



# Physical-model gate set tomography

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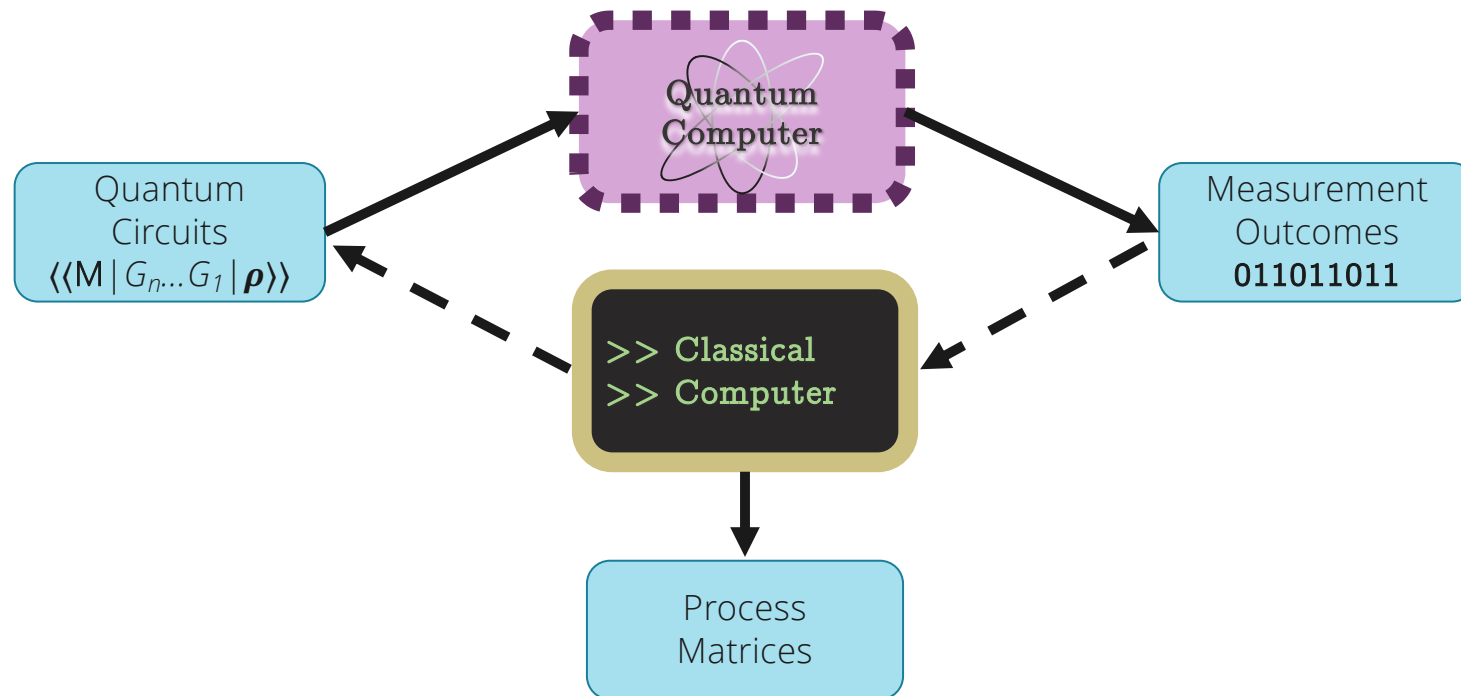


