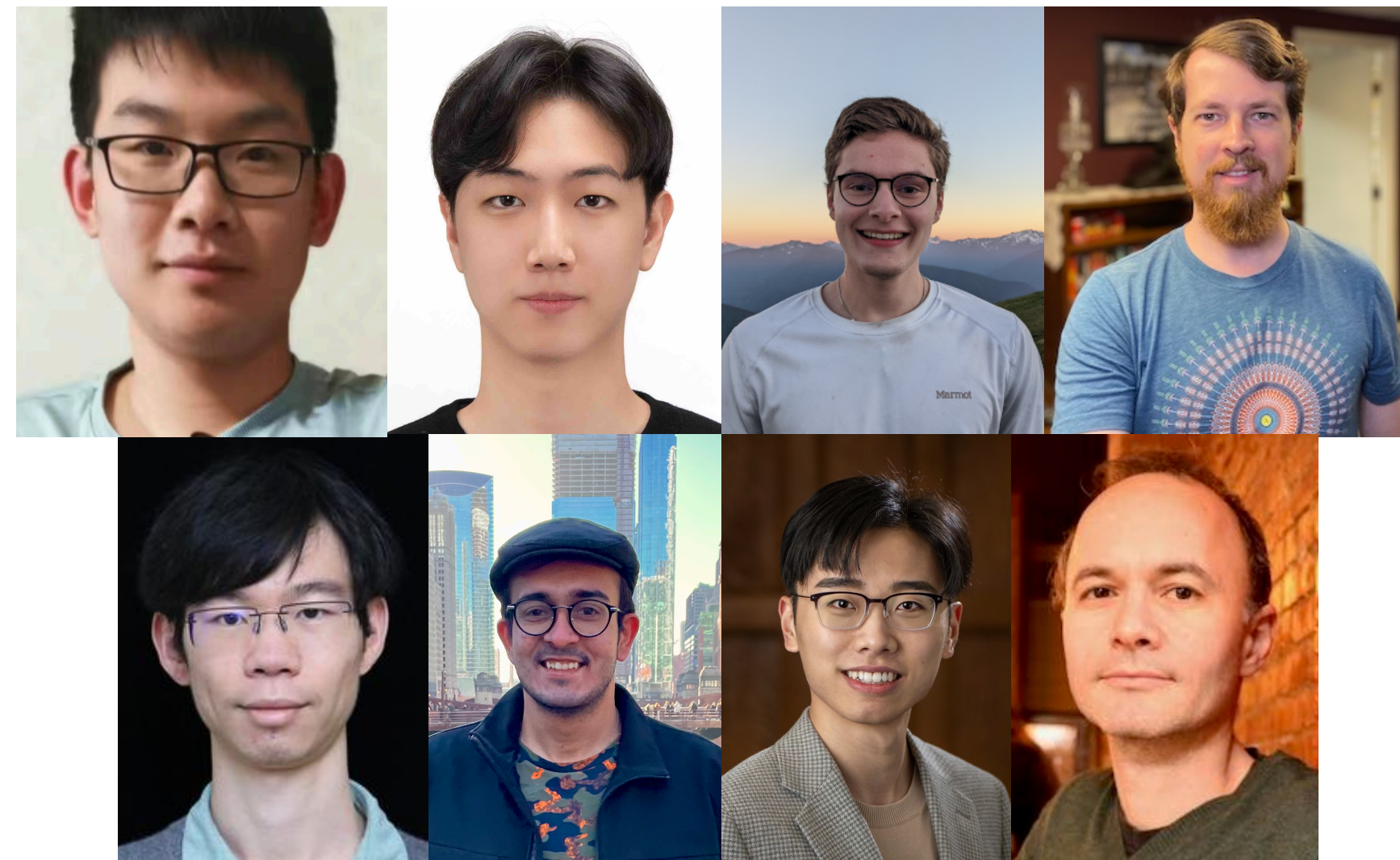


# GraFeyn

## Efficient Parallel Sparse Simulation of Quantum Circuits

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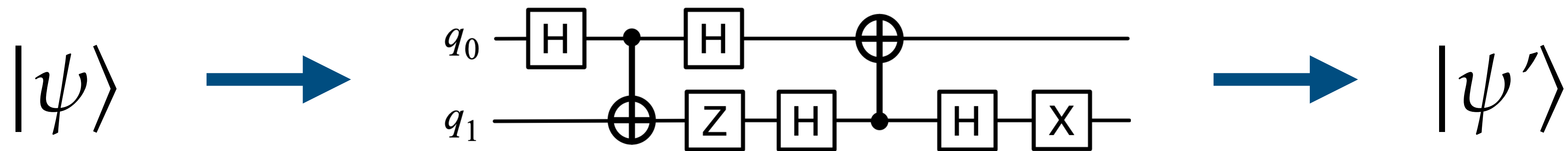


<sup>1</sup> Carnegie Mellon University  
<sup>2</sup> New York University  
<sup>3</sup> Yale University

