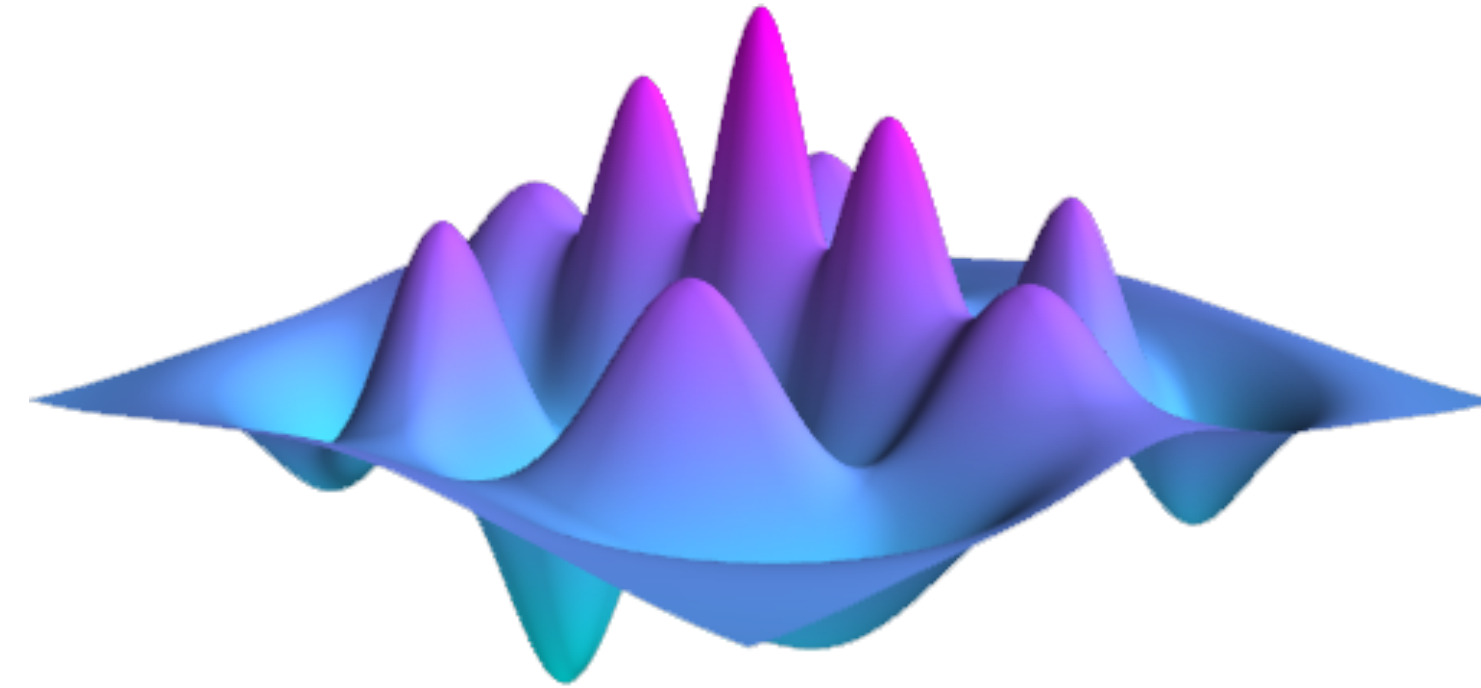
1. Generate random number, r .
2. Is $r > \text{norm}(\psi)$?
 - I. Yes: keep integrating (A)
 - II. No: apply jump and renormalize

$$|\psi(t + \delta t)\rangle = \frac{L|\psi(t)\rangle}{\left\langle \psi(t) \left| L^\dagger L \right| \psi(t) \right\rangle^{1/2}}$$

