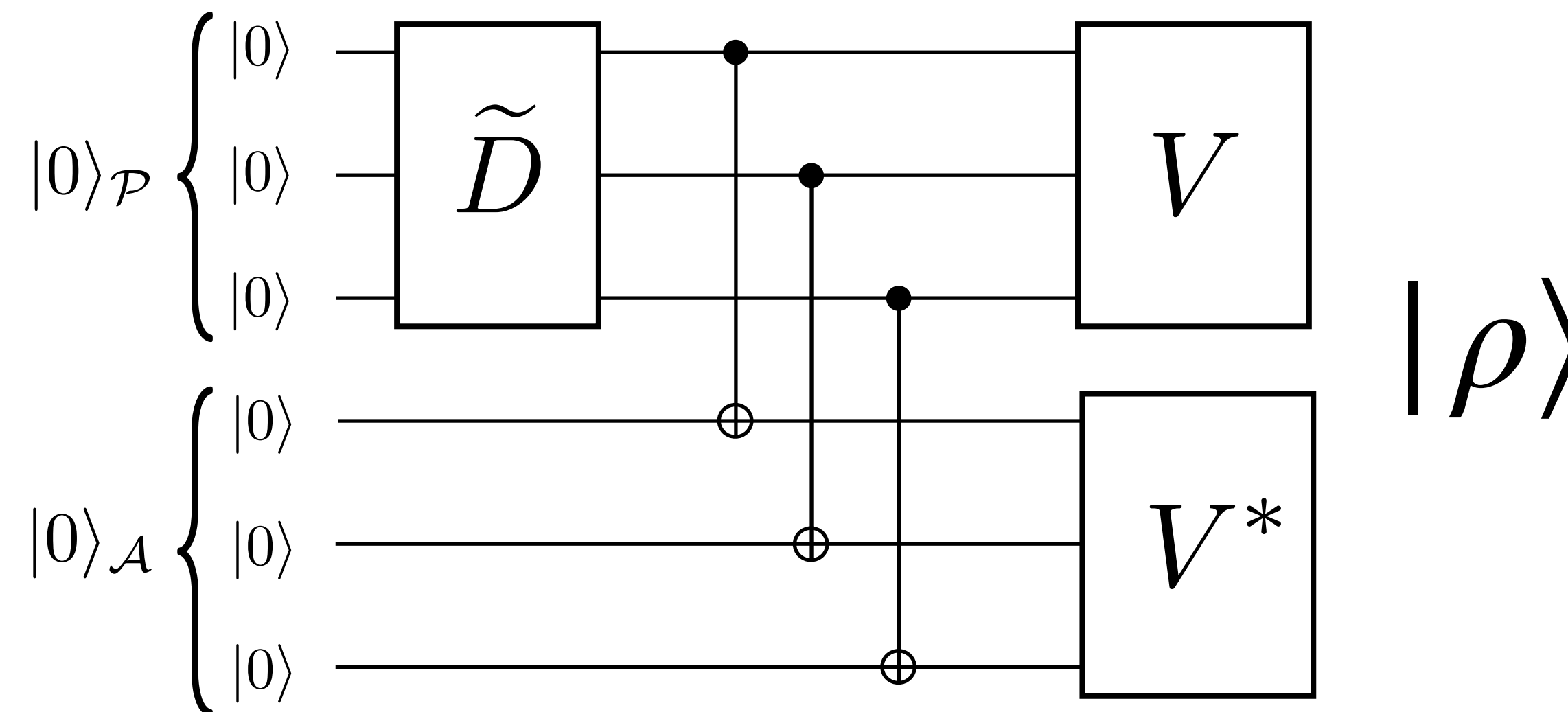


# VARIATIONAL QUANTUM ALGORITHM FOR MARKOVIAN OPEN QUANTUM SYSTEMS



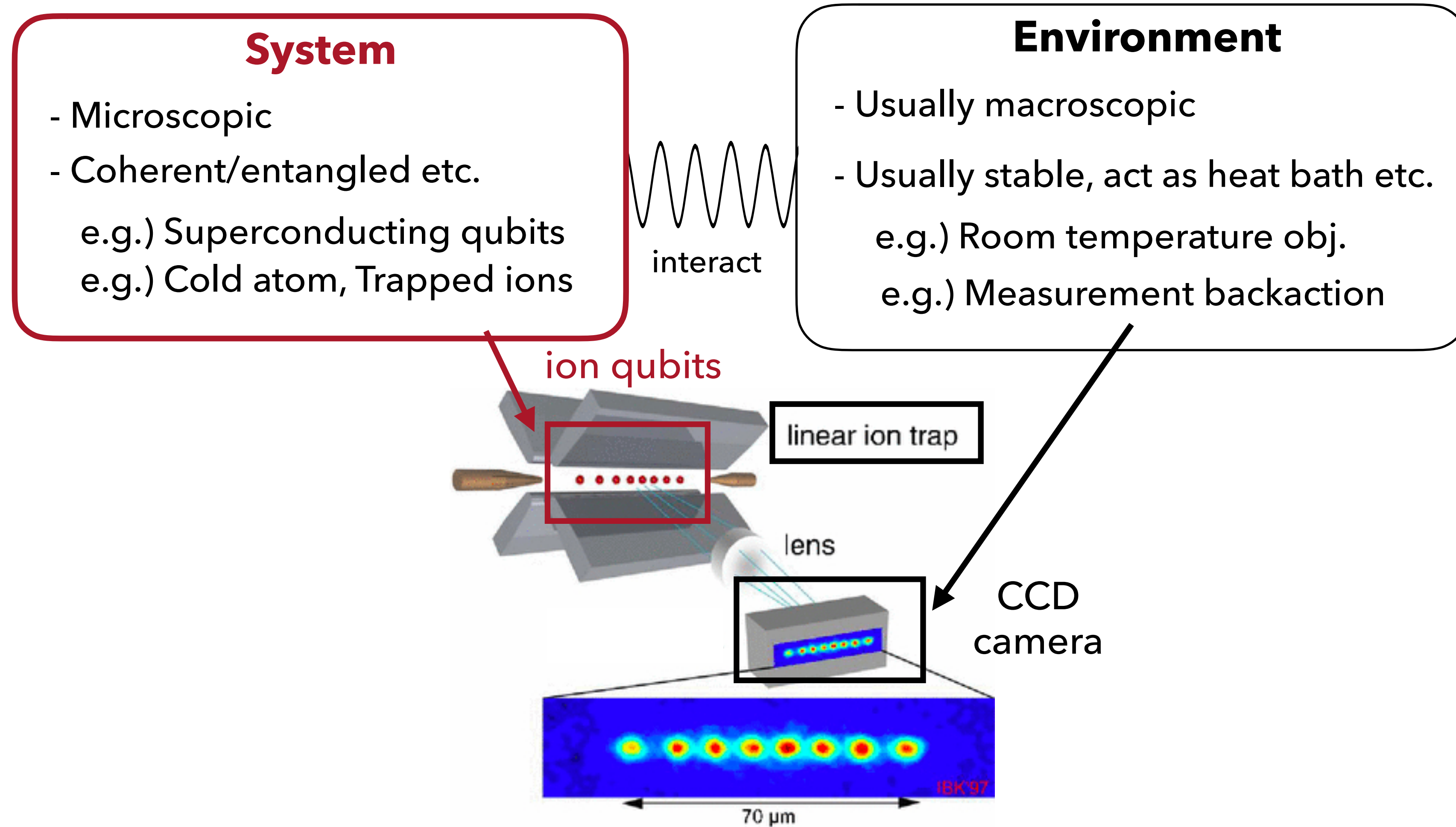
N. Yoshioka (U. Tokyo), Y. O. Nakagawa (QunaSys)

K. Mitarai, and K. Fujii (Osaka U.)

[arXiv: 1908.09836](https://arxiv.org/abs/1908.09836)

