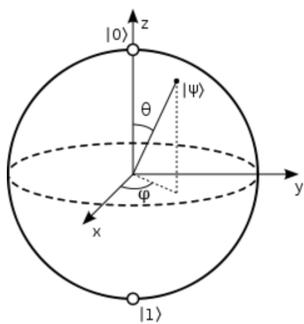


Example: Pure qubit



Configuration \mathbf{i} represented by $|\mathbf{i}\rangle$.

Vectors $\{|\mathbf{i}\rangle\}$ form an orthonormal basis.

Vector spaces:
Quantum, complex
Classical, real and +ve

Observable O takes value O_i in configuration \mathbf{i} .

$\langle O \rangle$ is expectation value.

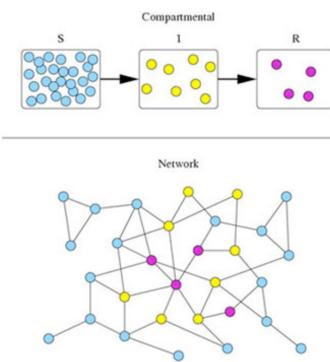
Usually easiest to minimise 2-norm error.

Quantum easier than classical!

Pure quantum vs. classical stochastic

| | Quantum | Classical |
|------------------------------|---|---|
| Source of uncertainty | Fundamental, pure quantum superposition | Classical uncertainty, lack of knowledge |
| Description | State vector $ \psi\rangle = \sum_{\mathbf{i}} \psi_{\mathbf{i}} \mathbf{i}\rangle$ | Probability vector $ P\rangle = \sum_{\mathbf{i}} P_{\mathbf{i}} \mathbf{i}\rangle$ |
| Evolution | Schrödinger equation $i\hbar \frac{d \psi\rangle}{dt} = H \psi\rangle$ | Master equation $\frac{d P\rangle}{dt} = H P\rangle$ |
| Probabilities | $ \psi_{\mathbf{i}} ^2$ | $P_{\mathbf{i}}$ |
| Properties | H is Hermitian $U(t) = e^{-iHt/\hbar}$ is unitary | H is infinitesimal stochastic $S(t) = e^{Ht}$ is stochastic |
| Error bounds | $ \langle O \rangle^{\psi} - \langle O \rangle^{\phi} \leq \max_{\mathbf{i}} \{O_{\mathbf{i}}\} \ \psi - \phi\ _2$ | $ \langle O \rangle^P - \langle O \rangle^Q \leq \max_{\mathbf{i}} \{O_{\mathbf{i}}\} \ P - Q\ _1$ |

Example: Epidemic flows



Classical rate equation written in Schrödinger form.

“Hamiltonian” H contains **transition rates** between configurations.

Stochastic operators take one probability vector to another.

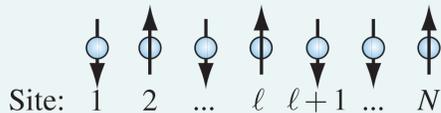
All entries are positive, and columns add to unity.

p -norms:

$$\|v\|_p = \left(\sum_{\mathbf{i}} |v_{\mathbf{i}}|^p \right)^{\frac{1}{p}}$$

Matrix product state methods

Motivation. Take a multi-partite system, e.g., a spin chain



Each site has d possible configurations $i_{\ell} = 1, 2, \dots, d$.
This means there are d^N global configurations $\mathbf{i} = (i_1 i_2 \dots i_N)$.

Example: 100 sites with 2 local states
1267650600228229401496703205376 configurations
158456325028528675 terabytes

Curse of dimensionality!

Matrix product state methods allow us to efficiently store, evolve and compute expectation values from the state vector.

Storage. Product state

$$P_{\mathbf{i}} = P_{i_1}^{[1]} P_{i_2}^{[2]} \dots P_{i_N}^{[N]}$$

Efficient but uncorrelated.

Evolution. Split into time-steps

$$S(t) = e^{Ht} = e^{H\delta t} e^{H\delta t} \dots e^{H\delta t}$$

For local transitions $H = \sum_{\ell=1}^{N-1} h_{\ell, \ell+1}$

Generalisation: matrix product state

$$P_{\mathbf{i}} = A_{i_1}^{[1]} \times A_{i_2}^{[2]} \times \dots \times A_{i_N}^{[N]}$$

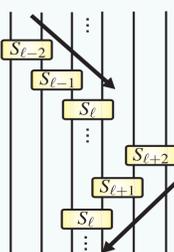


$$e^{H\delta t} = \left(\sum_{\ell=1}^{N-1} e^{h_{\ell, \ell+1} \delta t / 2} \right) \left(\sum_{\ell=N-1}^1 e^{h_{\ell, \ell+1} \delta t / 2} \right) + O(\delta t^3)$$

S_{ℓ} = two-site gate

Sequence of two-site gates

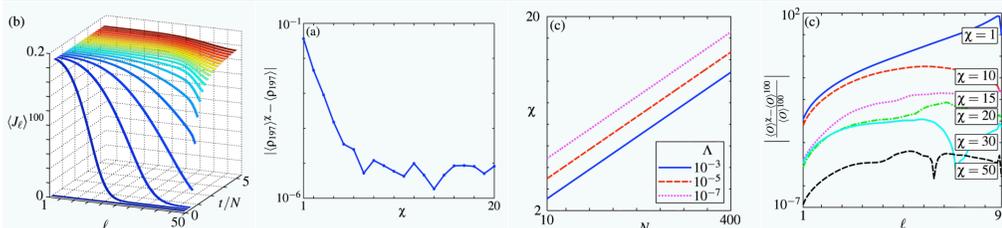
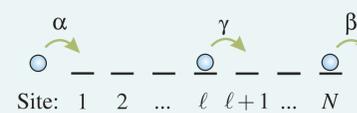
Two-site gates can be implemented approximately and efficiently.



Efficient and describes correlations.

Applied to a classical system

The TASEP. A paradigm for traffic, queues, and protein transport.



Evolution from an empty state
Observable error drops rapidly with size of matrices
Even for large systems, small matrices shown shows accuracy to be accurate
Convergence of expectation value shows accuracy to be accurate

Quantum methods simulate this classical model very successfully

Future questions and references

- What physical property ensures simulability for classical systems?
- How do these methods compare to Monte Carlo methods?
- When does sampling break down, when are these methods needed?
- What are the important 1D classical models with local transitions?
- Which other quantum-based methods can be made classical?

[1] S.R. White, Phys. Rev. Lett. **69**, 2863 (1992) [2] G. Vidal, Phys. Rev. Lett. **93**, 040502 (2004)
[3] R.A. Blythe *et al*, J. Phys. A **40**, R333 (2007) [4] B. Derrida *et al*, J. Phys. A **26**, 1493 (1993)