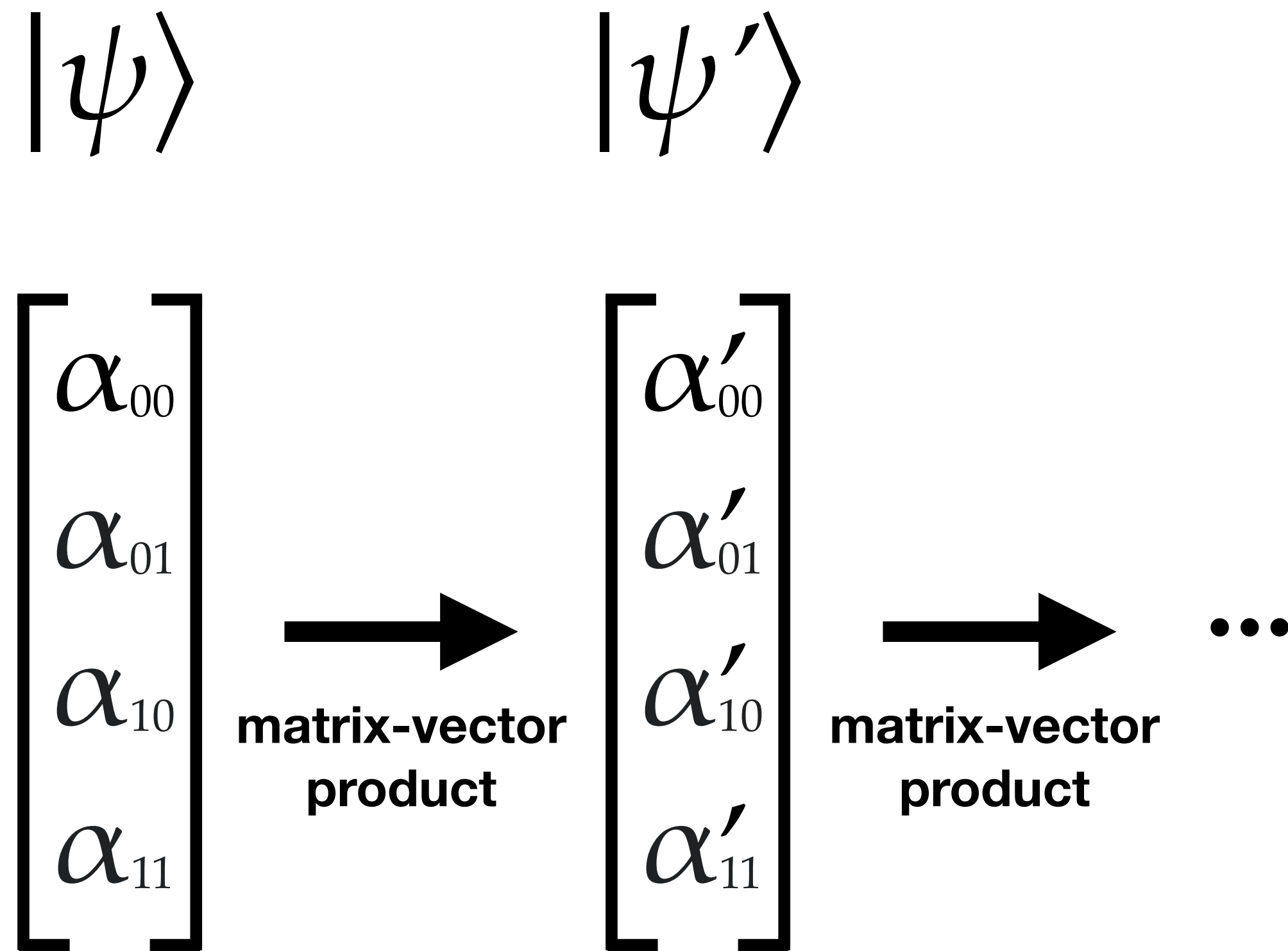
**Sam Westrick**<sup>2</sup> Pengyu Liu<sup>1</sup> Byeongjee Kang<sup>1</sup> Colin McDonald<sup>1</sup> Mike Rainey<sup>1</sup>  
Mingkuan Xu<sup>1</sup> Jatin Arora<sup>1</sup> Yongshan Ding<sup>3</sup> Umut Acar<sup>1</sup>

# Pure Quantum Simulation

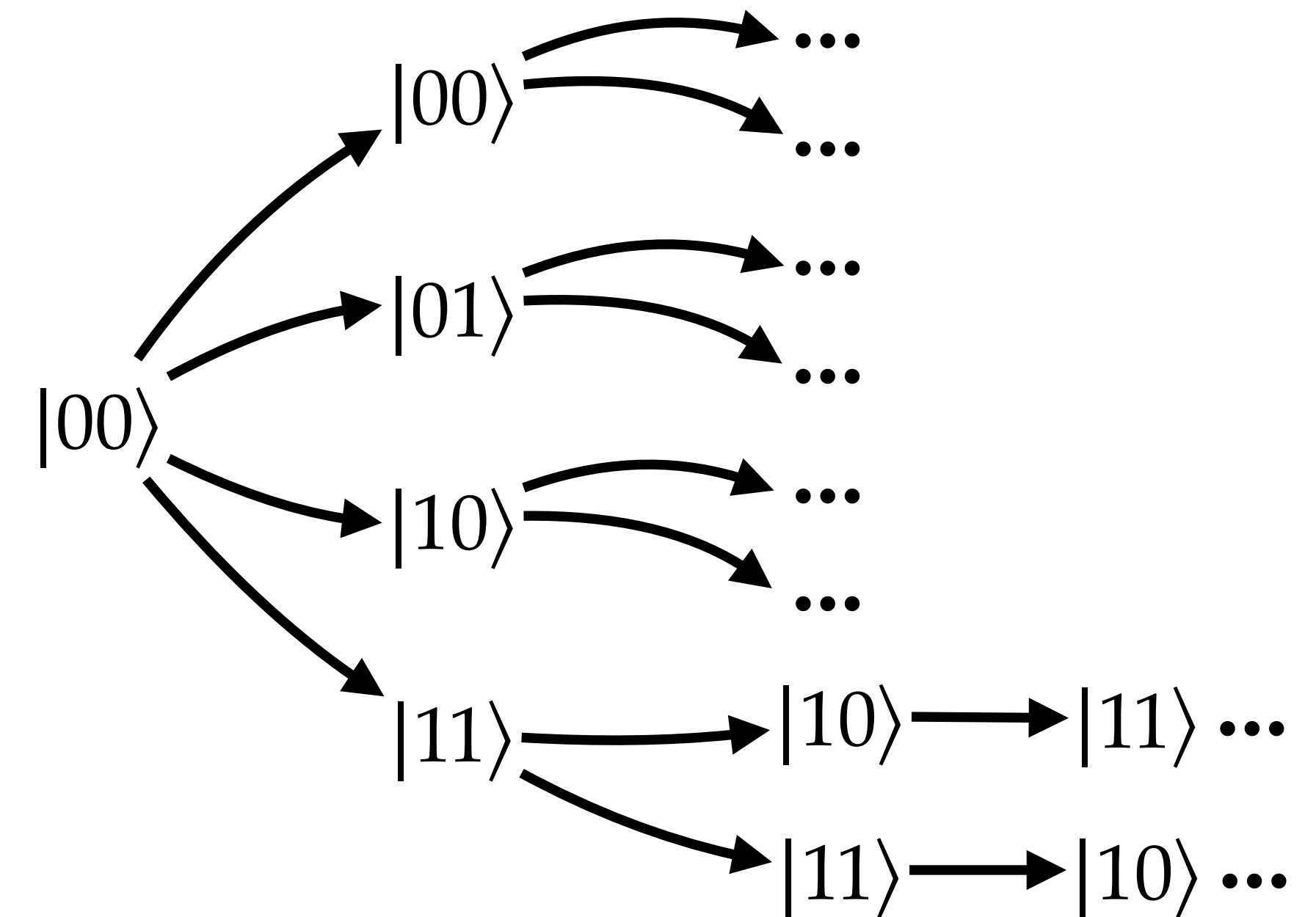
- classical simulation of quantum circuits
- just pure quantum gates (no measurement, resets, barriers, etc.)
- full input and output state vectors
- useful for testing, debugging...
  - and perhaps hybrid quantum/classical?



