



# Simulating high-energy collision events with a quantum computer



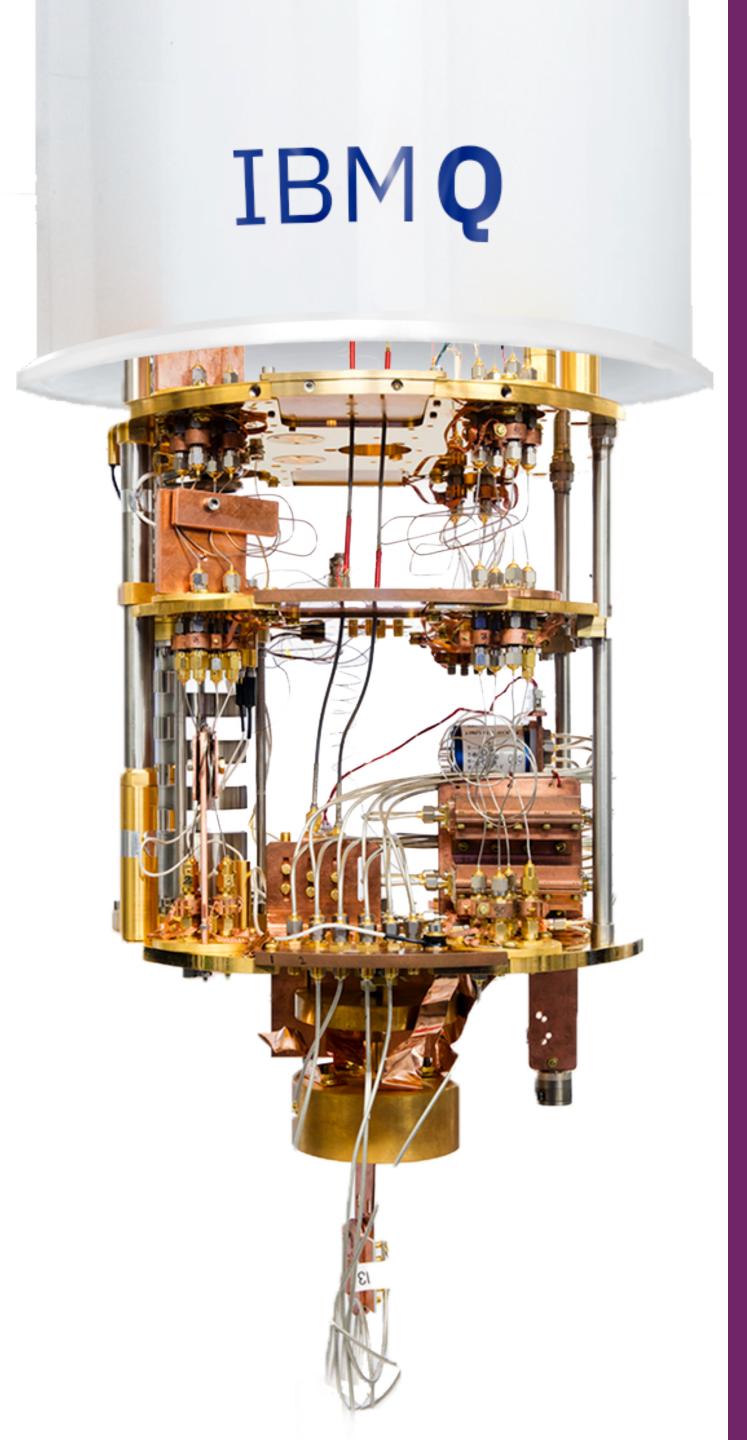




Simon Williams

Future Colliders, Corfu Summer Institute, 24th May 2024



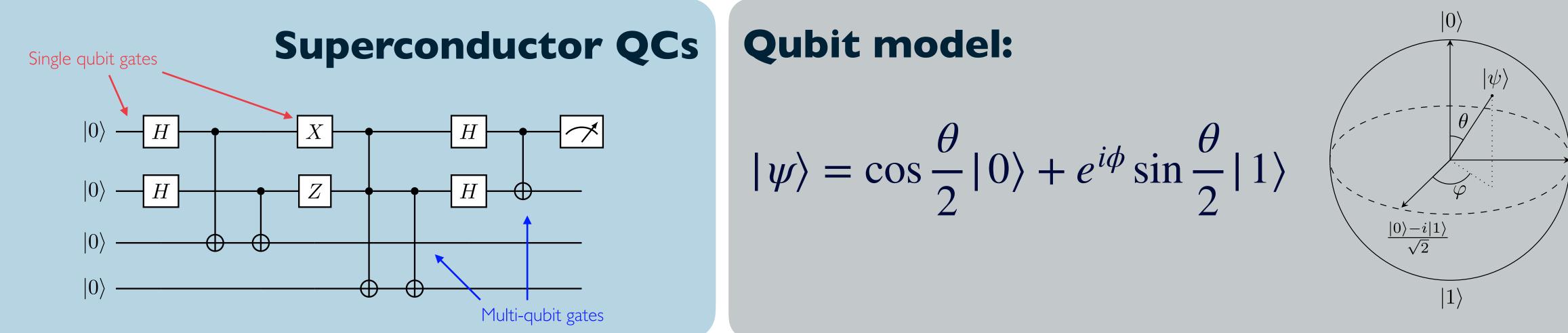




- Event Generation What's the problem?
  - The Parton Shower
- Quantum Parton Shower
  - Discretising QCD
  - The Parton Shower as a Quantum Walk
- Quantum Charged Particle Track Finding



# Discrete Gate Quantum Computing



### **Advantages:**

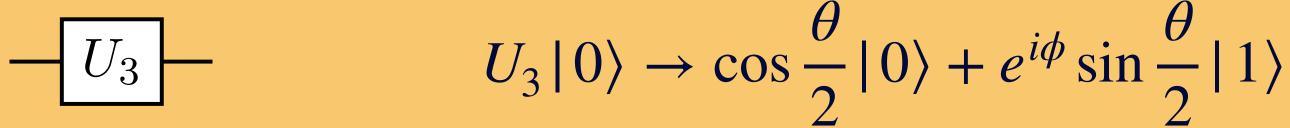
- Highly controllable qubits
- Universal computation

### **Disadvantages:**

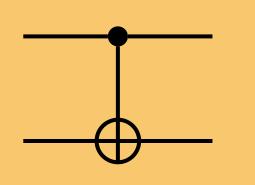
- Small number of qubits, not very fault tolerant

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### Single qubit gates:



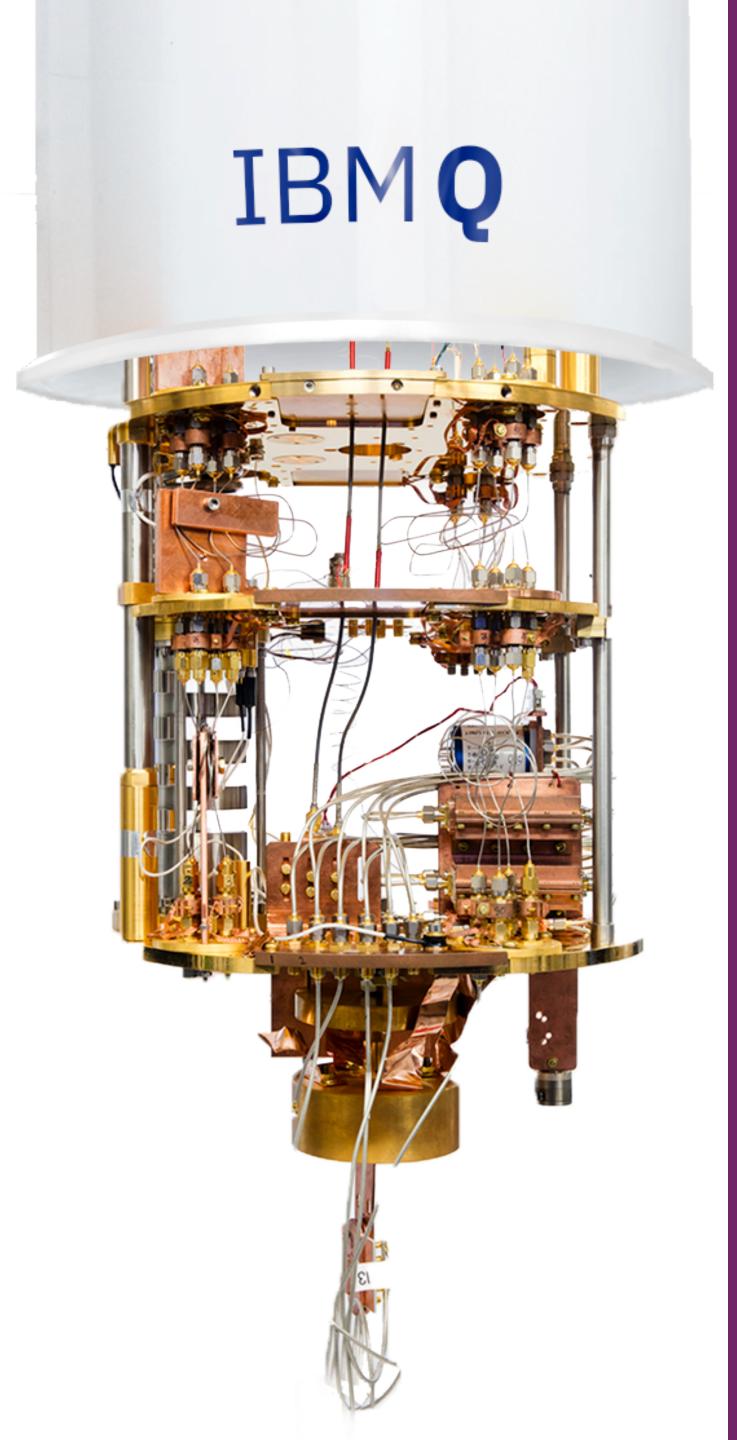
### **Multi-qubit gates:**



 $CNOT | 00 \rangle \rightarrow | 00 \rangle, CNOT | 10 \rangle \rightarrow | 11 \rangle,$  $CNOT |01\rangle \rightarrow |01\rangle, CNOT |11\rangle \rightarrow |10\rangle$ 









# problem?



### **Event Generation - What's the**

Typical hadron-hadron collisions are highly complex resulting in O(1000) particles

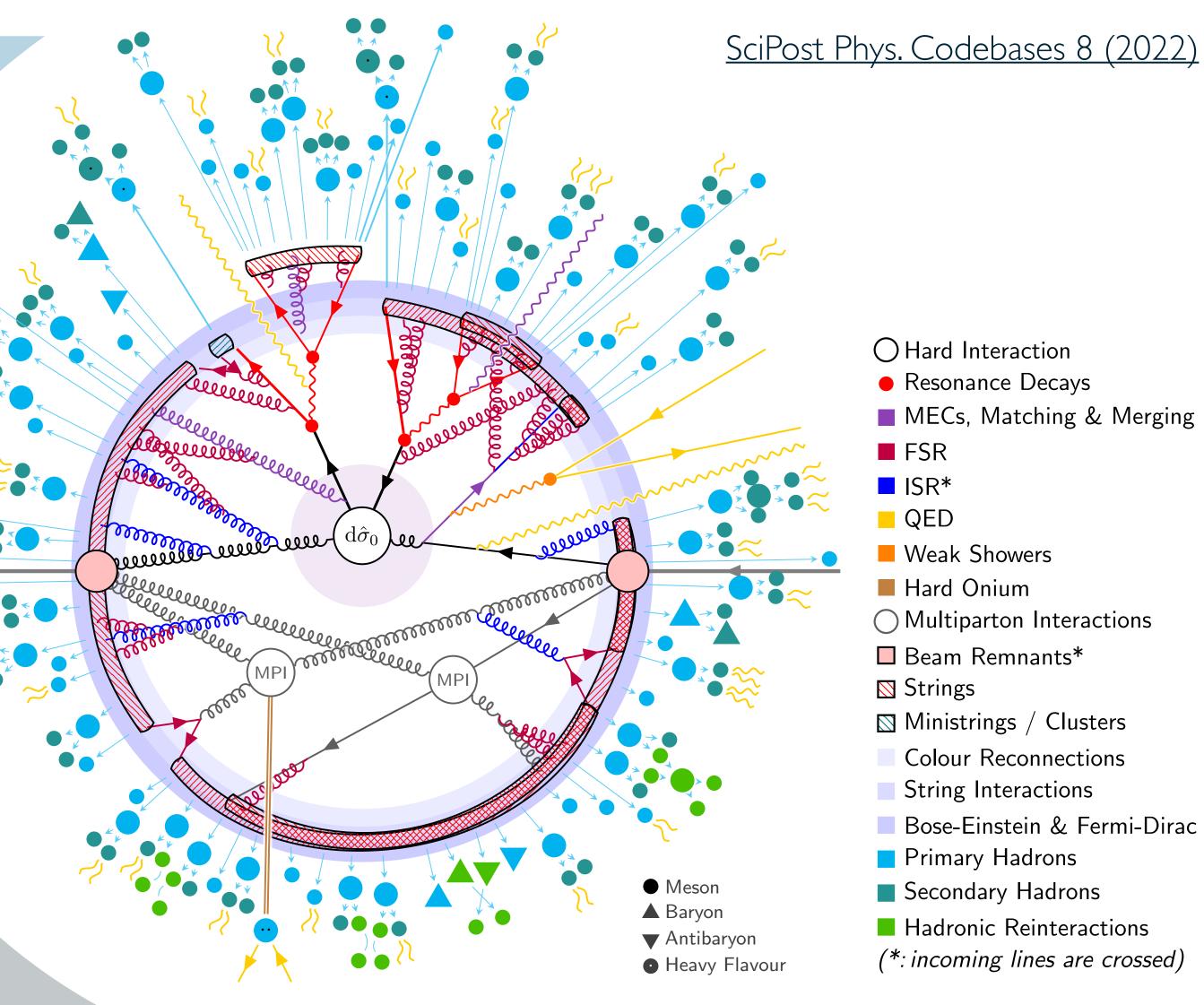
The theoretical description of collision events is **highly complex** 

### **Monte Carlo Event**

Generators have been the most successful approach to simulating particle collisions

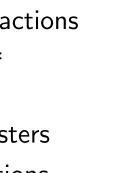
MC Event Generators exploit factorisation theorems in QCD -

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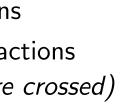