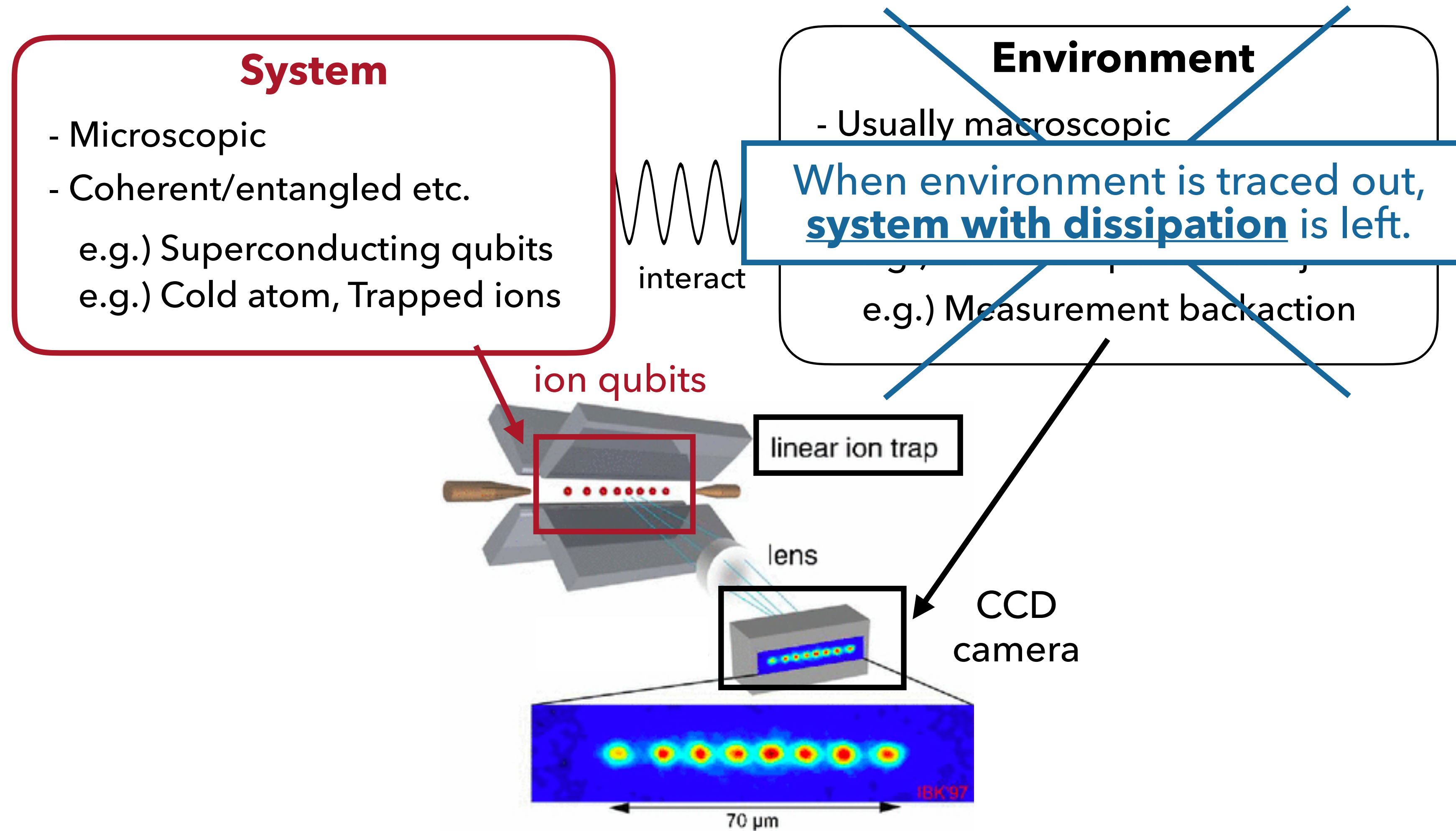


# Introduction: Open quantum system



Taken from Garcia-Ripoll et al., J. Phys B ('05)

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Taken from Garcia-Ripoll et al., J. Phys B ('05)

# Time evolution and eigenstates in isolated/open systems

System	Time evolution equation	Eigenstates	Remarks
Isolated	<p>Pure</p> $i\hbar \frac{d \psi\rangle}{dt} = \hat{H} \psi\rangle$ <p>Hamiltonian</p>	$\hat{H} \psi\rangle = E \psi\rangle$ <p><u>Ground/excited states</u></p>	<ul style="list-style-type: none"> <li>- Application of NISQ to             <ul style="list-style-type: none"> <li>- Quantum chemistry</li> <li>- Finance</li> </ul> </li> <li>- Numerous investigations done</li> </ul>
Open	<p>Mixed</p> $\frac{d\hat{\rho}(t)}{dt} = \mathcal{L}\hat{\rho}(t)$ <p>Liouvillian</p>	<div style="border: 2px solid red; padding: 5px; display: inline-block;"> <math display="block">\mathcal{L}\hat{\rho} = 0</math> <p><u>Steady state</u></p> </div> <p style="color: red; font-weight: bold;">Target today</p> $\mathcal{L}\hat{\rho} = \lambda\hat{\rho}$ <p><u>Decaying modes</u></p>	<ul style="list-style-type: none"> <li>- Important to understand             <ul style="list-style-type: none"> <li>- transports in quantum systems</li> <li>- non-equilibrium topo. phase</li> </ul> </li> <li>- <b>Few algorithms,</b> <b>No demonstration in NISQ</b></li> </ul>

**Quantum master equation assumes**

1. time-homogeneous, Markovian process
2. CPTP (completely-Positive and Trace-Preserving)



# Our proposal: dissipative-system VQE (dVQE) algorithm

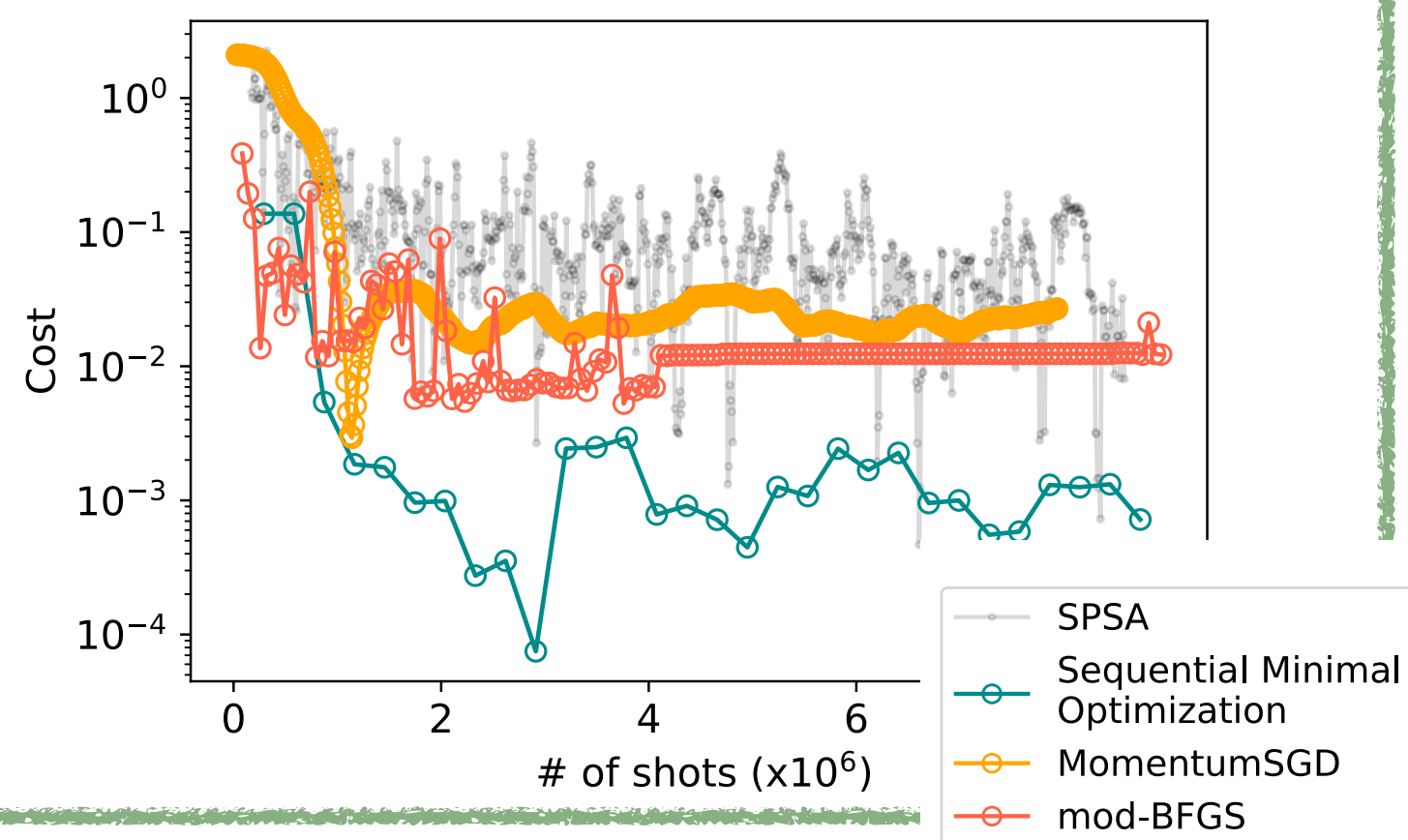
## 1. Encode mixed state in quantum circuit

$$|\rho_\theta\rangle = [V(\theta_v) \otimes V^*(\theta_v)] \times \left( \prod_{n=1}^N \text{CNOT}_{n,n+N} \right) \tilde{D}(\theta_d)|0\rangle$$

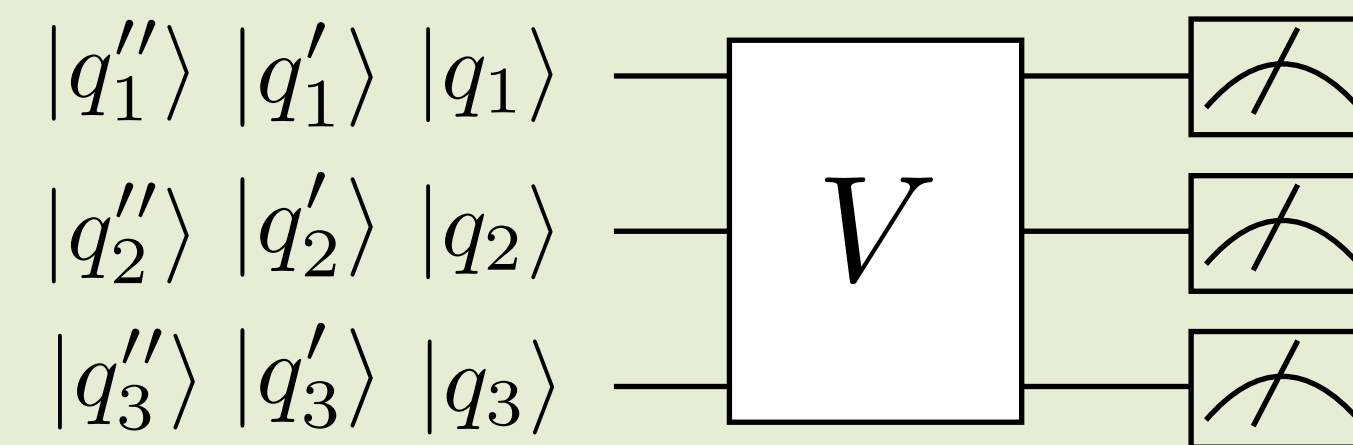
## 2. Define cost function

$$\arg \min_{\rho} \frac{\langle \rho | \hat{\mathcal{L}}^\dagger \hat{\mathcal{L}} | \rho \rangle}{\langle \rho | \rho \rangle}$$

## Execute optimization



## 3. Measure observables



$$\rightarrow \langle A \rangle = \sum_{\mathbf{q}} \lambda_{\mathbf{q}} \langle \mathbf{q} | \hat{V}^\dagger \hat{A} \hat{V} | \mathbf{q} \rangle$$