# (Very Broadly) Two Approaches to Simulation

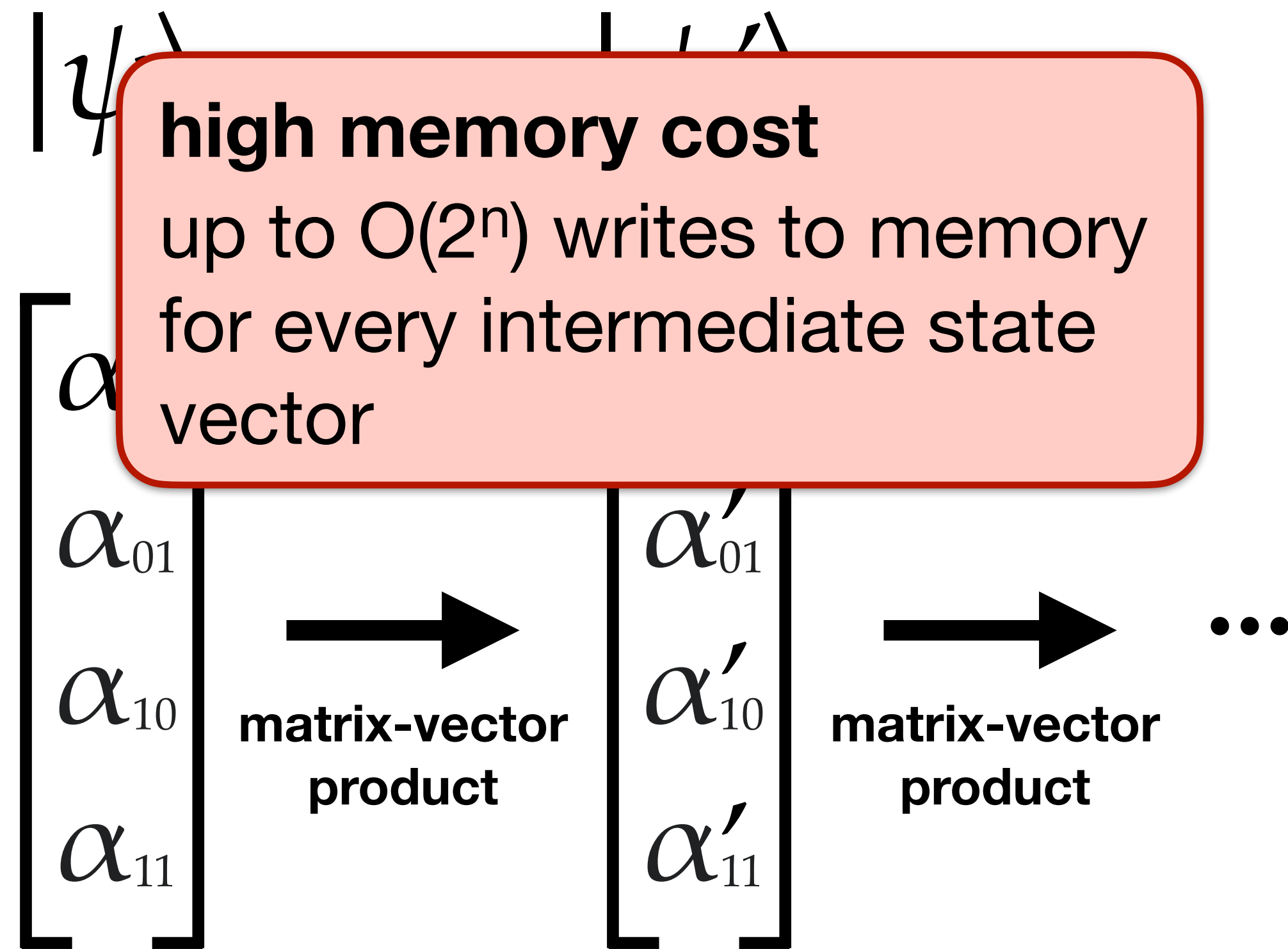


**“Schrödinger-style” (state vector)**

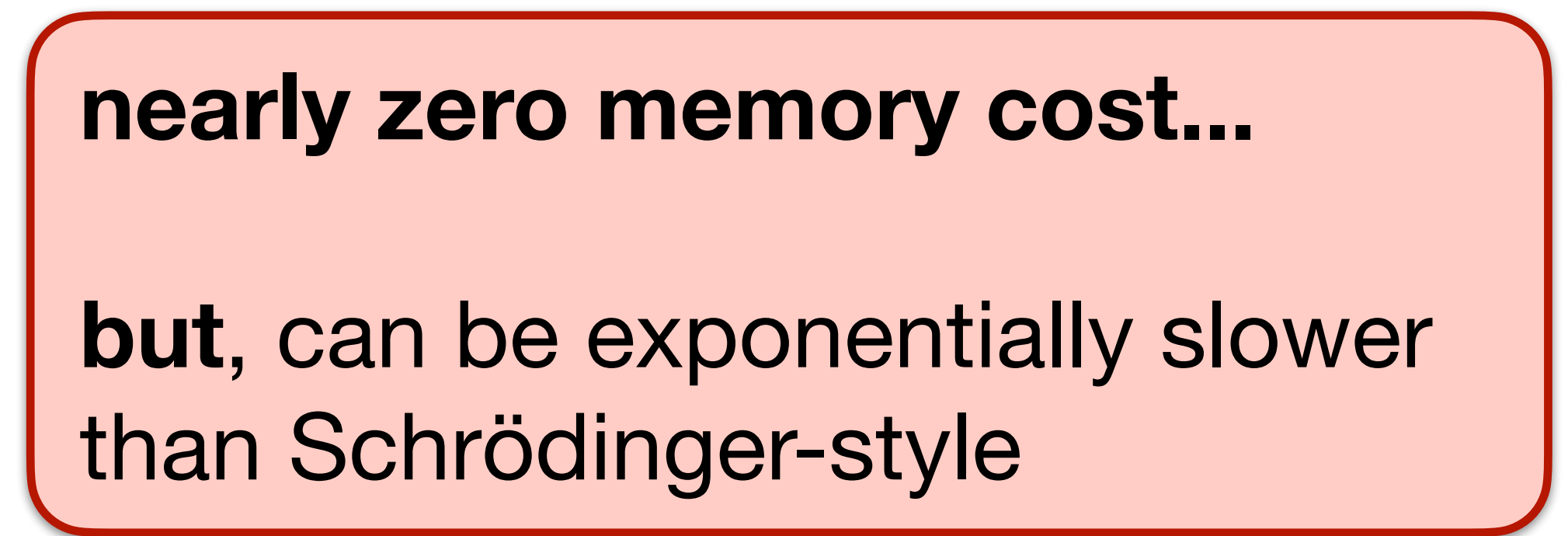


**Feynman path summations**

# (Very Broadly) Two Approaches to Simulation



“Schrödinger-style” (state vector)