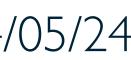








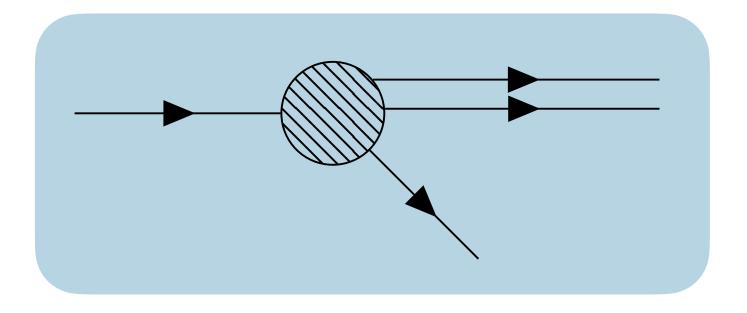


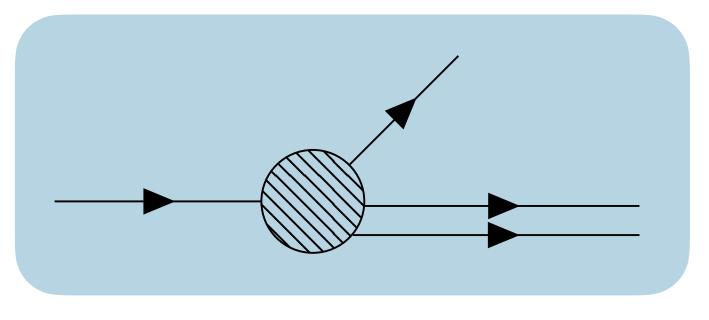


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Parton Density Functions



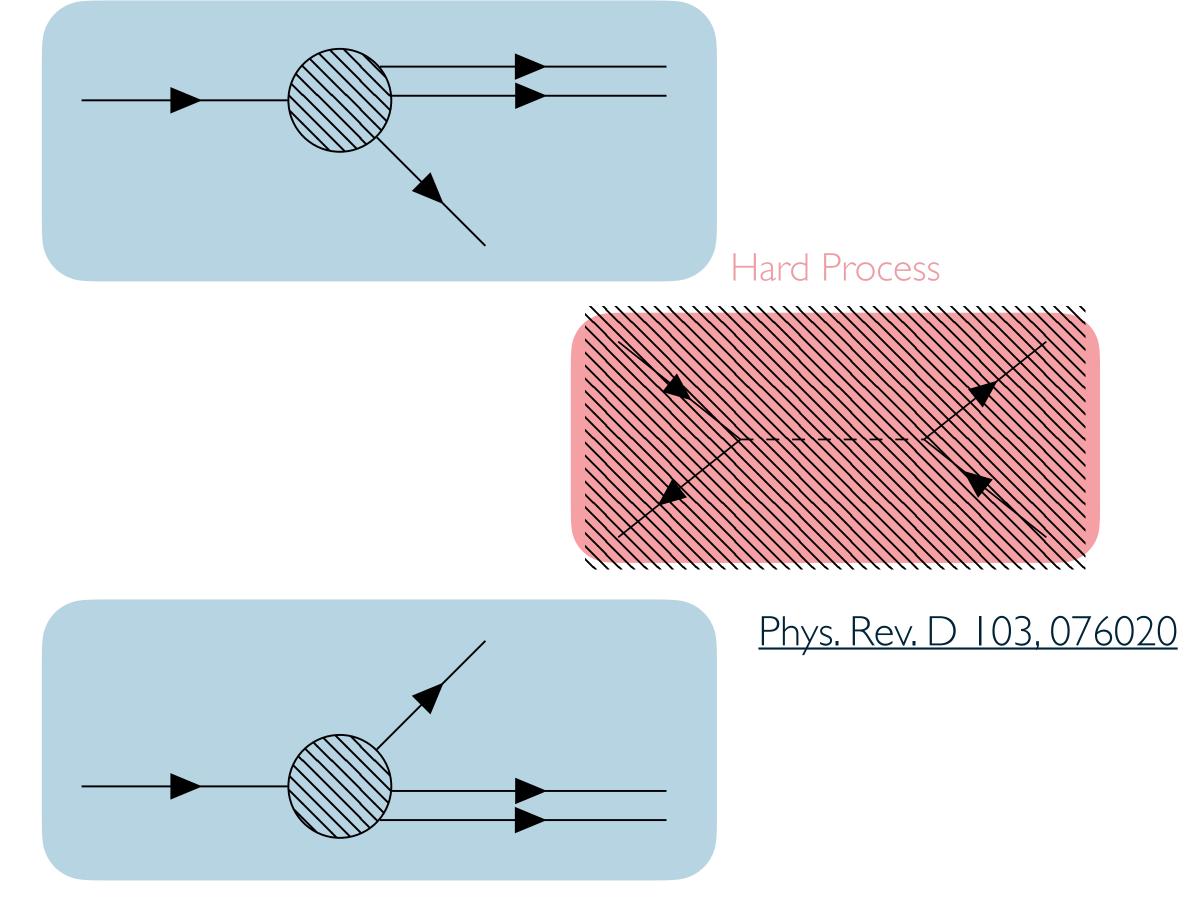


#### <u>Phys. Rev. D 103, 034027</u>

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Parton Density Functions

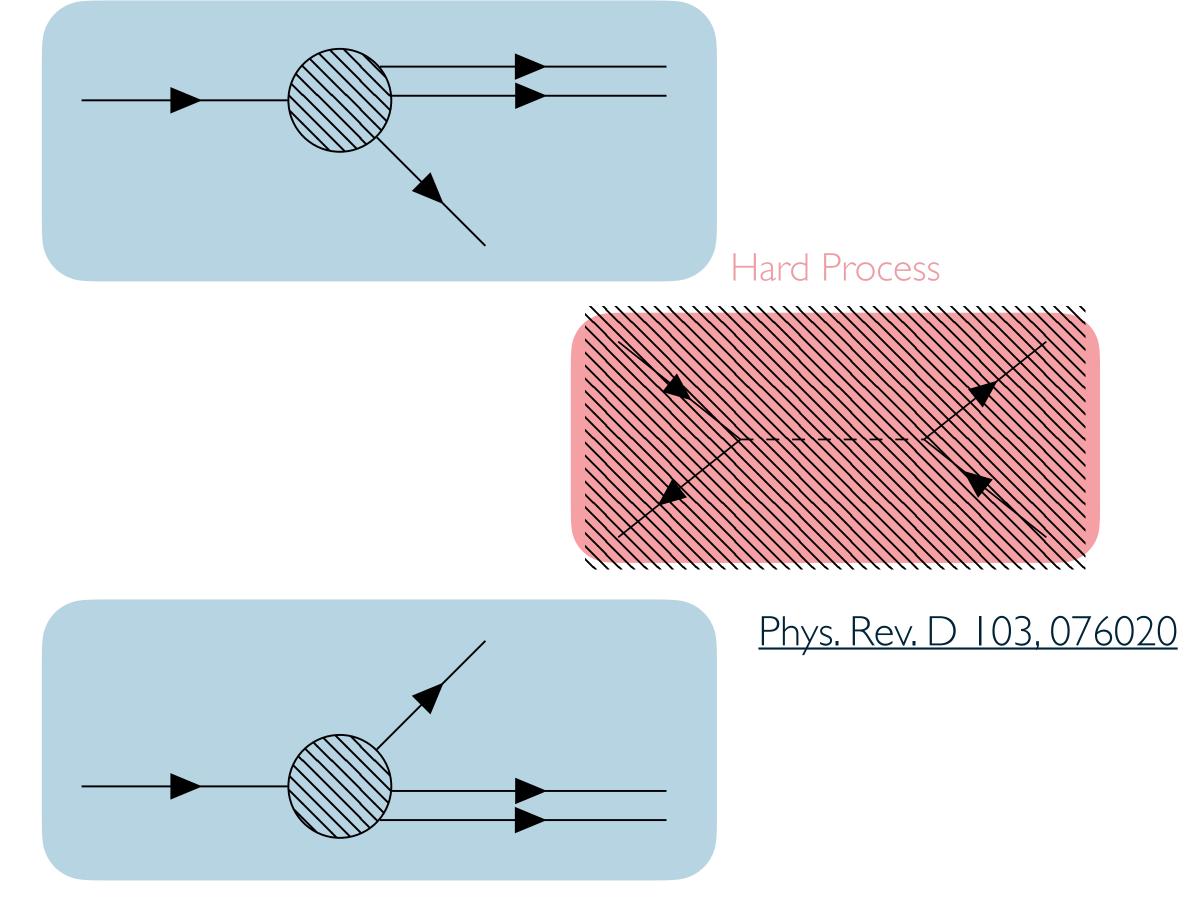