# 1. Encoding mixed state into variational quantum circuit

## Physical requirements for density matrices (general mixed state)

- |  |               |   |
|--|---------------|---|
| (I) $\rho^\dagger = \rho$  | (Hermiticity) | } ← <b>Encoded in ansatz</b>                    |
| (II) $\langle \psi   \rho   \psi \rangle \geq 0, \forall  \psi\rangle \in \mathcal{H}$ | (Positivity)  |   |
| (III) $\text{Tr}[\rho] = 1$  | (Unit trace)  | ← <b>Assured in actual measurement (Step 3)</b> |

## Requirements (I),(II) in **matrix/vector** representation

### Matrix rep.

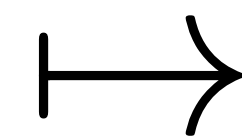
$$\rho = \sum_{ij} \rho_{ij} |i\rangle \langle j|$$

(I), (II) is equivalent to rewriting

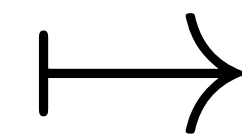
$$\rho = V D V^\dagger$$

$$D = \text{diag}(\{\lambda_q\})$$

where  $\forall \lambda \geq 0$



Choi isomorphism



### Vector rep.

$$|\rho\rangle = \sum_{ij} \frac{\rho_{ij}}{C} |i\rangle_{\mathcal{P}} \otimes |j\rangle_{\mathcal{A}}$$

States are mapped as

$$|\rho\rangle = [V \otimes V^*] |D\rangle$$

$$|D\rangle = \tilde{D} |0\rangle = \sum_{\mathbf{q}} \frac{\lambda_{\mathbf{q}}}{C} |\mathbf{q}\rangle_{\mathcal{P}} \otimes |\mathbf{q}\rangle_{\mathcal{A}}$$

C: normalization const.

# 1. Encoding mixed state into variational quantum circuit

## Physical requirements for density matrices (general mixed state)

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## Requirements (I),(II) in **matrix/vector** representation

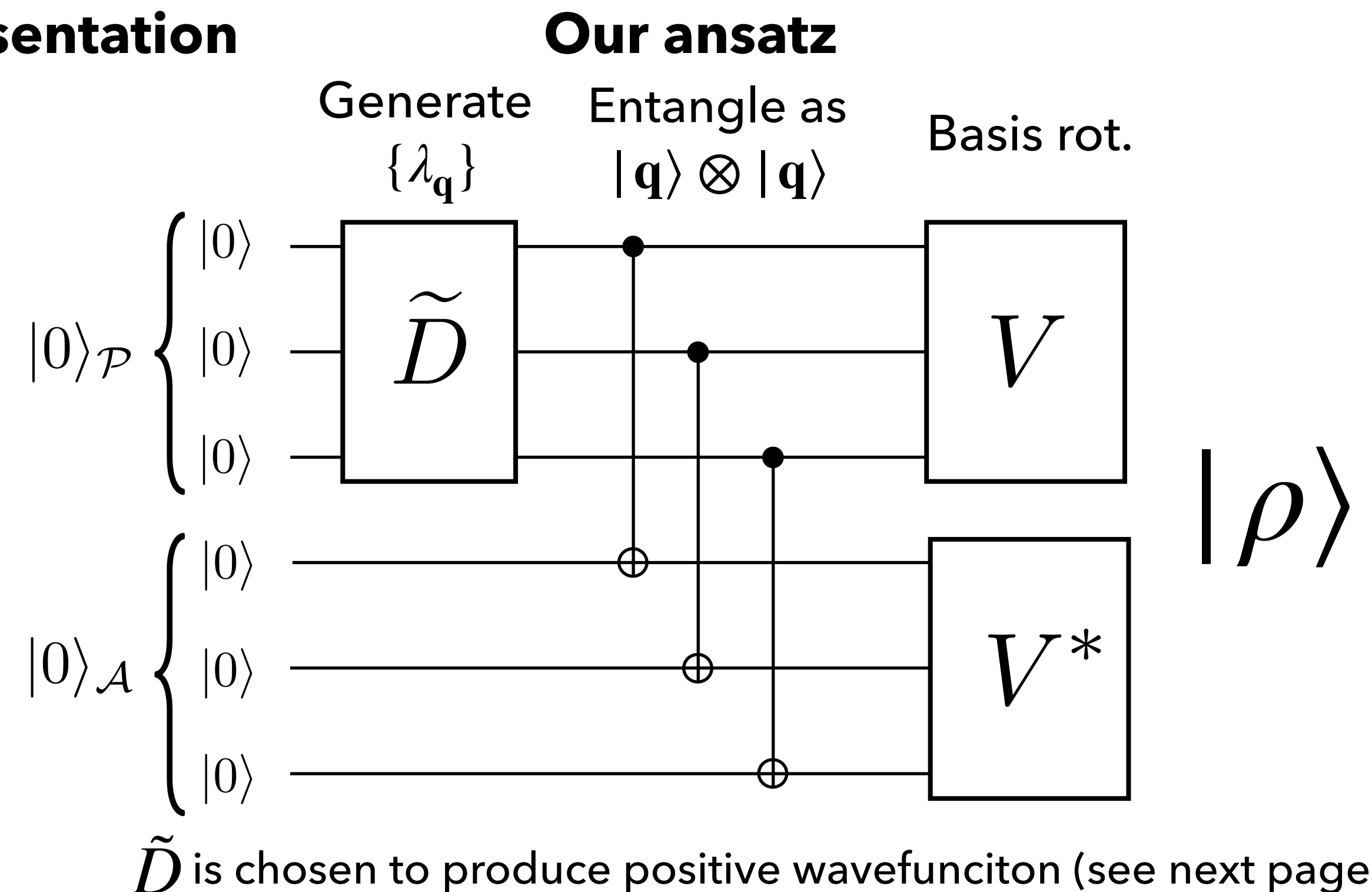
### Vector rep.

$$|\rho\rangle = \sum_{ij} \frac{\rho_{ij}}{C} |i\rangle_{\mathcal{P}} \otimes |j\rangle_{\mathcal{A}}$$

Choi isomorphism maps states to

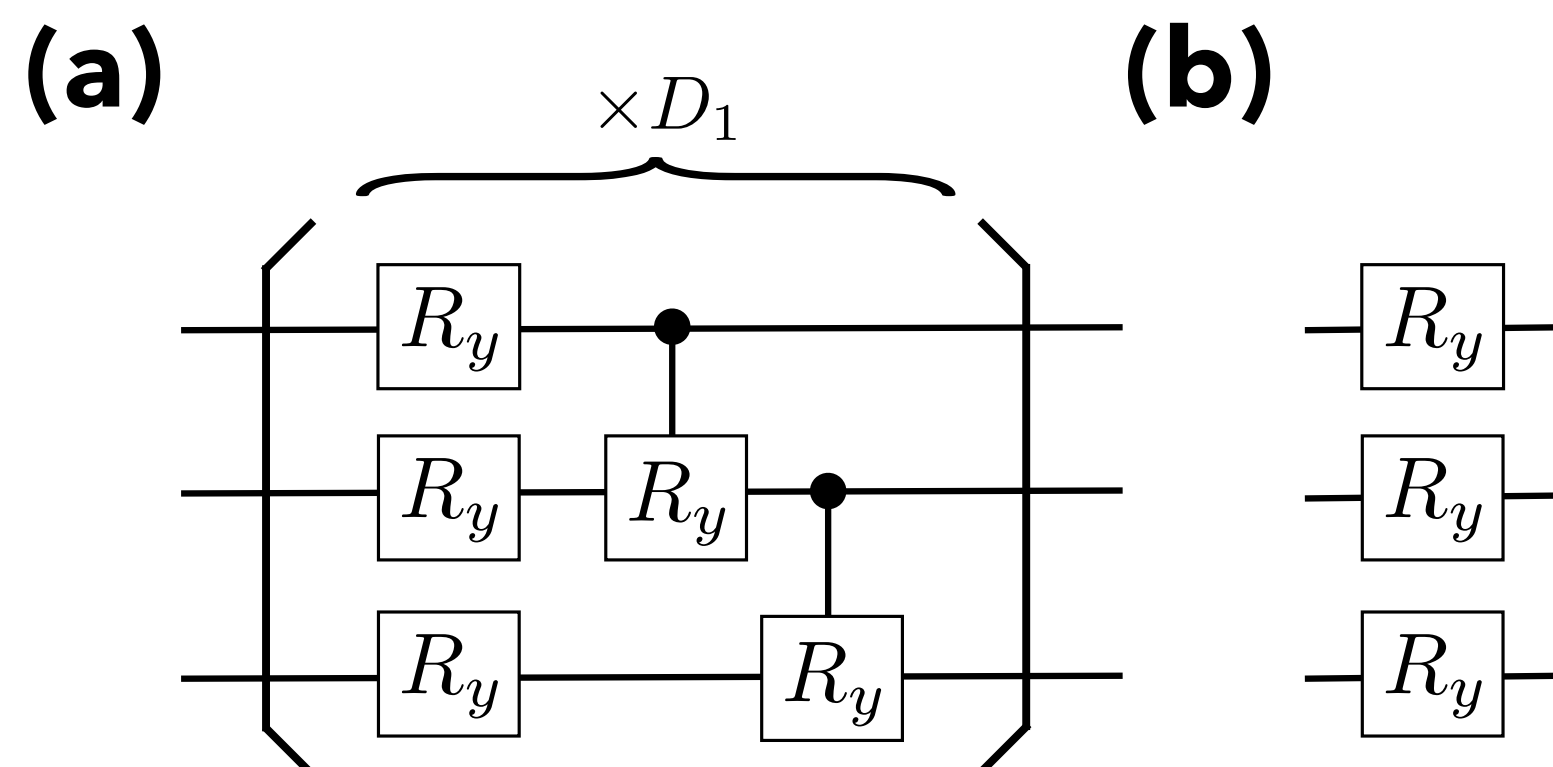
$$|\rho\rangle = [V \otimes V^*] |D\rangle$$

$$|D\rangle = \tilde{D}|0\rangle = \sum_{\mathbf{q}} \frac{\lambda_{\mathbf{q}}}{C} |\mathbf{q}\rangle_{\mathcal{P}} \otimes |\mathbf{q}\rangle_{\mathcal{A}}$$