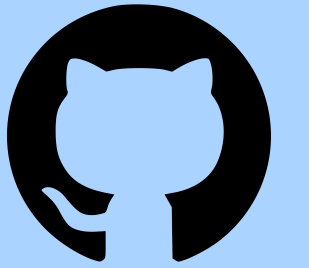


Feynman path summations

# GraFeyn

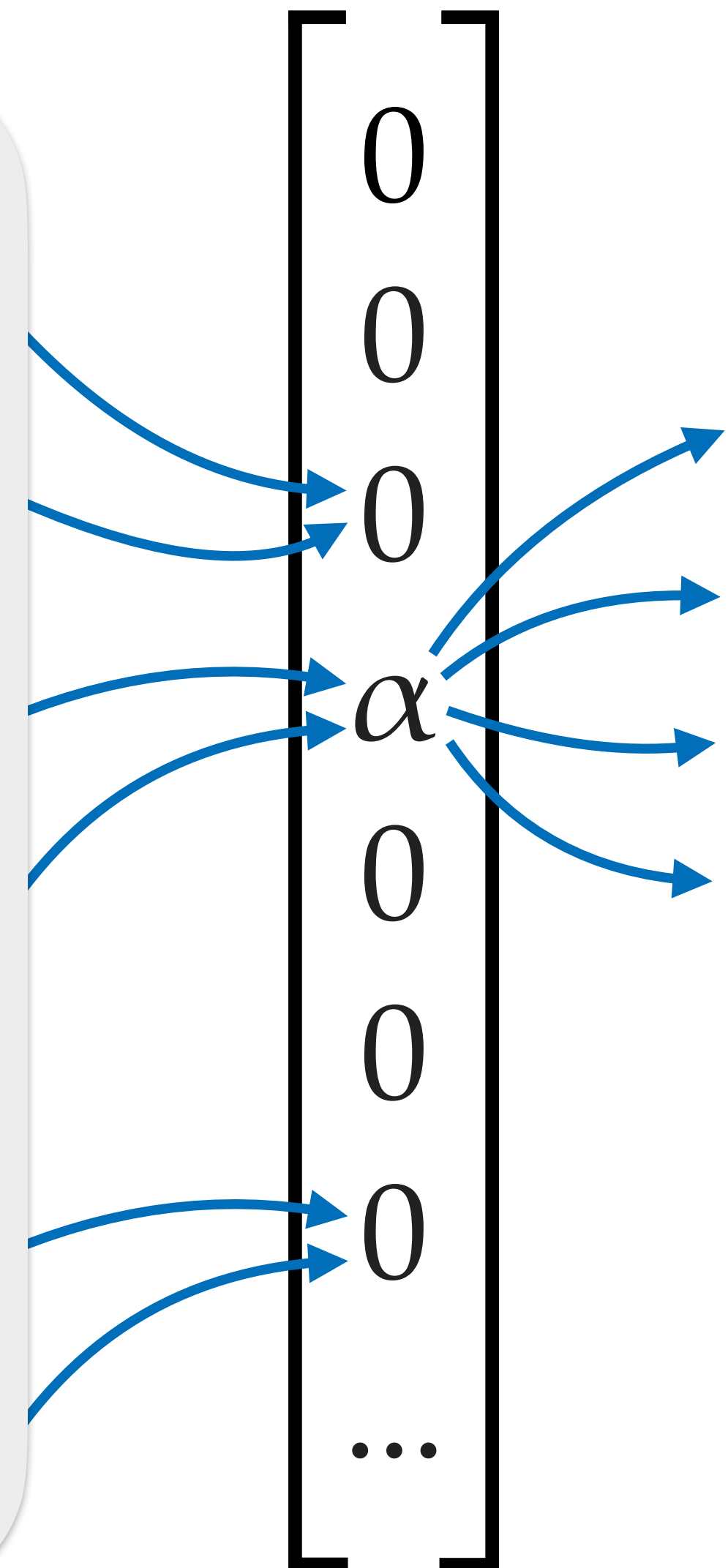
## Getting the Best of Both Worlds

[github.com/cmu-top/grafeyn](https://github.com/cmu-top/grafeyn)