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Parton Density Functions



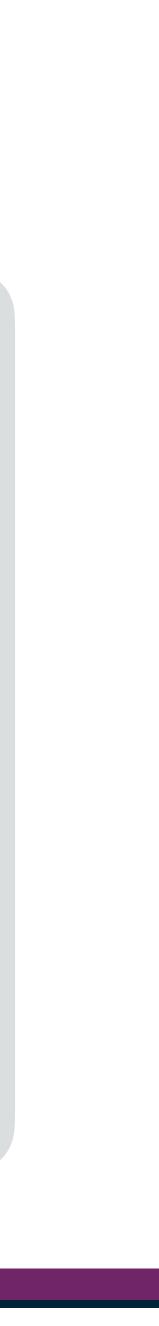
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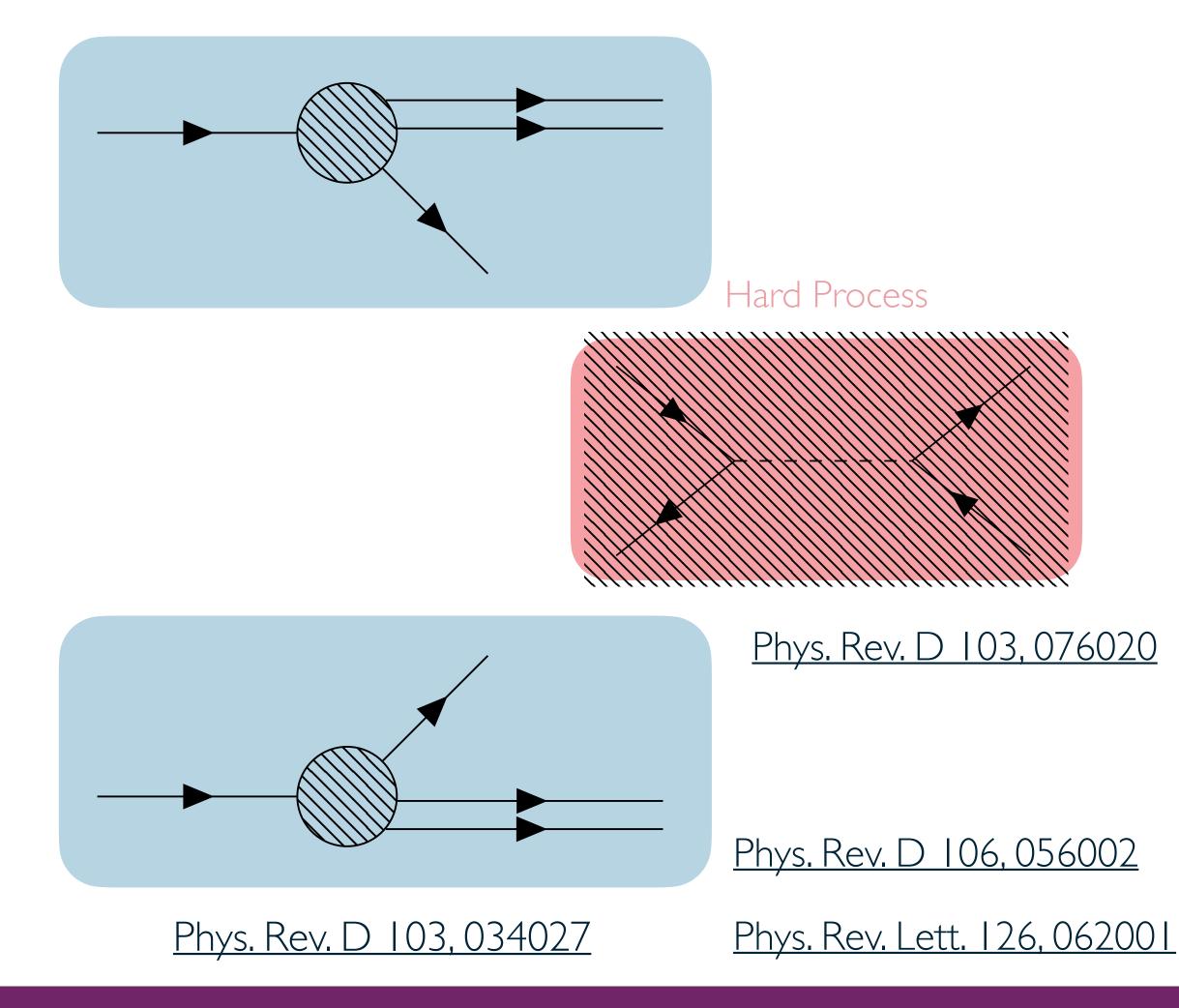
Hadronisation



#### Corfu Summer Institute - 24/05/24



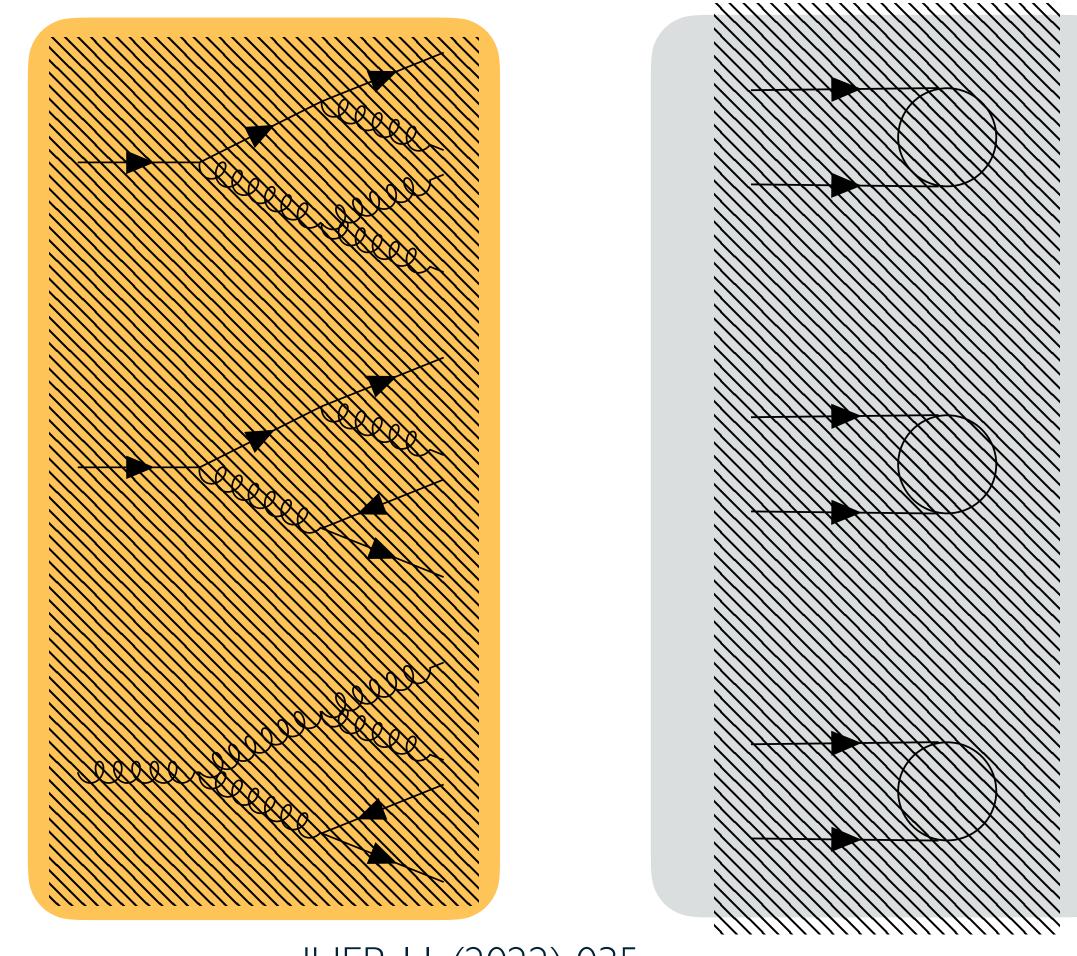




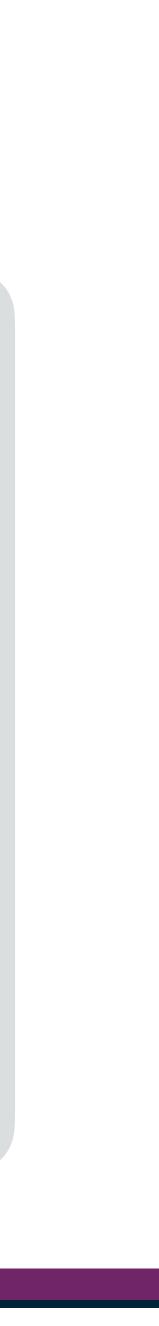
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Parton Shower