# Examples of variational quantum circuits

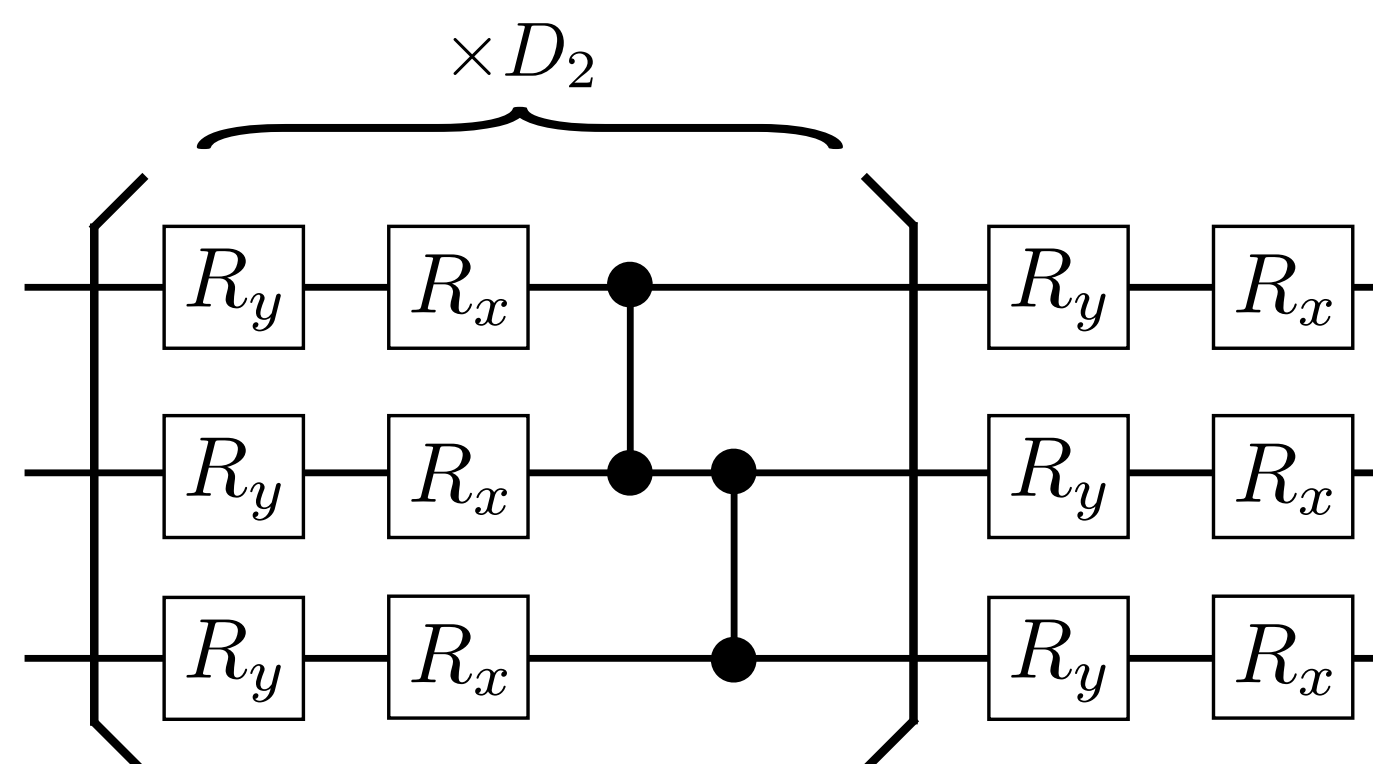
## Circuit for eigenvalues $\{\lambda_q\}$ : $\tilde{D}$



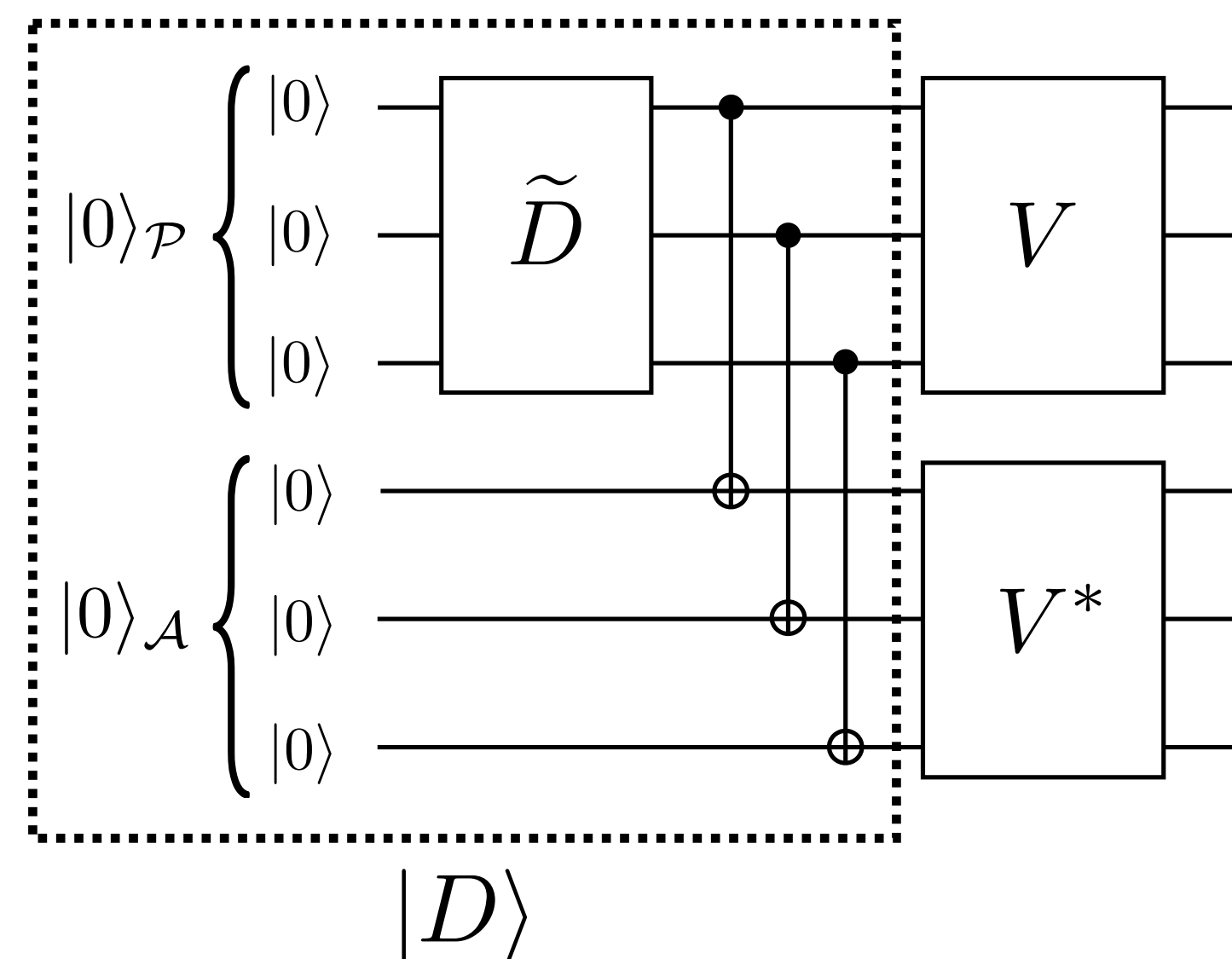
where angle  $\theta$  of each  $R_y = \exp(-i\theta Y/2)$  satisfies  $0 \leq \theta \leq \pi$   
so as to  $\lambda_q \geq 0$

## Circuit for basis transformation: $V$

e.g. hardware-efficient ansatz



## Our ansatz



$$|\rho\rangle = [V \otimes V^*] |D\rangle$$

$$|D\rangle = \tilde{D}|0\rangle = \sum_{\mathbf{q}} \frac{\lambda_{\mathbf{q}}}{C} |\mathbf{q}\rangle_{\mathcal{P}} \otimes |\mathbf{q}\rangle_{\mathcal{A}}$$

$$\lambda_{\mathbf{q}} \geq 0$$



## 2. Define cost function – variational search of steady states

### Markovian master equation in Lindblad form

$$\hat{\mathcal{L}}|\rho(t)\rangle = \left( \underbrace{-i \left( \hat{H} \otimes \hat{1} - \hat{1} \otimes \hat{H}^T \right)}_{\text{Unitary evol.}} + \underbrace{\sum_i \gamma_i \hat{\mathcal{D}}[\hat{\Gamma}_i]}_{\text{Non-unitary evol.}} \right) |\rho(t)\rangle$$

where

$$\hat{\mathcal{D}}[\hat{\Gamma}_i] = \hat{\Gamma}_i \otimes \hat{\Gamma}_i^* - \frac{1}{2} \hat{\Gamma}_i^\dagger \hat{\Gamma}_i \otimes \hat{1} - \hat{1} \otimes \frac{1}{2} \hat{\Gamma}_i^T \hat{\Gamma}_i^*$$