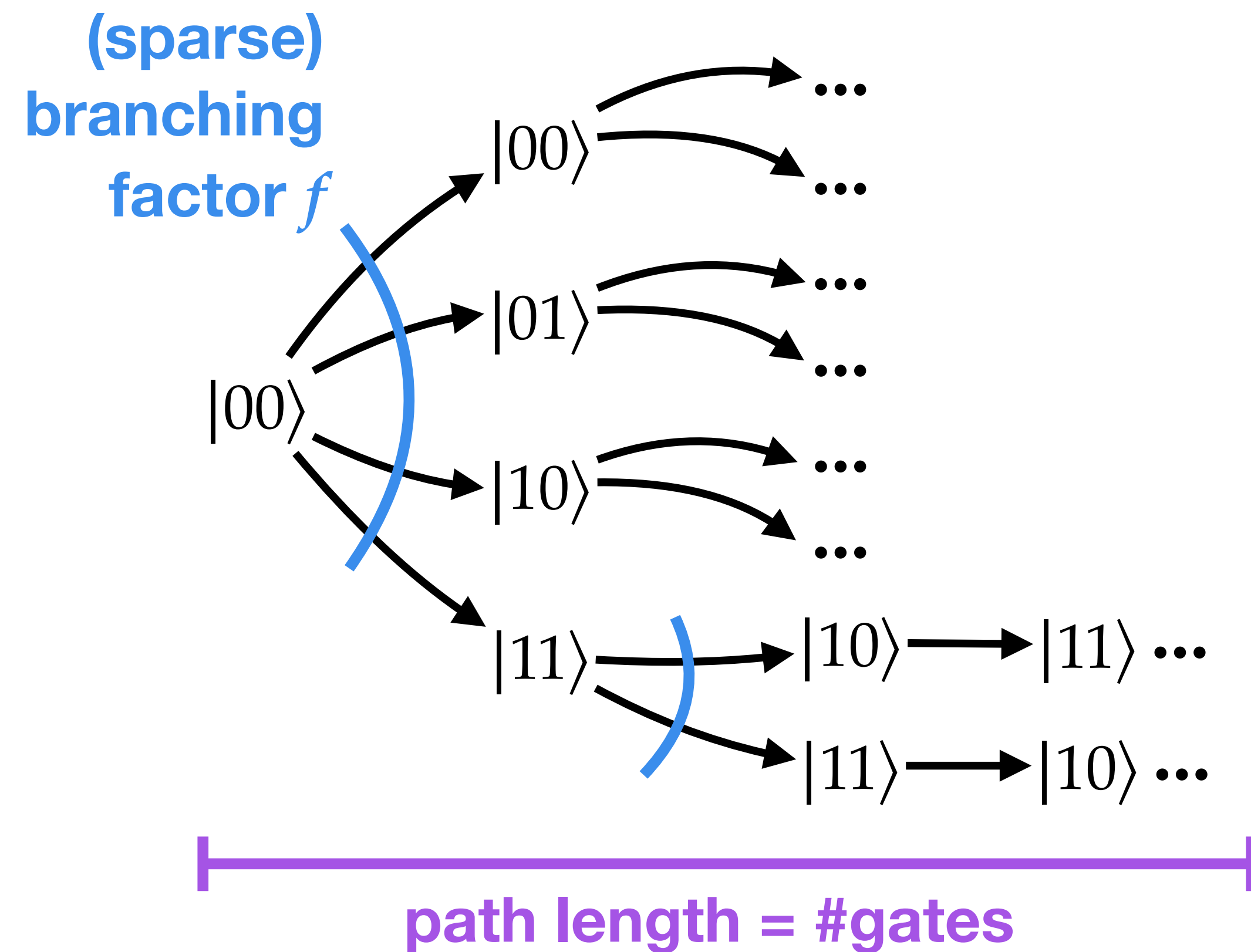
### This paper:

- hybrid Feynman-Schrödinger simulator for pure quantum circuits
- exploit **sparsity** for improved performance
  - don't write down the zeros
  - **sparse Feynman paths are efficient!**
  - “synchronize” Feynman paths only when necessary
  - reorder/schedule gates to encourage sparsity
- **easily handles hundreds of qubits on highly sparse circuits**
- comparison with Qiskit and QSim simulators
  - multiple orders of magnitude improvement in some cases



# Traversing Feynman Paths...

How (in)efficient is it?