Hadronisation







# Hard Process

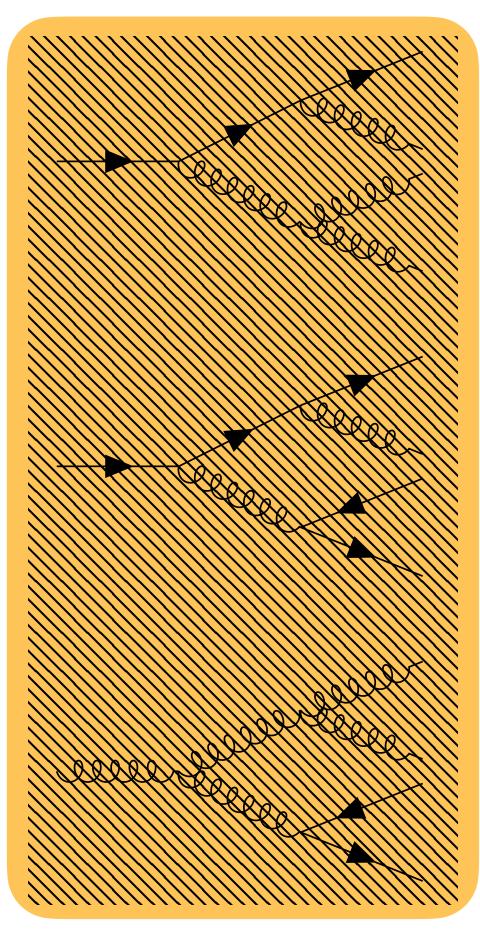
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Phys. Rev. D 106, 056002

Phys. Rev. Lett. 126, 062001

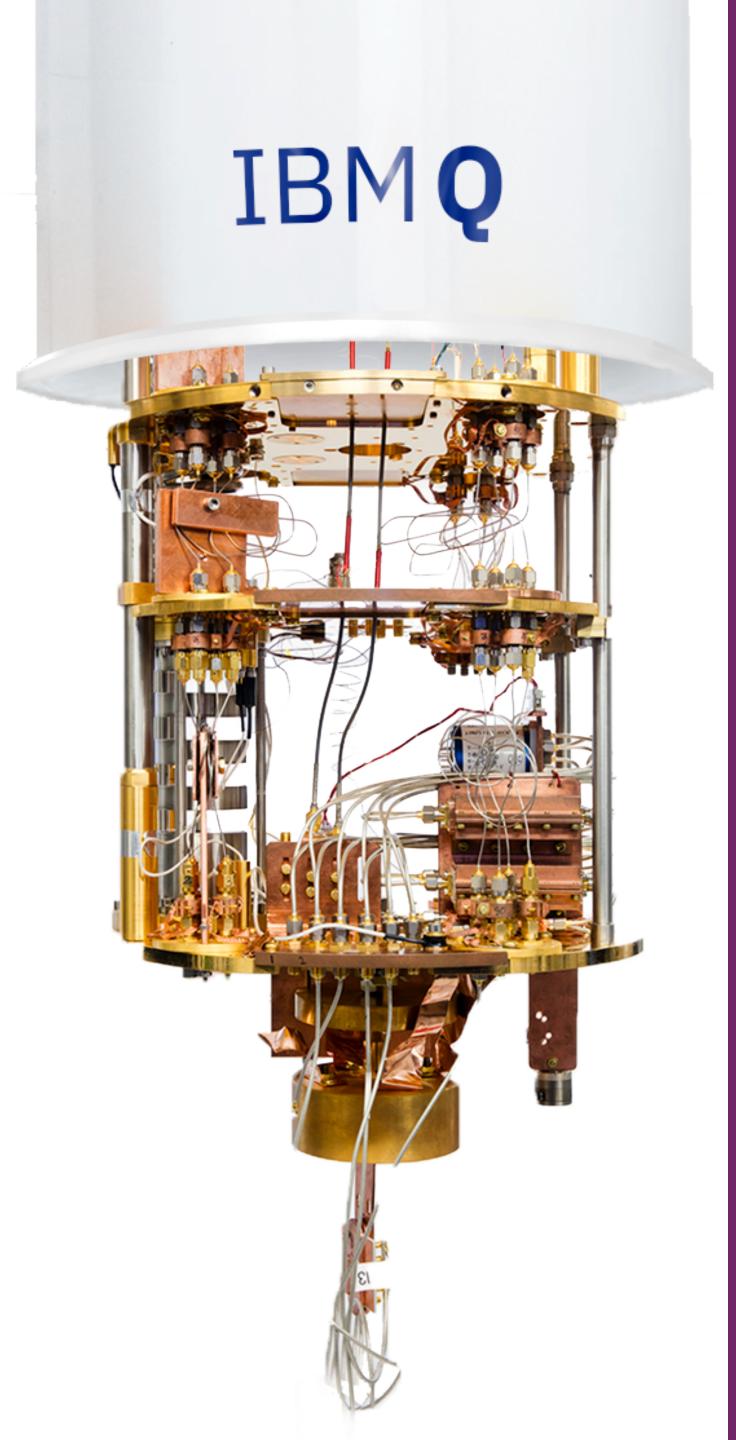
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Parton Shower











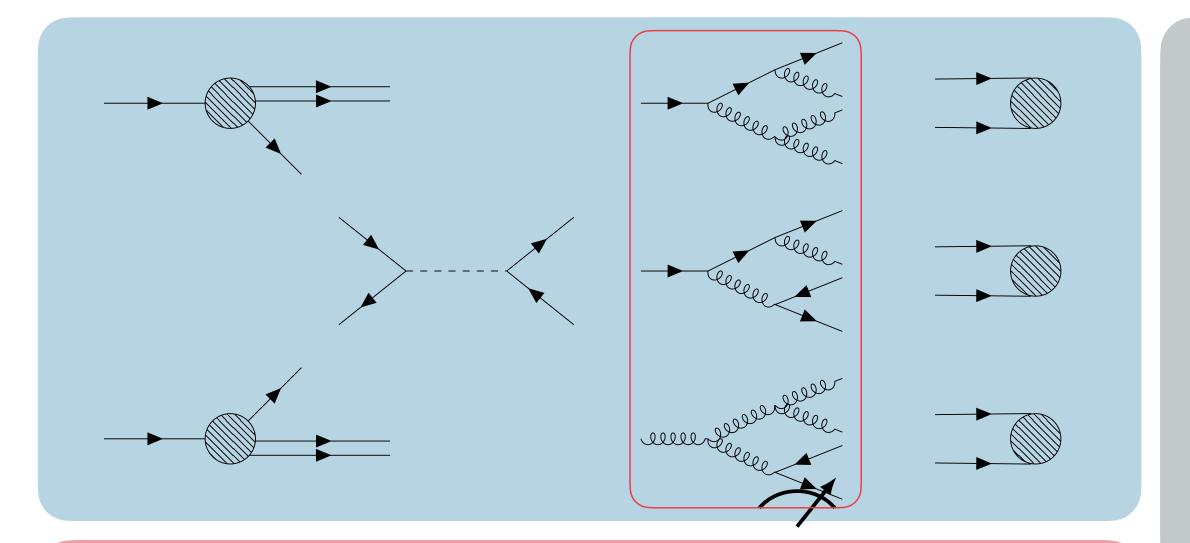
# problem?