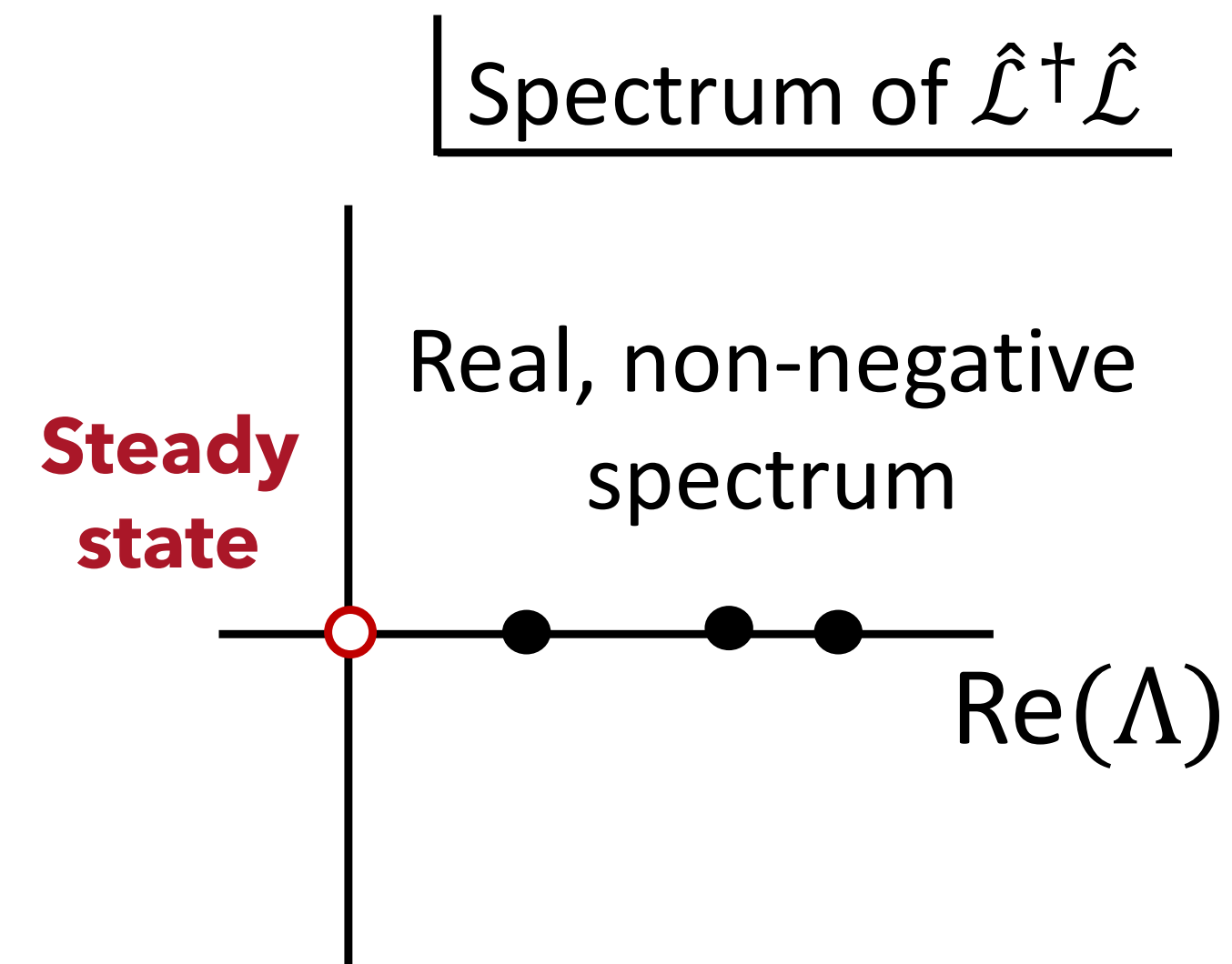
(e.g.  $\hat{\Gamma}_i = \sigma_i^-$  for spontaneous emission,  $T_1$  effect)

### Stationary state as kernel Cui et al. PRL ('15)

$$\hat{\mathcal{L}}|\rho\rangle = 0 \rightarrow \hat{\mathcal{L}}^\dagger \hat{\mathcal{L}}|\rho\rangle = 0$$

This allows us to obtain steady state via

$$\arg \min_{\rho} \frac{\langle \rho | \hat{\mathcal{L}}^\dagger \hat{\mathcal{L}} | \rho \rangle}{\langle \rho | \rho \rangle}$$

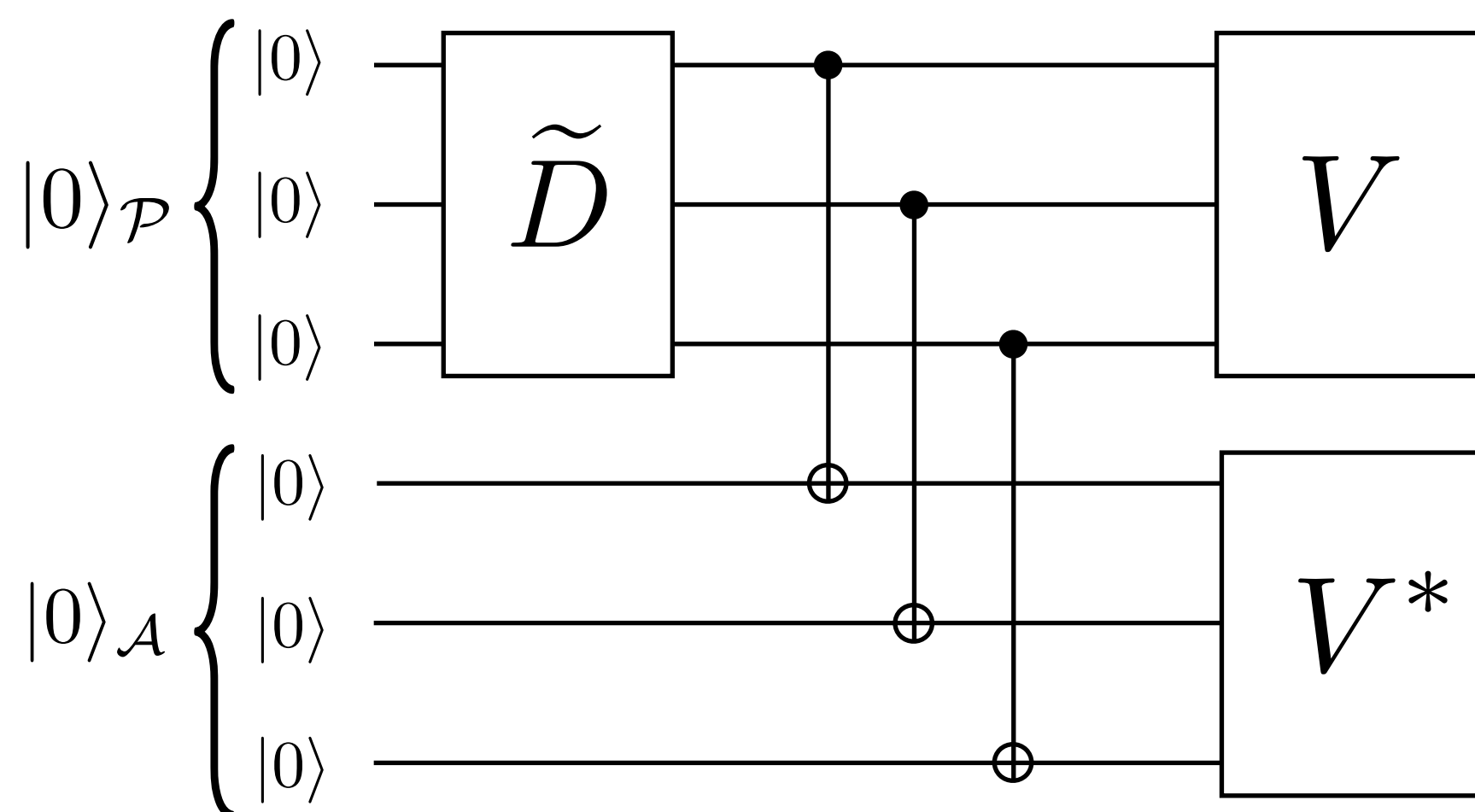


# 3. Measure Observables – efficient way

**Naive way:  
Vector Representation using 2N qubit**

$$\begin{aligned} \langle \hat{A} \rangle &= \text{Tr}[\hat{\rho} \hat{A}] \\ &= \left( \sum_i \langle i|_S \otimes \langle i|_A \right) \hat{A} \otimes \hat{1} |\rho\rangle, \end{aligned}$$

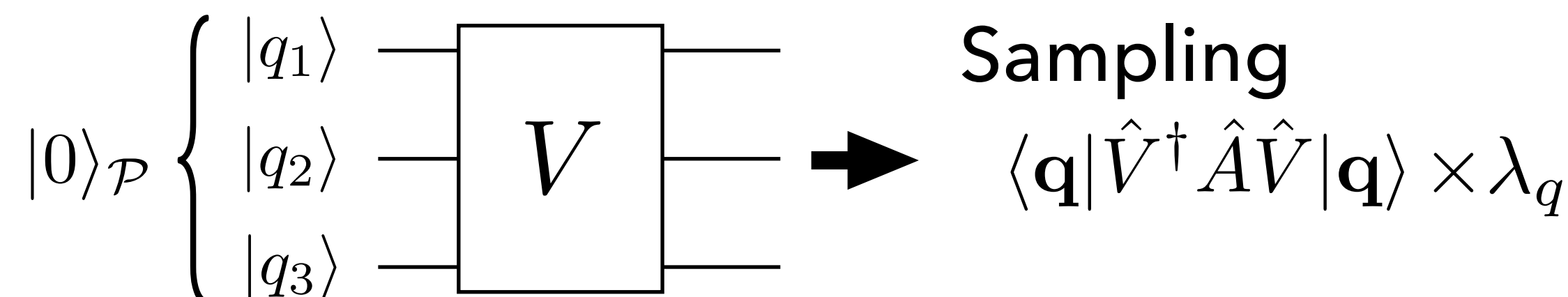
- Post-select "diagonal terms"
- Exponentially inefficient



**Our proposal:  
Matrix Representation using N qubit**

$$\begin{aligned} \langle A \rangle &= \text{Tr}[\hat{\rho} \hat{A}] = \sum_{\mathbf{q}} \lambda_{\mathbf{q}} \langle \psi_{\mathbf{q}} | \hat{A} | \psi_{\mathbf{q}} \rangle \\ &= \sum_{\mathbf{q}} \lambda_{\mathbf{q}} \langle \mathbf{q} | \hat{V}^\dagger \hat{A} \hat{V} | \mathbf{q} \rangle \end{aligned}$$