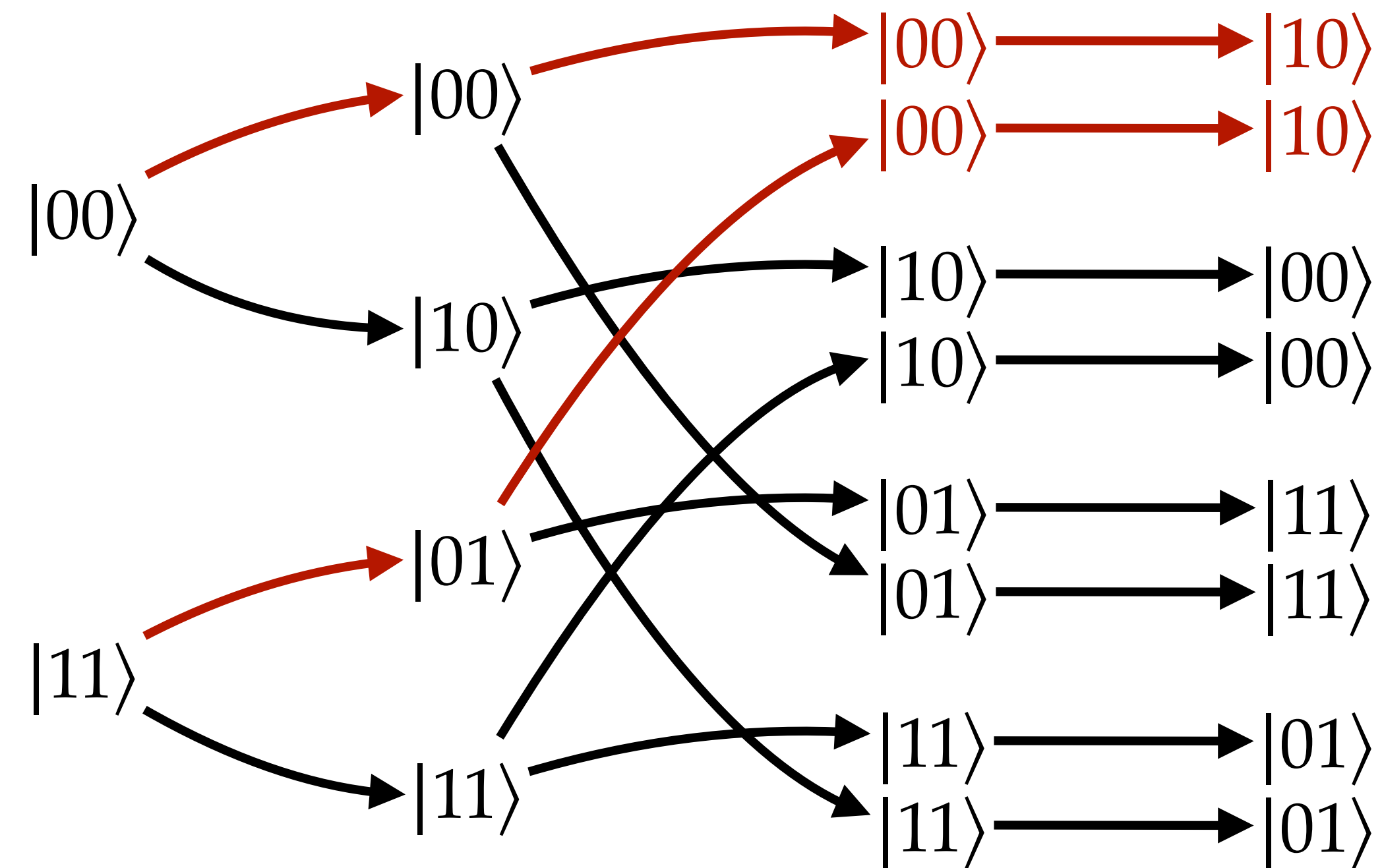
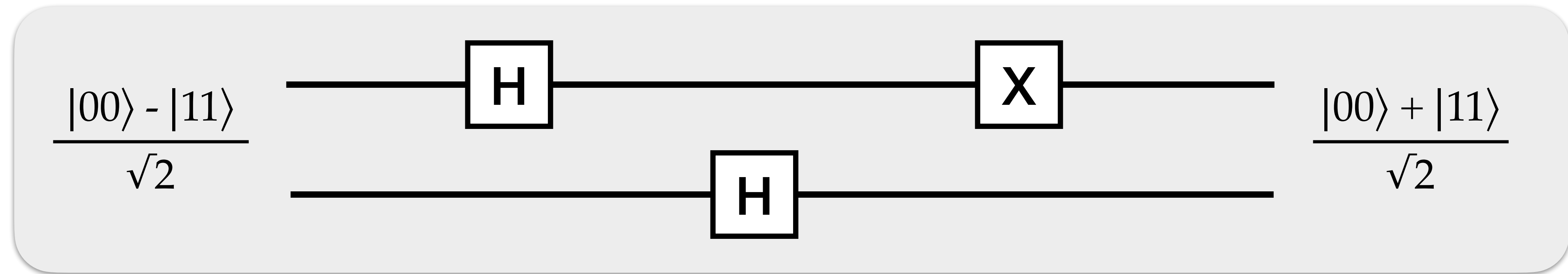


Gate	Description	Branching Factor
X	NOT	1 ( <i>non-branching</i> )
CX	controlled NOT	1 ( <i>non-branching</i> )
S	phase	1 ( <i>non-branching</i> )
Z	phase flip	1 ( <i>non-branching</i> )
T	$\pi/8$ gate	1 ( <i>non-branching</i> )
SWAP	qubit swap	1 ( <i>non-branching</i> )
CCX	Toffoli	1 ( <i>non-branching</i> )
H	Hadamard	2