Explore this Physics with Interactive Notebooks

The **Q**uantum **T**oolbox in **P**ython

QuTiP



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Take a snapshot



Thank you



@NathanShammah

GitHub: nathanshammah

LinkedIn: Nathan Shammah

Extra Slides

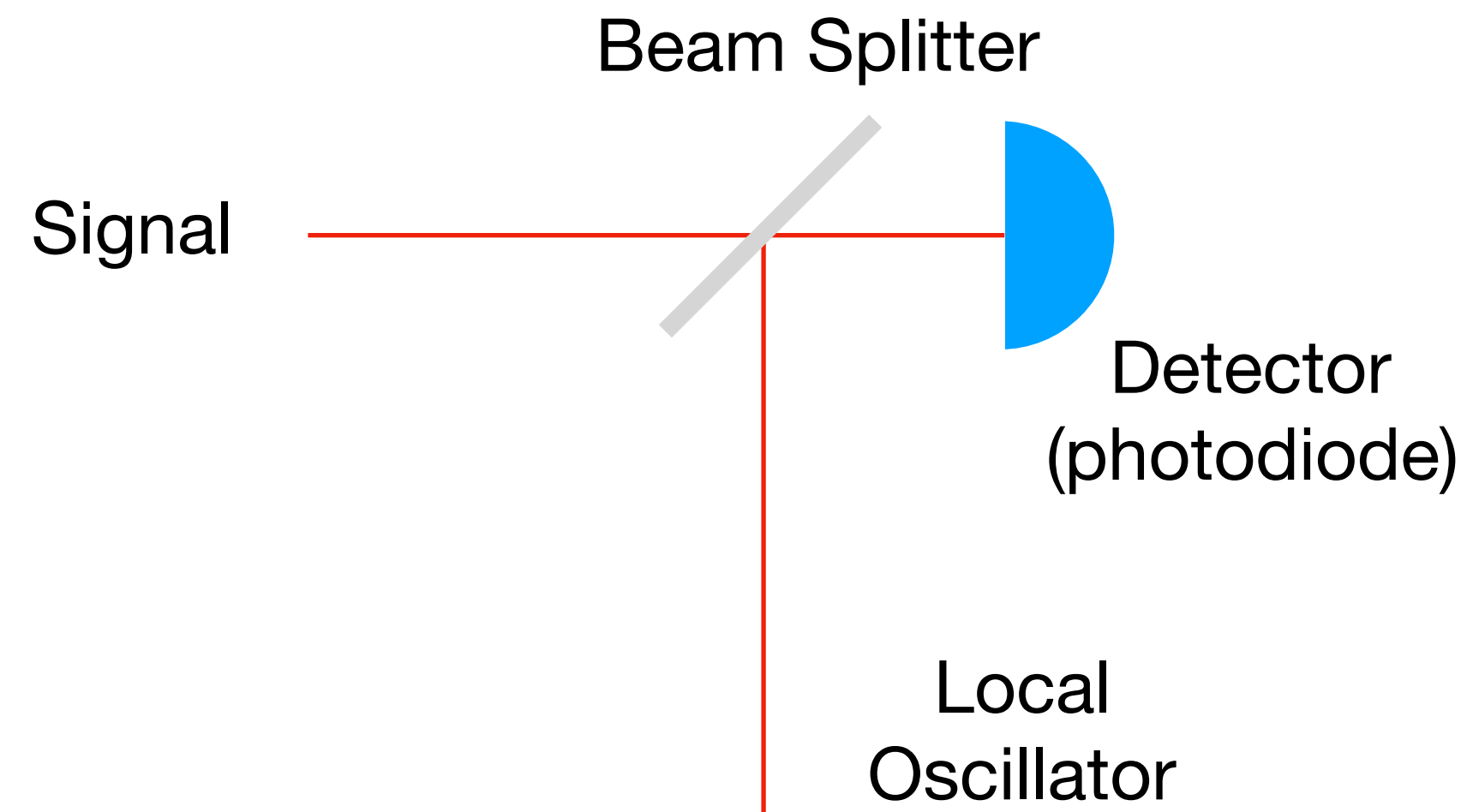
Stochastic solvers

Stochastic master equation: Continuous weak measurements

- continuous weak measurements

Heterodyne Detection

$$\omega_{LO} \neq \omega_{signal}$$



Homodyne Detection

$$\omega_{LO} = \omega_{signal}$$

```
result = smesolve(H, rho0, times, [], c_ops, e_ops)
```


Stochastic solvers

Stochastic master equation: Continuous weak measurements

- continuous weak measurements

Heterodyne Detection

$$d\rho(t) = -i[H, \rho(t)]dt + \gamma \mathcal{D}[a]\rho(t)dt + \frac{1}{\sqrt{2}} \overbrace{dW_1(t) \sqrt{\gamma} \mathcal{H}[a]\rho(t)}^{J_x(t)} + \frac{1}{\sqrt{2}} \overbrace{dW_2(t) \sqrt{\gamma} \mathcal{H}[-ia]\rho(t)}^{J_y(t)}$$

$$\mathcal{D}[A]\rho = A\rho A^\dagger - \frac{1}{2}(\rho A^\dagger A + A^\dagger A\rho) \quad \text{Lindblad term}$$

$$\mathcal{H}[A]\rho = A\rho + \rho A^\dagger - \text{Tr}[A\rho + \rho A^\dagger]\rho \quad \text{Nonlinear term}$$

```
result = smesolve(H, rho0, times, [], c_ops, e_ops, method='heterodyne')
```

```
method = 'heterodyne'
```

```
method = 'homodyne'
```

```
method = 'photocurrent'
```