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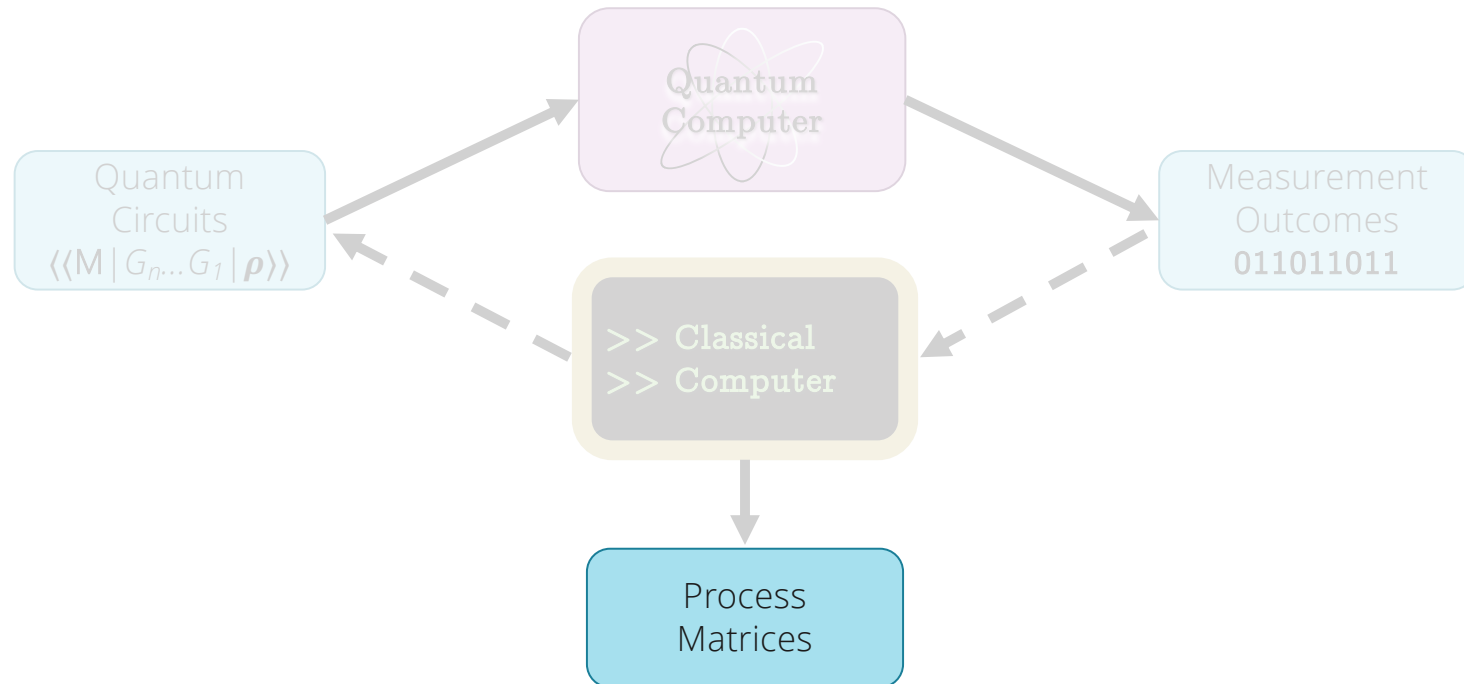


## Gate Set Tomography





## Process Matrices





## Process Matrices

$$\rho \mapsto \mathcal{E}(\rho)$$

$$|\rho\rangle\rangle \mapsto \textcolor{red}{E}|\rho\rangle\rangle$$

- The Good:  
Completely-positive, trace-preserving maps on density matrices.  
Can predict the outcomes of any Markovian quantum circuit.

- The Bad:  
Dense  $4^N \times 4^N$  matrices of real numbers are difficult to interpret.  
Learning these parameters requires many experiments.

- The Ugly:  
Gauge freedom.

Process  
Matrices  
No obvious connection between  
parameters and experiments.

$$E \mapsto GEG^{-1}$$

$$|\rho\rangle\rangle \mapsto G|\rho\rangle\rangle$$

$$\langle\langle M| \mapsto \langle\langle M|G^{-1}$$



## Two methods to better characterization

1

Physics-inspired  
reduced error  
models

2

Detailed  
physical  
simulation



## Reforming process matrices with error generators

Error  
Generators

Physicists often care more about Hamiltonians than the unitary operator they induce

Similarly, *error generators* can be more informative than the process matrices they generate.

$$\rho \longmapsto \mathcal{E}(\rho)$$

$$|\rho\rangle\rangle \longmapsto E |\rho\rangle\rangle$$

$$|\rho\rangle\rangle \longmapsto e^{\Delta U} |\rho\rangle\rangle$$



## Reforming process matrices with error generators

Error  
Generators

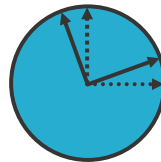
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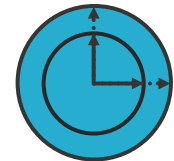
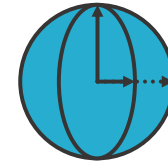
Physicists often care more about Hamiltonians than the unitary operator they induce