- Determine  $\{\lambda_{\mathbf{q}}\}$  from sampling
- Measure with initial bit  $\mathbf{q}$  with weight  $\lambda_{\mathbf{q}}$



# Demonstration of our proposal in quantum Ising model

## Model

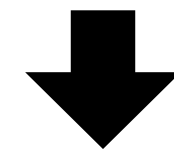
Hamiltonian: ZZ coupling and traverse-field

$$H = \frac{1}{2} \sum_i \sigma_i^z \sigma_{i+1}^z + g \sum_i \sigma_i^x$$

Dissipation: Local damping & dephasing

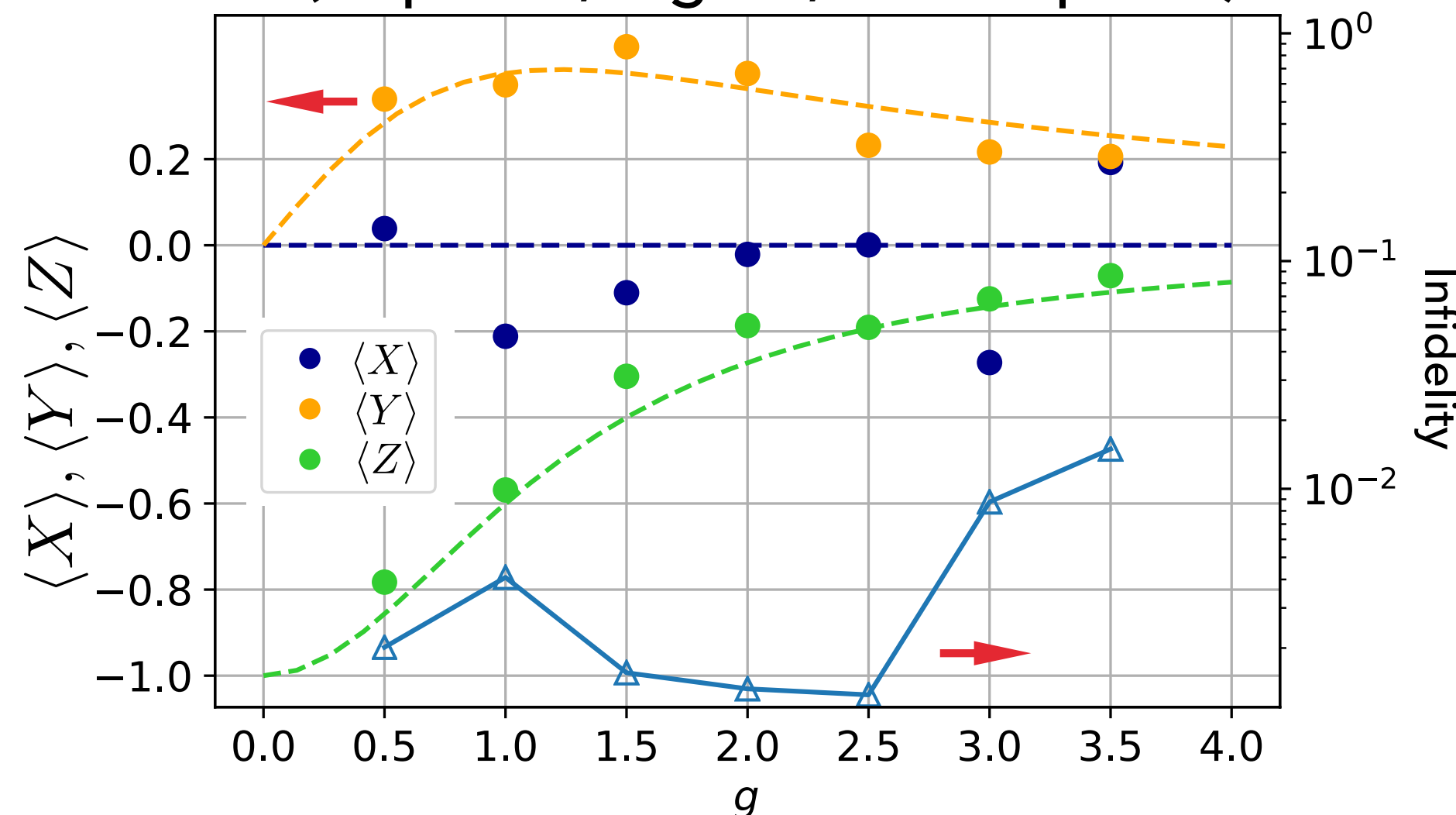
$$c_i^{(1)} = \sigma_i^- \quad c_i^{(2)} = \sigma_i^z \quad \text{with amplitudes } \gamma_1 = 1, \gamma_2 = 0.5$$

$$\hat{\mathcal{L}}|\rho\rangle = \left( -i(H \otimes \mathbb{1} - \mathbb{1} \otimes H^T) + \sum_a \sum_{i=0}^{N-1} \gamma_a \hat{\mathcal{D}}[c_i^{(a)}] \right) |\rho\rangle \quad \hat{\mathcal{D}}[\hat{\Gamma}_i] = \hat{\Gamma}_i \otimes \hat{\Gamma}_i^* - \frac{1}{2} \hat{\Gamma}_i^\dagger \hat{\Gamma}_i \otimes \hat{1} - \hat{1} \otimes \frac{1}{2} \hat{\Gamma}_i^T \hat{\Gamma}_i^*$$



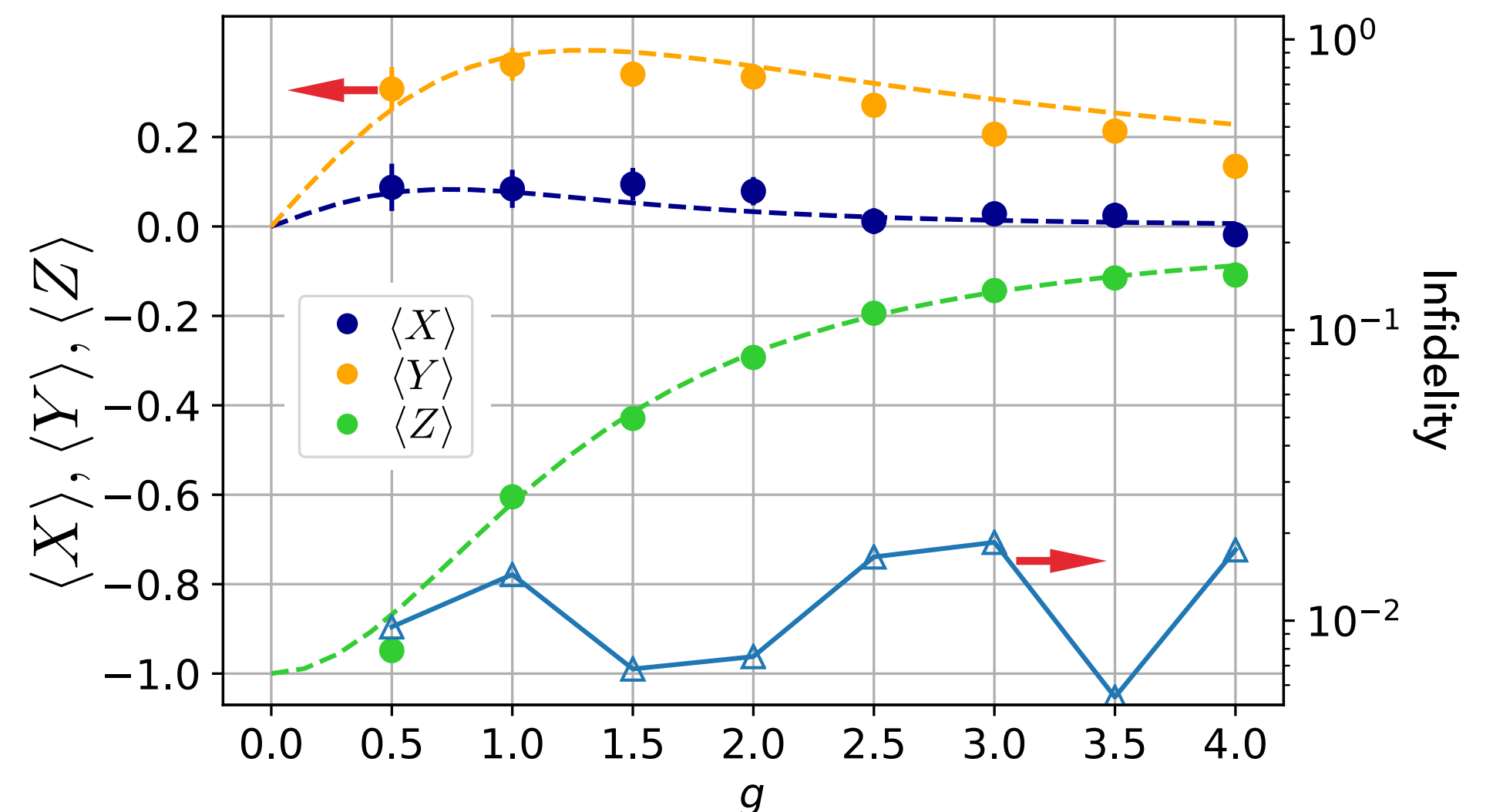
Calculating magnetization curve and density matrix fidelity by dVQE