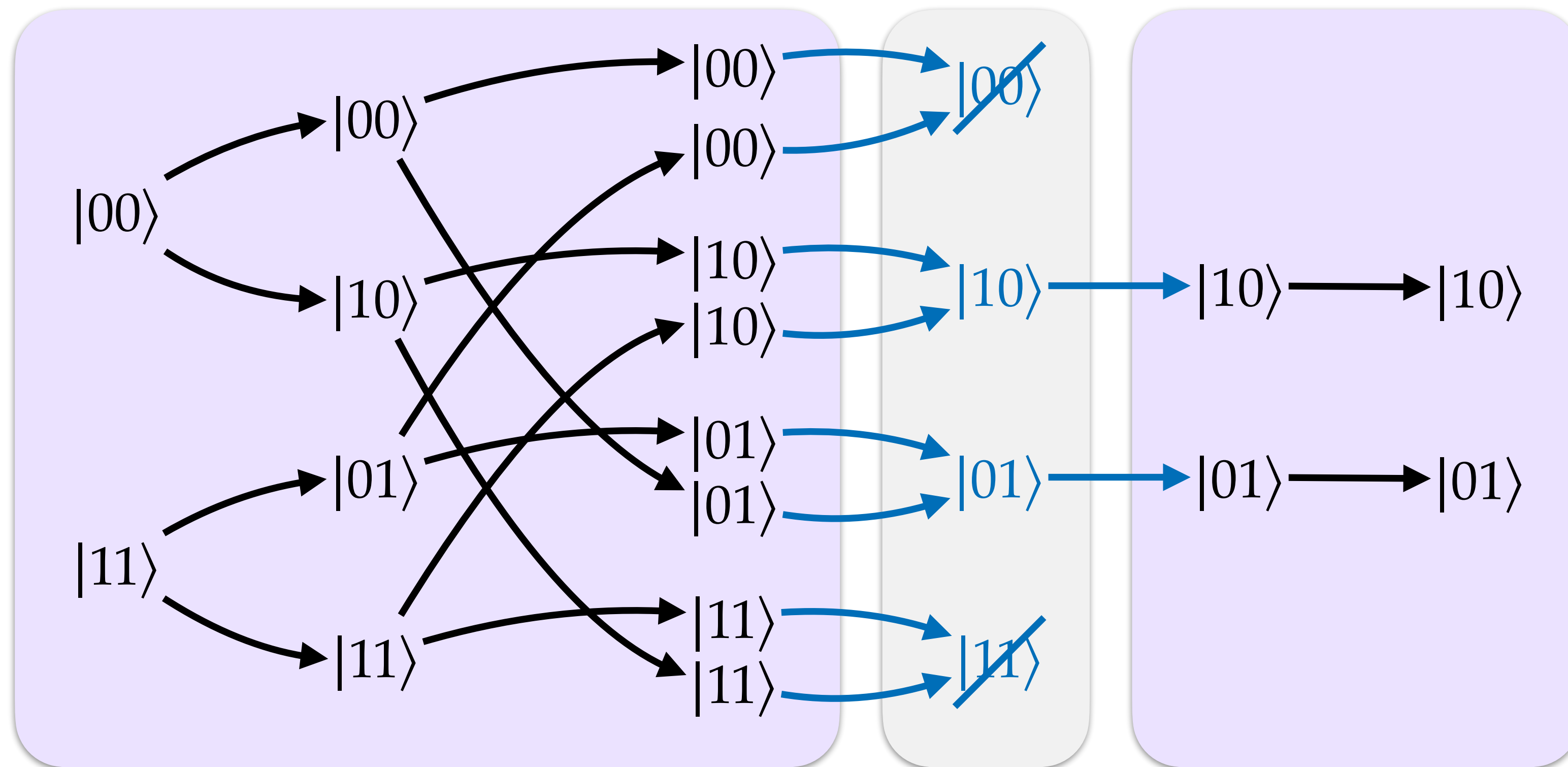
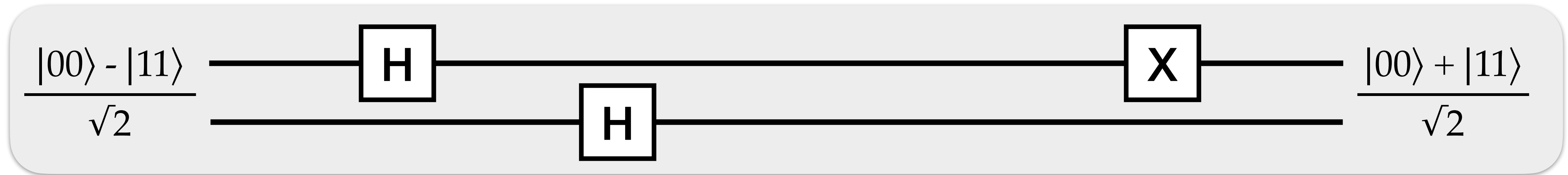
number of (sparse) Feynman paths:

$$\prod_i f(G_i)$$

# Feynman Paths “Miss” Interference



# Compute Interference by “Synchronizing” Paths



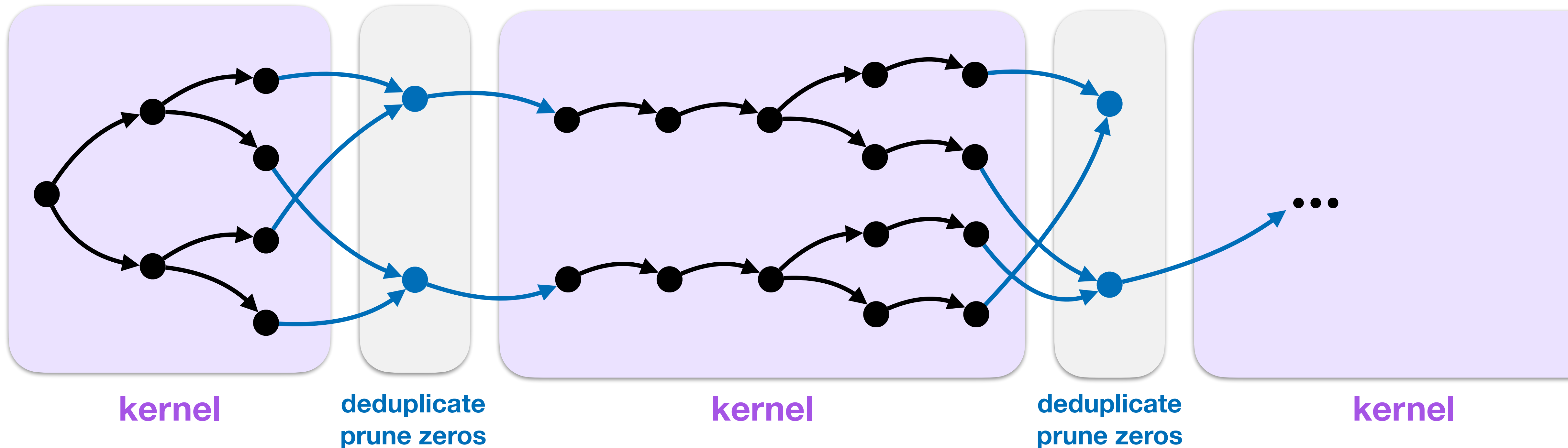
“Feynman kernel”

deduplicate  
prune zeros



# Essentially a Parallel Graph Traversal...

(the graph is generated on-the-fly)