Similarly, *error generators* can be more informative than the process matrices they generate.



coherent (unitary) processes

$\mathbb{H}$



Pauli stochastic errors  
(eg., dephasing or depolarization)

$\mathbb{S}$



## Reforming process matrices with error generators

Error  
Generators

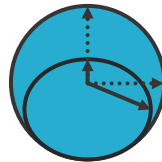
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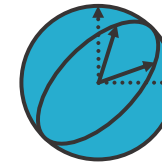
Physicists often care more about Hamiltonians than the unitary operator they induce

Similarly, *error generators* can be more informative than the process matrices they generate.



affine errors  
(eg., amplitude damping)

$\mathbb{A}$



correlated Pauli stochastic errors  
(eg., dephasing in the X+Z direction)

$\mathbb{C}$





## Reforming process matrices with error generators

Error  
Generators

$$\rho \longmapsto \mathcal{E}(\rho)$$

$$|\rho\rangle\rangle \longmapsto E |\rho\rangle\rangle$$

$$|\rho\rangle\rangle \longmapsto e^{\Delta U} |\rho\rangle\rangle$$

Physicists often care more about Hamiltonians than the unitary operator they induce.

Similarly, *error generators* can be more informative than the process matrices they generate.

$$E = \begin{pmatrix} 1 & 0 & 0 & 0 \\ 0 & .95 & .1 & -.01 \\ 0 & .1 & .95 & .01 \\ .1 & -0.05 & -.02 & .99 \end{pmatrix}$$



## Reforming process matrices with error generators

Error  
Generators

$$\rho \longmapsto \mathcal{E}(\rho)$$

$$|\rho\rangle\rangle \longmapsto E |\rho\rangle\rangle$$

$$|\rho\rangle\rangle \longmapsto e^{\Delta} U |\rho\rangle\rangle$$

Physicists often care more about Hamiltonians than the unitary operator they induce.

Similarly, *error generators* can be more informative than the process matrices they generate.

$$\Delta = \begin{cases} 0.01\mathbb{H}_Y + 0.005\mathbb{H}_X \\ +0.005\mathbb{S}_X + 0.005\mathbb{S}_Y + 0.04\mathbb{S}_Z \\ +0.01\mathbb{C}_{XY} + 0.005\mathbb{C}_{YZ} + 0.1\mathbb{A}_{XX} \end{cases}$$

For reasonably good quantum computers, error generators are **small**, and many generators may be indistinguishable from ZERO.



## Reduced models with error generators

Error  
Generators

$$\rho \mapsto \mathcal{E}(\rho)$$

$$|\rho\rangle\rangle \mapsto E |\rho\rangle\rangle$$

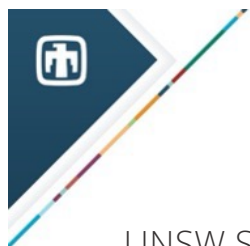
$$|\rho\rangle\rangle \mapsto e^{\Delta U} |\rho\rangle\rangle$$

Error generators enable construction of *reduced models*.

- Ask your theorist which error generators to expect, and only include those in your model.

Reduced models have:

- Fewer parameters
- Require fewer experiments to fit
- Display MUCH less gauge freedom
- Have more direct ties to experiments



## Reduced model for silicon qubits – *learned from data*

UNSW Silicon Qubits (with Morello group)

Experiments for full 2Q GST

Data explained using a reduced model ( $H1 + S1 + ZZ^*$ )

$$ZZ^* = H_{ZZ} + H_G \cdot ZZ$$

	Q <sub>1</sub>		Q <sub>2</sub>			2Q
Gate	XI	YI	IX	IY	-IY	CZ
Hamiltonian ( $H1+ZZ^*$ )	IX, IY, IZ, XI, YI, ZI, ZZ, YZ	IX, IY, IZ, XI, YI, ZI, ZZ, XZ	IX, IY, IZ, XI, YI, ZI, ZZ, ZY	IX, IY, IZ, XI, YI, ZI, ZZ, ZX	IX, IY, IZ, XI, YI, ZI, ZZ, ZX	IX, IY, IZ, XI, YI, ZI, ZZ
Stochastic (S1)	IX, IY, IZ, XI, YI, ZI,	IX, IY, IZ, XI, YI, ZI,	IX, IY, IZ, XI, YI, ZI,	IX, IY, IZ, XI, YI, ZI,	IX, IY, IZ, XI, YI, ZI,	IX, IY, IZ, XI, YI, ZI,