**Quantum simulation on real NISQ device**  
(Aspen-4, Rigetti, 2N=2 qubits)

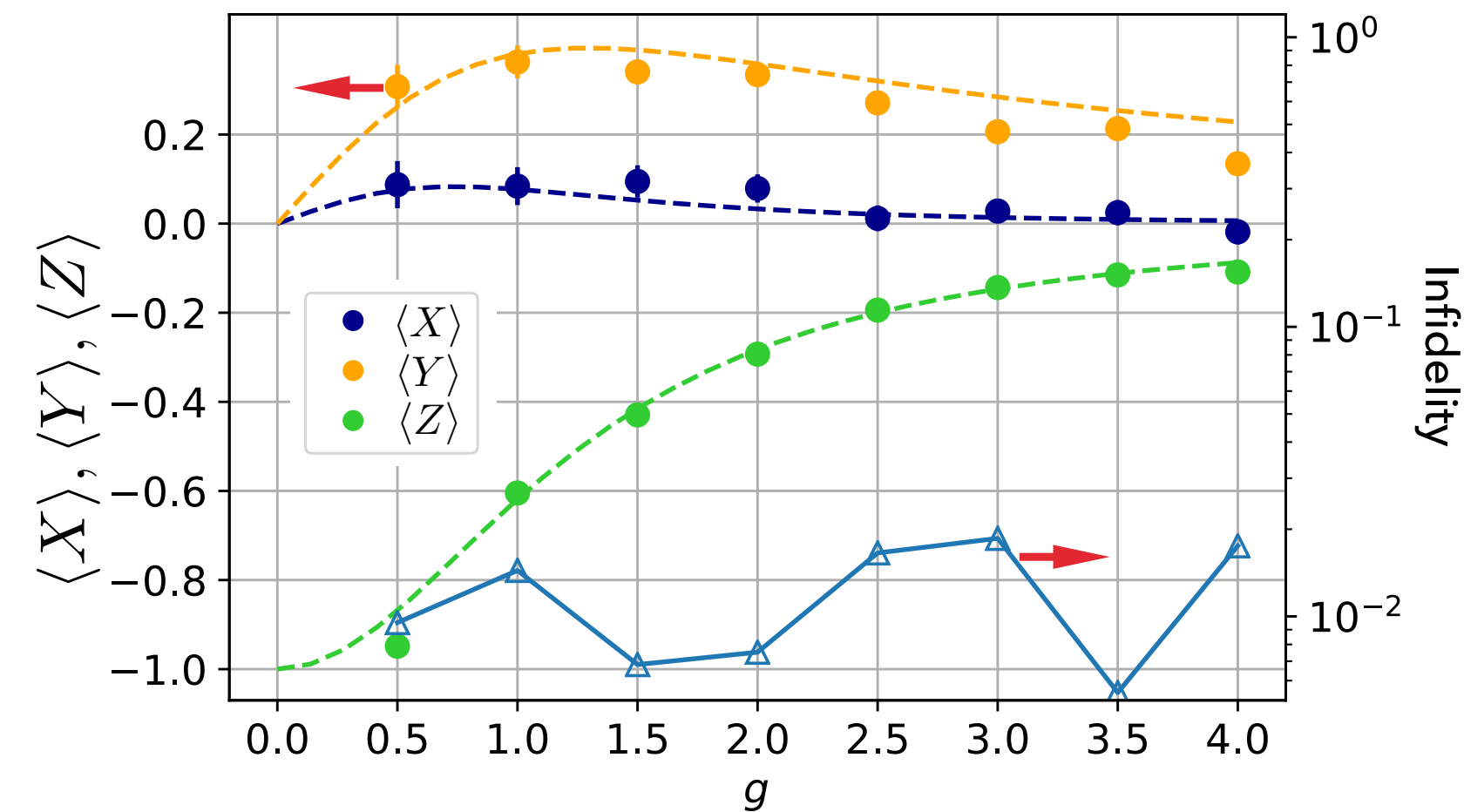
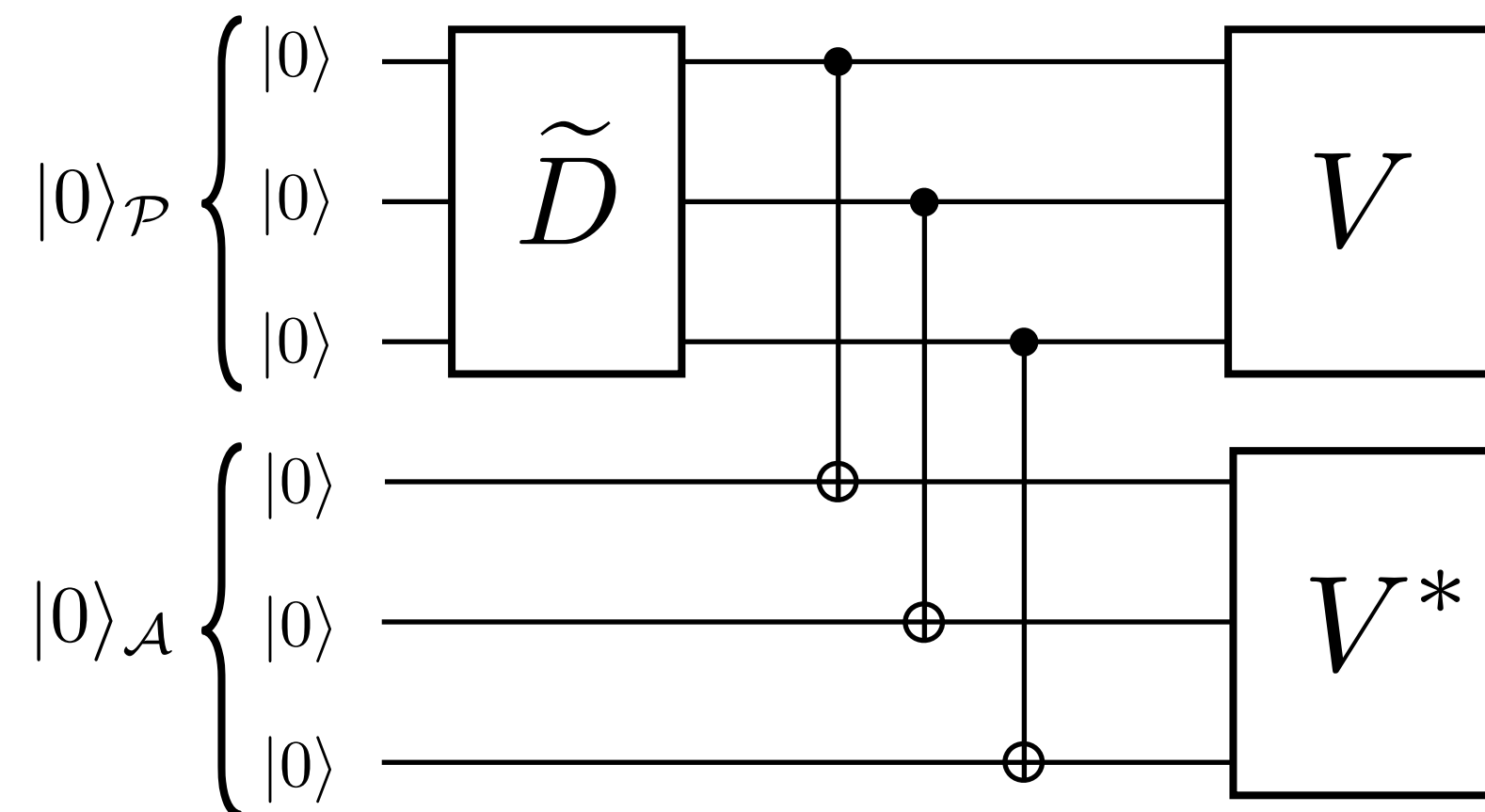


*circles: data of mag.*  
*dashed lines: exact mag.*  
*triangles:*  
*infidelity btw. exact state*

**Numerical simulation, 2N=4 qubits**



- VQE-based algorithm for steady states in Markovian open quantum system (**dVQE**)
- Numerical/Experimental demonstration in dissipative quantum Ising model
- Applications to transport properties in nano devices/molecular systems are expected  
dissipative phase exploration in condensed matter systems



Yoshioka, Nakagawa, Mitarai, and Fujii, [arXiv: 1908.09836](https://arxiv.org/abs/1908.09836)

# **SUPPLEMENTARY MATERIALS**



# Encoding mixed states into pure states

## Choi isomorphism

$$\rho = \sum_{ij} \rho_{ij} |i\rangle\langle j| \quad \mapsto |\rho\rangle = \sum_{ij} \frac{\rho_{ij}}{C} |i\rangle_{\mathcal{P}} \otimes |j\rangle_{\mathcal{A}}$$