# Selecting Kernels

## schedule gates

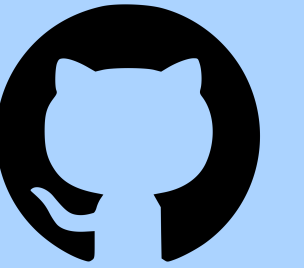
- goal: reorder (schedule) gates to encourage sparsity
- algorithm: pick a qubit, **finish** it, pick another qubit, finish it, etc.
  - “**finish a qubit**”: execute all gates on that qubit as soon as possible (execute required dependencies only, and no other gates)
- intuition: efficiently handles qubits that have deterministic result

## delimit kernels

- select maximal runs of gates without exceeding **maximum branching factor** (tunable parameter)
- intuition: bound the number of unsynchronized Feynman paths

# GraFeyn Implementation

[github.com/cmu-top/grafeyn](https://github.com/cmu-top/grafeyn)



- open-source, available on GitHub
- implemented in MPL, a high-performance parallel functional language
- supports subset of OpenQASM
- easy to extend with custom gate definitions
  - just a few lines of code per gate

## lots of interesting implementation details!

- parallel traversal of paths
- synchronize paths with concurrent (lock-free) hash tables
  - predict number of non-zeros and automatically resize as needed
- **“direction optimization”**: switch between forward / backward Feynman kernels

# Results

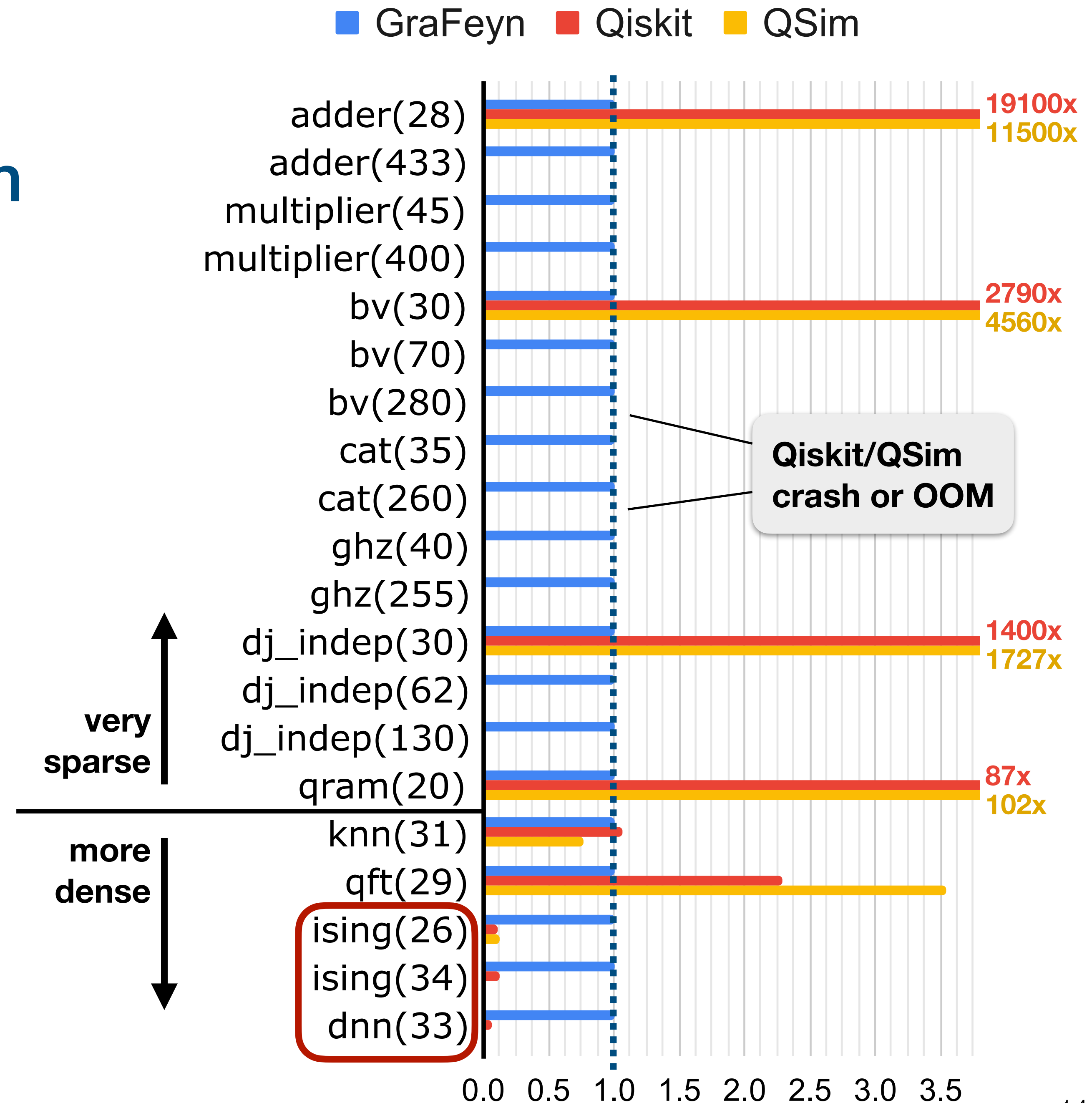
## Time normalized w.r.t. GraFeyn

(higher is better for GraFeyn)

multicore CPU execution  
64 cores (2x Intel Xeon, 2021)  
1TB RAM

**comparisons** with:  
Qiskit (Aer simulator)  
QSim

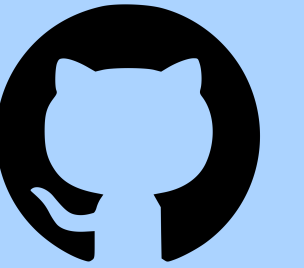
**benchmarks** from:  
QASMBench  
MQTBench



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