### **Event Generation - What's the**

- The Parton Shower

### The Parton Shower



### **Collinear mode:**

$$k \stackrel{p}{-} \underbrace{ \sum_{j} i}_{j} \qquad p_{i} = zP, \quad p_{j} = (1 - z)P$$

Successive decay steps factorise into independent quasi-classical steps

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# Soft mode: $p_i \approx 0$

Interference effects only allow for partial factorisation

Leading contributions to the decay rate in the collinear limit are included in the soft limit

In this limit, the decay from high energy to low energy proceeds as a colour-dipole cascade.

This interpretation allows for straightforward interference patterns and momentum conservation





## The Parton Shower - The Veto Algorithm

The choice of the variables  $\xi$  and t is known as the phase space parameterisation

 $\mathcal{F}_n(\Phi_n, t_n, t_c; O) = \Delta(t_n, t_c) O(\Phi_n)$ 

### **Inclusive Decay Probability**

 $d\mathcal{P}\left(q(p_{\mathrm{I}})\bar{q}(p_{\mathrm{K}})\to q(p_{i})g(p_{j})\bar{q}(p_{k})\right)\simeq \frac{ds_{ij}}{s_{\mathrm{IK}}}\frac{ds_{jk}}{s_{\mathrm{IK}}}C\frac{\alpha_{s}}{2\pi}\frac{2s_{\mathrm{IK}}}{s_{ij}s_{jk}}$ 

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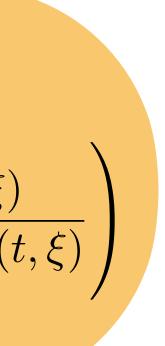
### **Non-Emission Probability**

$$\Delta(t_n, t) = \exp\left(-\int_t^{t_n} dt d\xi \frac{d\phi}{2\pi} C \frac{\alpha_s}{2\pi} \frac{2s_{ik}(t, \xi)}{s_{ij}(t, \xi)s_{jk}}\right)$$

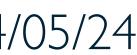
### **Master Equation**

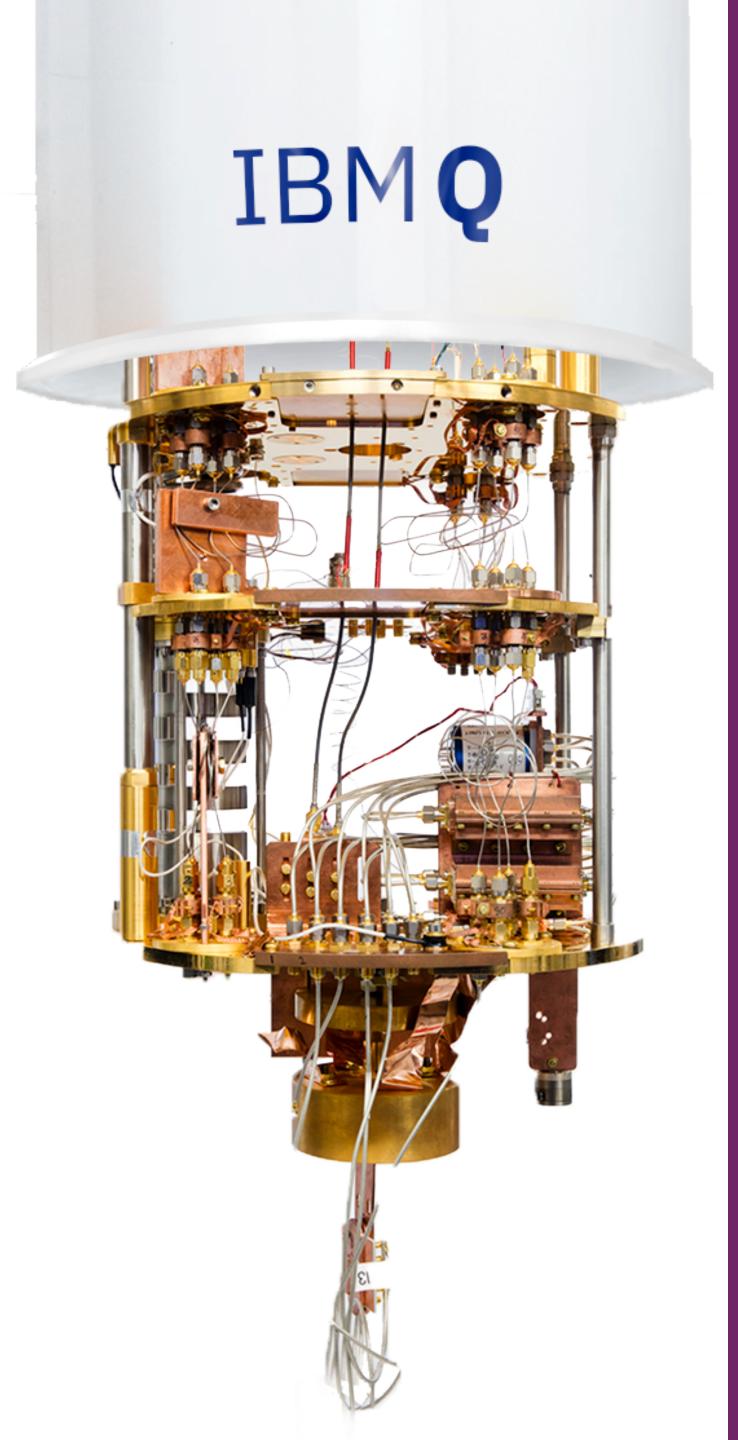
 $+ \int^{c_n} dt d\xi \frac{d\phi}{2\pi} C \frac{\alpha_s}{2\pi} \frac{2s_{ik}(t,\xi)}{s_{ij}(t,\xi)s_{jk}(t,\xi)} \Delta(t_n,t) \mathcal{F}_n(\Phi_{n+1},t,t_c;O)$ 

Current interpretations of the veto algorithm treat the phase space variables  $\xi$  and t as **continuous** 











G. Gustafson, S. Prestel, M. Spannowsky and S. Williams, Collider Events on a Quantum Computer, *JHEP* 11 (2022) 035, <u>arXiv:2207.10694</u>