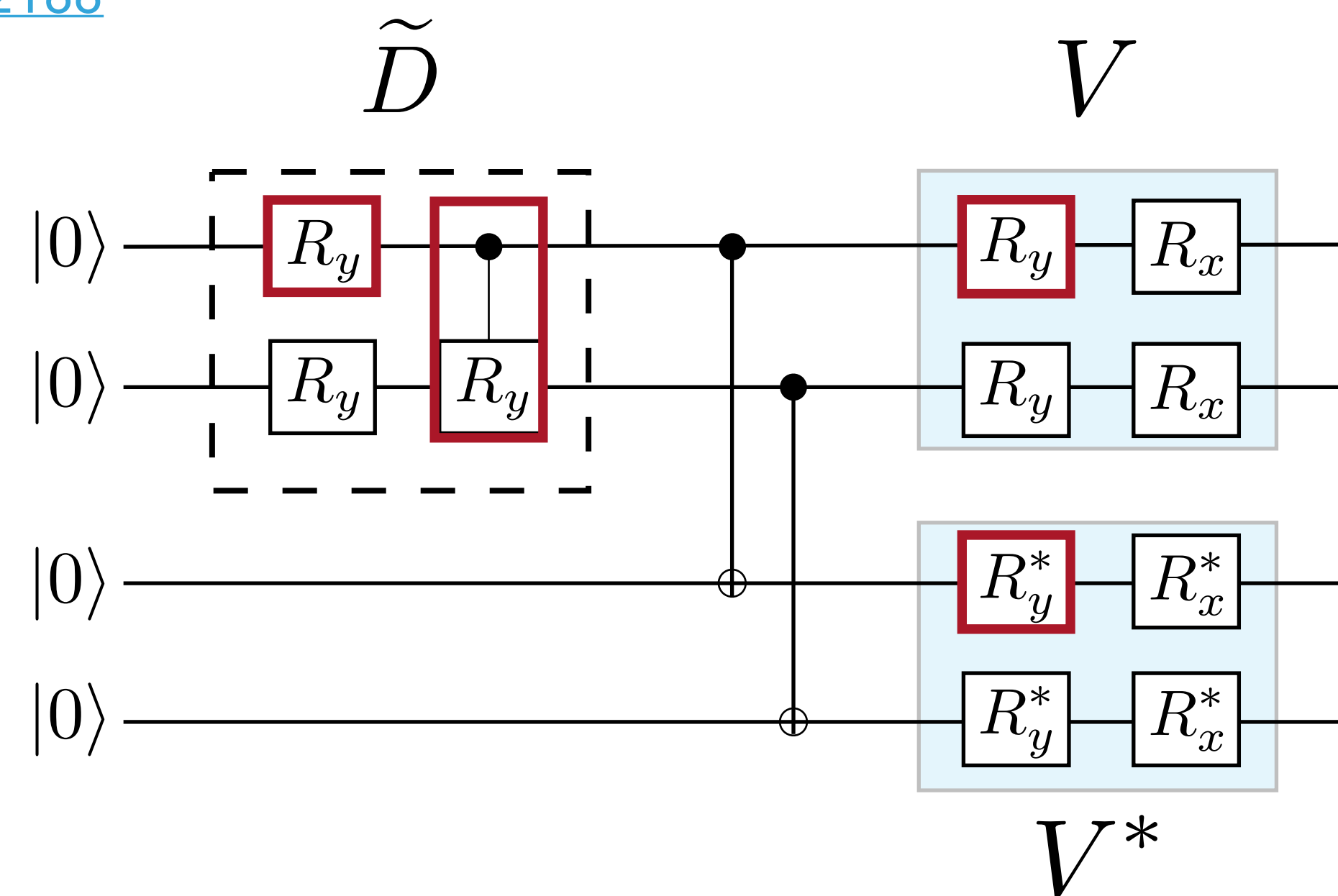
$$\hat{\rho} = \left( \begin{array}{|c|} \hline \color{red}{\rule{0.5cm}{0.2cm}} \\ \hline \color{orange}{\rule{0.5cm}{0.2cm}} \\ \hline \color{green}{\rule{0.5cm}{0.2cm}} \\ \hline \color{blue}{\rule{0.5cm}{0.2cm}} \\ \hline \end{array} \right) \mapsto |\rho\rangle\rangle = \overset{T}{\left( \color{red}{\rule{1.5cm}{0.2cm}} \color{orange}{\rule{1.5cm}{0.2cm}} \color{green}{\rule{1.5cm}{0.2cm}} \color{blue}{\rule{1.5cm}{0.2cm}} \right)}$$

**Map N qubit mixed state → 2N qubit pure state**

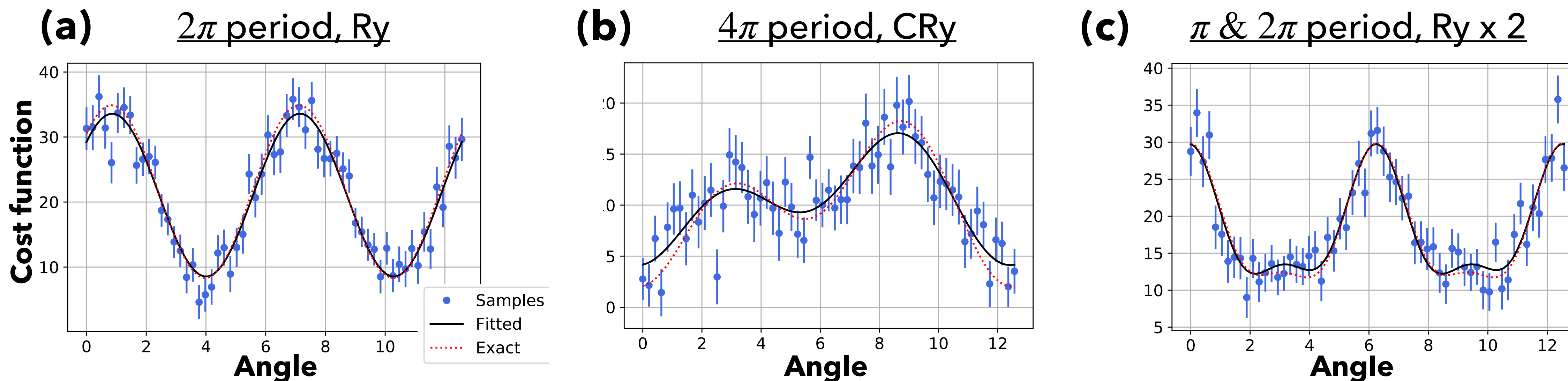
# Details of optimization – sequential minimal optimization

## Nakanishi-Todo-Fujii method Nakanishi, Fuji,&Todo, [arXiv:1903.12166](https://arxiv.org/abs/1903.12166)

- Use periodicity of cost function w.r.t. angles  $\theta$
- Sine-curve-like structure with periods:
  - $2\pi$  for ordinary rotation gates
  - $2^{M+1}\pi$  for  $C^{(M)}$ -Rotation
  - $2\pi/M$  if  $\theta$  appears M times



## Cost function landscape in $2N=4$ qubits



# Gate error mitigation

## Quantum simulation with redundancy

Heya et al., [arXiv:1904.08566](https://arxiv.org/abs/1904.08566)

1. Encode redundancy in the circuit using equation

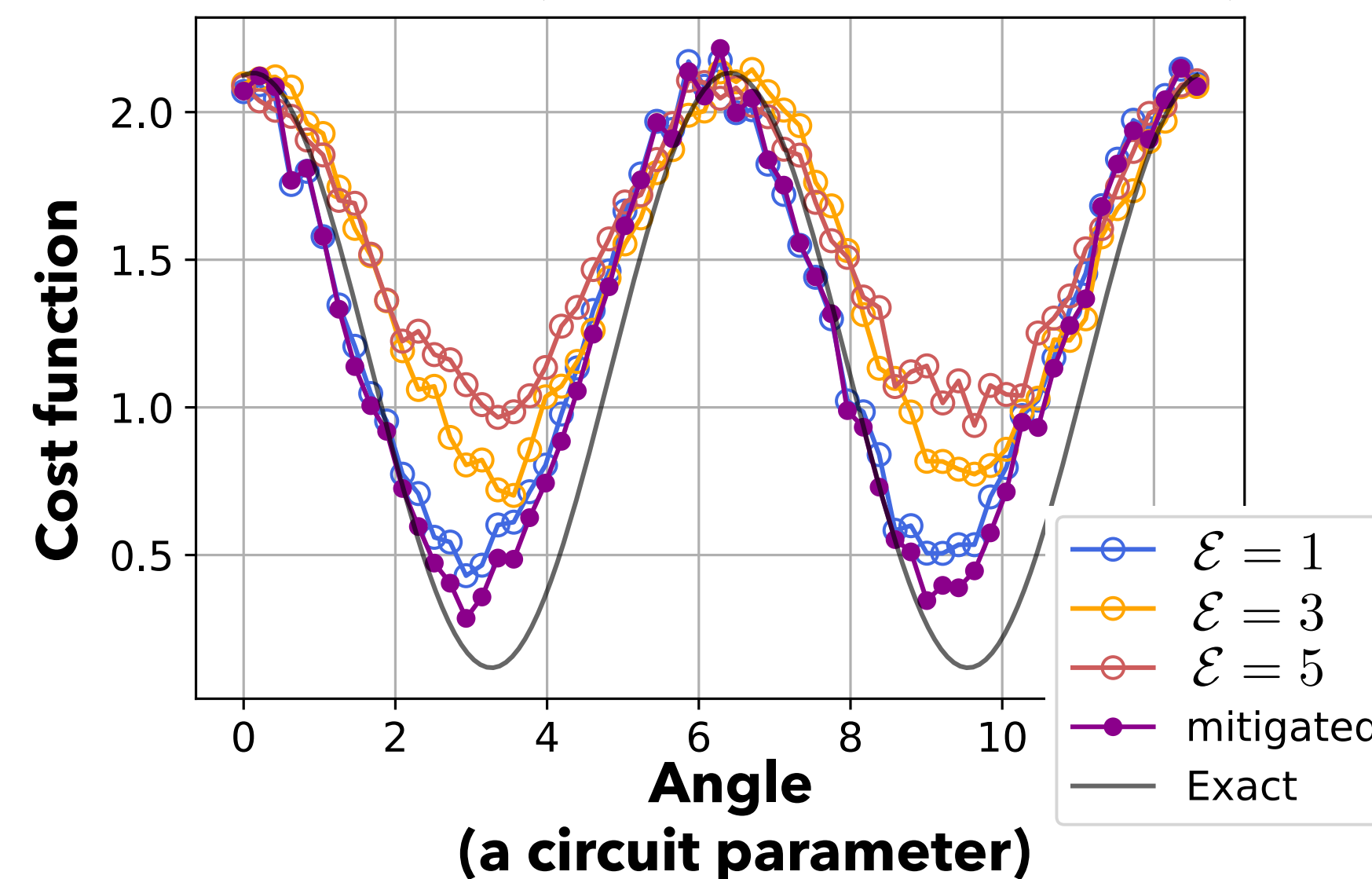
$$R_x(\pm\pi/2) \equiv R_z(\pi) (R_x(\pm\pi/2))^\mathcal{E} R_z(\pi)$$

$$CZ \equiv CZ^\mathcal{E}$$

for odd  $\mathcal{E} \in \{1, 3, 5, \dots\}$

2. Sample cost function
3. Mitigate by linear extrapolation w.r.t  $\varepsilon$

**Cost function (2N=2, real NISQ device)**



## Numerical simulation: depolarizing

1. Applying depolarizing channel for each k-qubit gates as

$$\rho \mapsto \rho' = (1 - \frac{p_k}{\text{rate}}) \rho + \frac{4^k - 1}{4^k} p_k \mathbb{I}$$

2. Sample cost function
3. Mitigate by linear extrapolation w.r.t.  $p_k$