Fully general process matrix model

- 1503 parameters
- Used 1592 circuits

Reduced error generator model

- 83 gate + 63 SPAM = 146
- *Could have been fit with far fewer circuits!*
- *All of these parameters make physical sense!*

- Mądzik et al., Nature 601, 348–353 (2022)



## Reduced model for $^{171}\text{Yb}$ qubits

Laser phase, amplitude, timing, 1-photon detuning, 2-photon detuning, spontaneous scattering, clock errors,

	$Q_1$		$Q_2$		2Q		
Gate	$G_{IX}$	$G_{IY}$	$G_{XI}$	$G_{YI}$	$G_{II}$	$G_{XX}$	$G_{MS}$
Hamiltonian (H)	IX, IY, IZ, XI, YI, ZI	IX, IY, IZ, XI, YI, ZI	IX, IY, IZ, XI, YI, ZI	IX, IY, IZ, XI, YI, ZI	IX, IY, IZ, XI, YI, ZI	IX, IY, IZ, XI, YI, ZI	IX, IY, IZ, XI, YI, ZI XX, XY, YX, YY
Stochastic (S)	IX, IY, IZ, XI, YI, ZI	IX, IY, IZ, XI, YI, ZI	IX, IY, IZ, XI, YI, ZI	IX, IY, IZ, XI, YI, ZI	IX, IY, IZ, XI, YI, ZI	IX, IY, IZ, XI, YI, ZI	IX, IY, IZ, XI, YI, ZI XX, XY, YX, YY
Correlation (C)	ZI:IZ	ZI:IZ	ZI:IZ	ZI:IZ	ZI:IZ	ZI:IZ XI:IX	ZI:IZ
Active (A)	$I\sigma_-$	$I\sigma_-$	$\sigma_-I$	$\sigma_-I$		$I\sigma_-$ , $\sigma_-I$	$I\sigma_-$ , $\sigma_-I$

Fully general process matrix model

- $240 \times 7$  Gate + 63 SPAM = 1743

Reduced error generator model

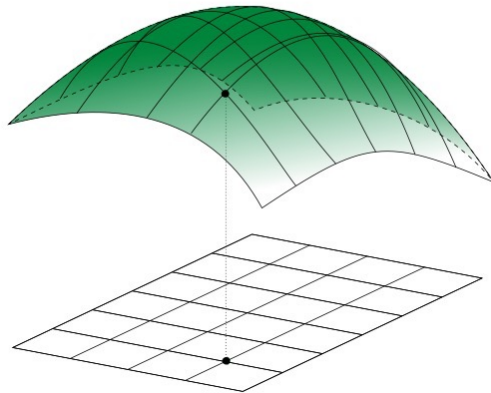
- 108 gate + 63 SPAM = 171



pyGSTi.extras.interpygate

$$|\rho\rangle\rangle \mapsto e^{\Delta} U |\rho\rangle\rangle$$

$$\Delta = \Delta(\vec{a})$$



Physics models functions:

experimental parameters  $\rightarrow$  process matrices

Generally **too expensive** for iterative optimizers that fit models to data.

pyGSTi.extras.interpygate approximates this function by:

1. Evaluate on hypergrid of the input parameter space
2. Computing an error generator at each point
3. Interpolate with a multivariate cubic spline
4. Save as a file, and share

This procedure is embarrassingly parallel, so is compatible with HPCs.

Now you can do GST with far fewer circuits, no gauge problem, and parameters that mean something to experimentalists!



## Acknowledgements

We'd love to deploy these tools on your hardware! If you have a simulator and would like to use to to do tomography, let us know!

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