### **Quantum Parton Shower**

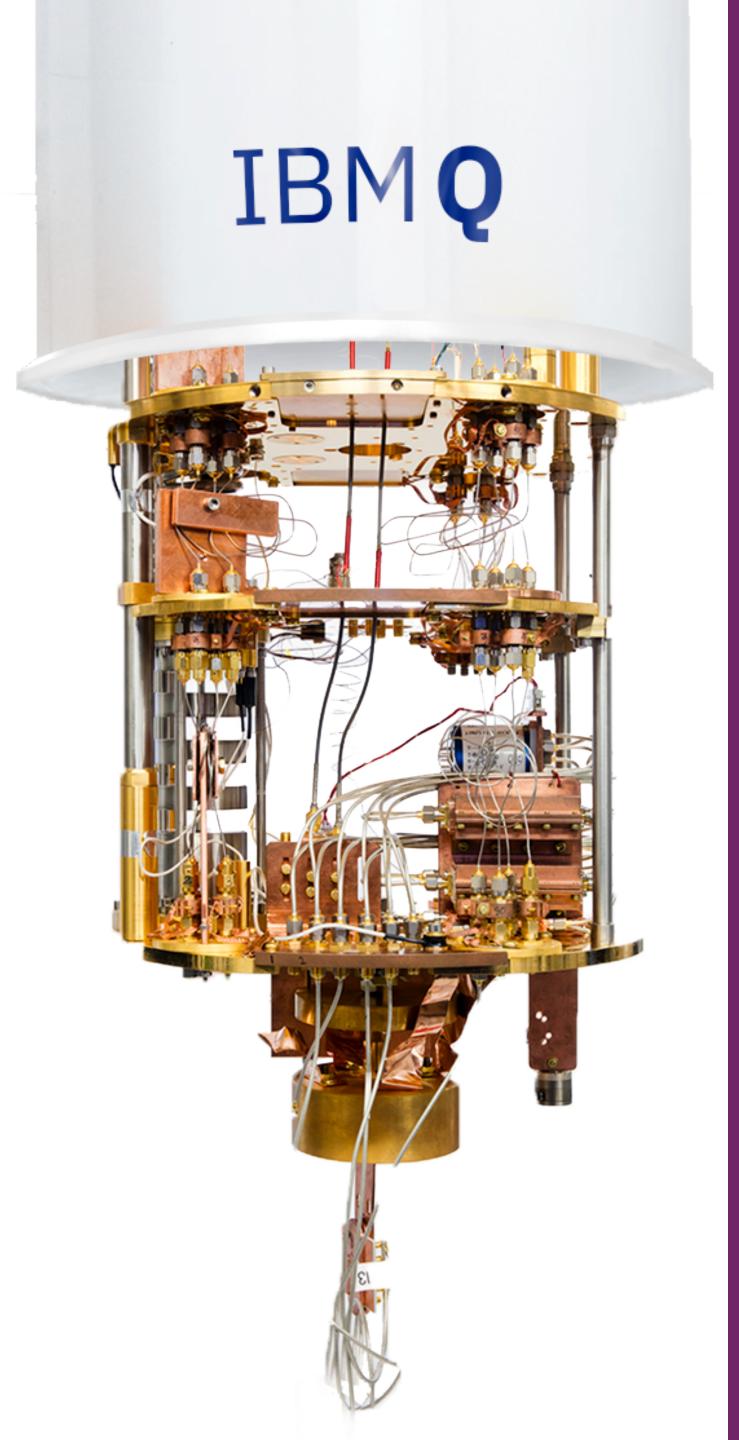


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# **Quantum Parton Shower** - Discretising QCD

G. Gustafson, S. Prestel, M. Spannowsky and S. Williams, Collider Events on a Quantum Computer, *JHEP* 11 (2022) 035, <u>arXiv:2207.10694</u>





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• Parameterise phase space in terms of gluon transverse momentum and rapidity:

$$k_{\perp}^2 = \frac{s_{ij}s_{jk}}{s_{\rm IK}}$$
 and  $y = \frac{1}{2}\ln x_{\rm IK}$ 

which leads to the inclusive probability:

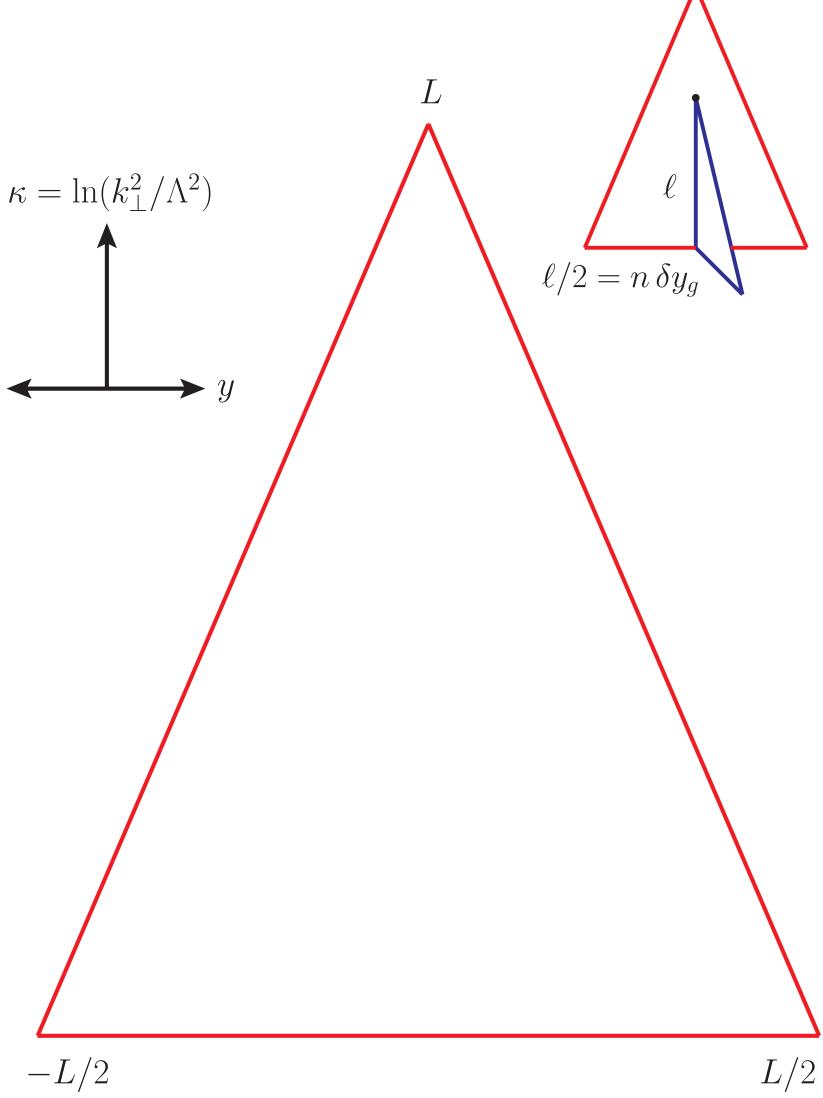
$$d\mathcal{P}\left(q(p_{\mathrm{I}})\bar{q}(p_{\mathrm{K}}) \to q(p_{i})g(p_{j})\bar{q}(p_{k})\right) \simeq = \frac{Cd}{\pi}$$

where  $\kappa = \ln \left(\frac{k_{\perp}^2}{\Lambda^2}\right)$  and  $\Lambda$  is an arbitrary mass scale

Due to the colour charge of emitted gluons, the rapidity span for subsequent dipole decays is increased. This is interpreted as "folding out"

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 $\frac{\kappa_s}{-}d\kappa dy$ 





**2.** Neglect  $g \rightarrow q\overline{q}$  splittings and examine transversemomentum-dependent running coupling

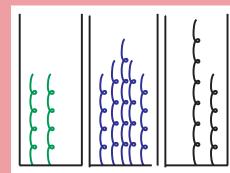
$$\alpha_s(k_{\perp}^2) = \frac{12\pi}{33 - 2n_f} \frac{1}{\ln(k_{\perp}^2 / \Lambda_{\rm QCD}^2)}$$

leads to the inclusive probability

$$d\mathcal{P}\left(q(p_{\mathrm{I}})\bar{q}(p_{\mathrm{K}}) \to q(p_{i})g(p_{j})\bar{q}(p_{k})\right) \simeq = \frac{d\kappa}{\kappa}\frac{dy}{\delta y_{g}} \quad \text{with}$$

Interpreting the running coupling renormalisation group as a gainloss equation:

**Gluons within**  $\delta y_g$  **act coherently** as one effective gluon

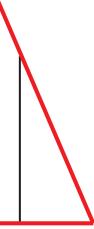


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# $\delta y_q$

 $\kappa = \ln(k_\perp^2 / \Lambda^2)$ 

 $\delta y_g = \frac{11}{6}$ 





**2.** Neglect  $g \rightarrow q\overline{q}$  splittings and examine transversemomentum-dependent running coupling

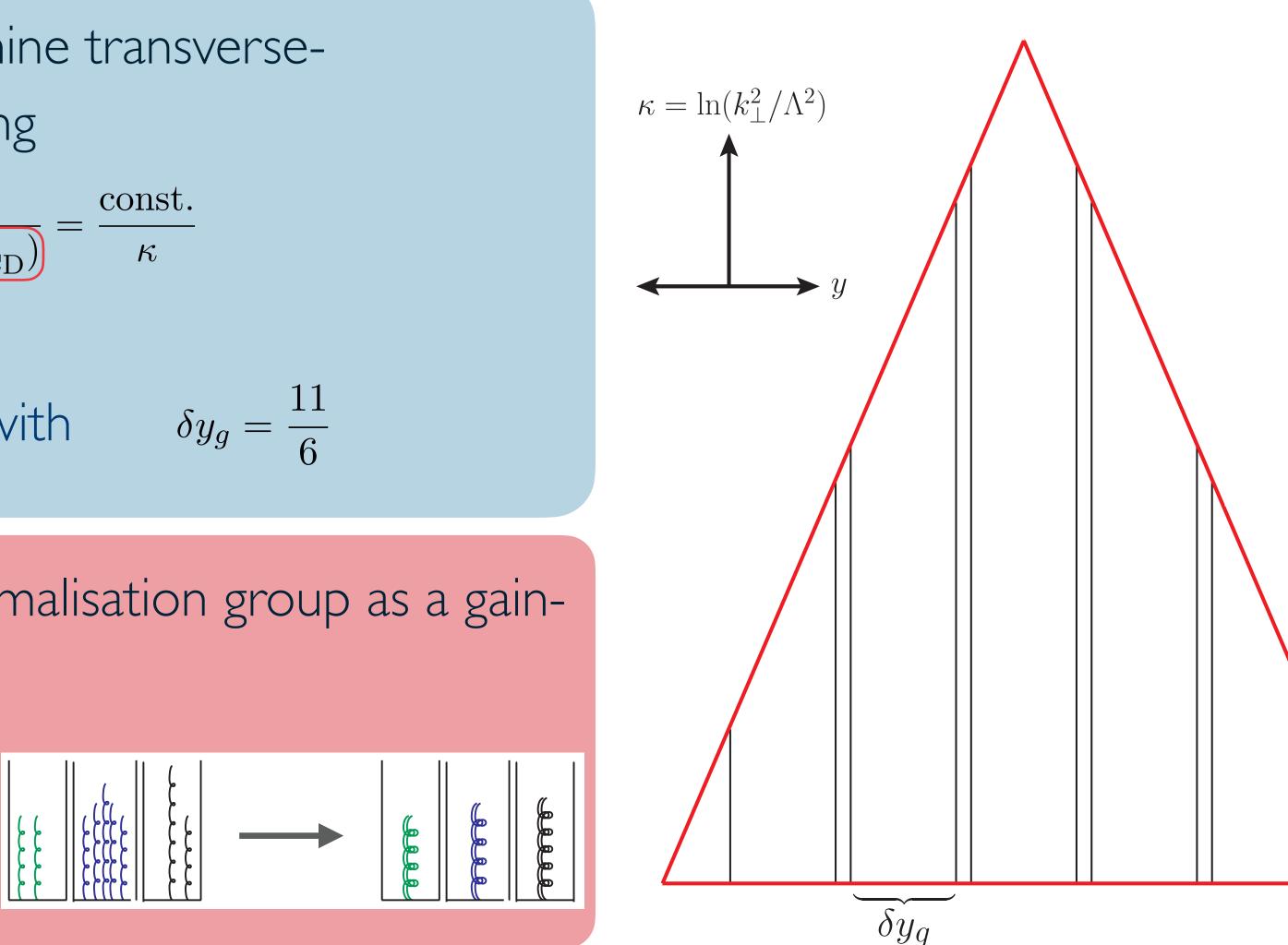
$$\alpha_s(k_\perp^2) = \frac{12\pi}{33 - 2n_f} \frac{1}{\ln(k_\perp^2/\Lambda_{\rm QCD}^2)} = \frac{\rm const}{\kappa}$$

leads to the inclusive probability

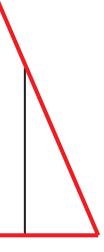
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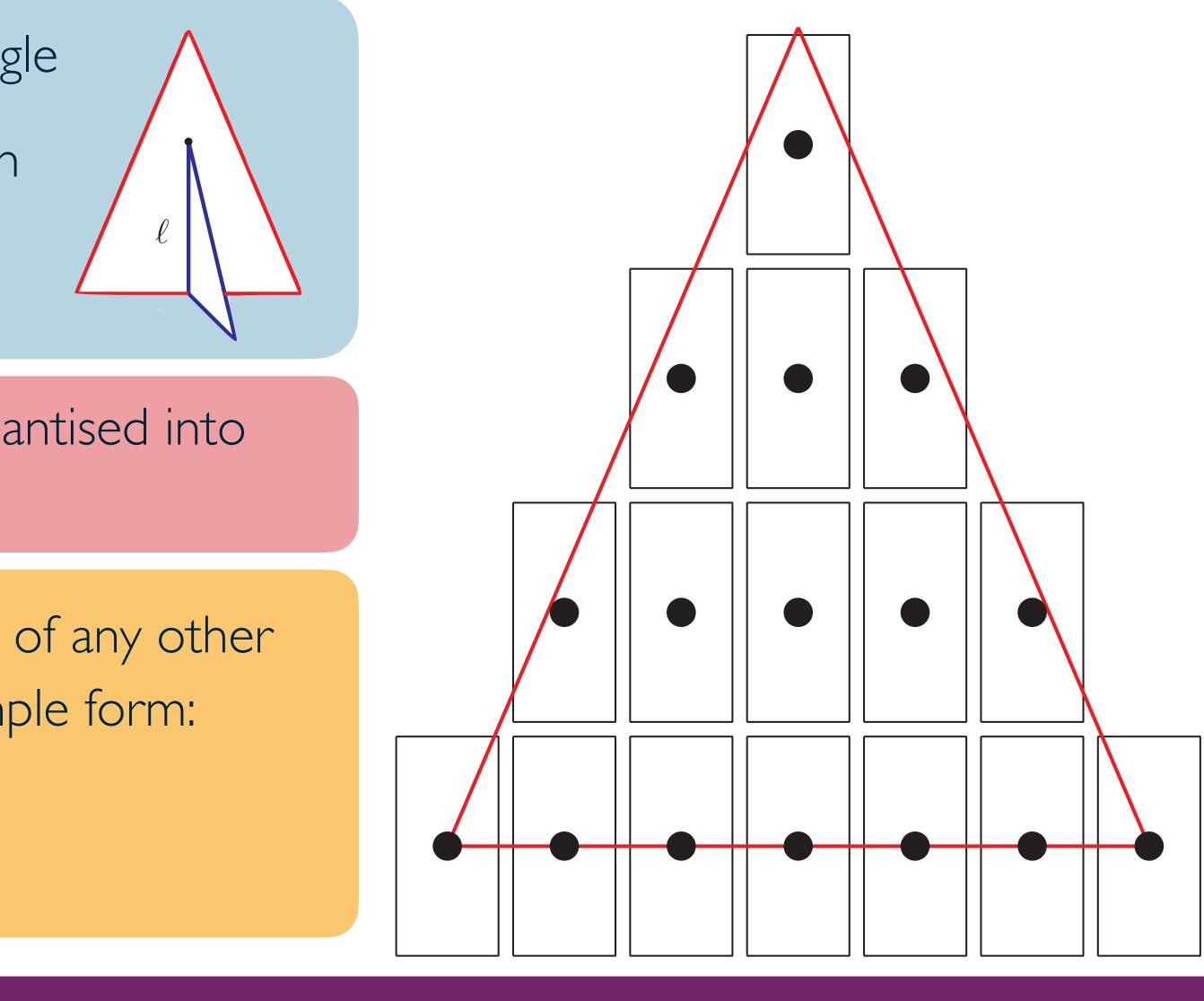
**Folding out** extends the baseline of the triangle to positive y by  $\frac{l}{2}$ , where l is the height at which to emit effective gluons

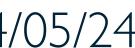
A consequence of folding is that the  $\kappa$  axis is quantised into multiples of  $2\delta y_{o}$ 

Each rapidity slice can be treated independently of any other slice. The exclusive rate probability takes the simple form:

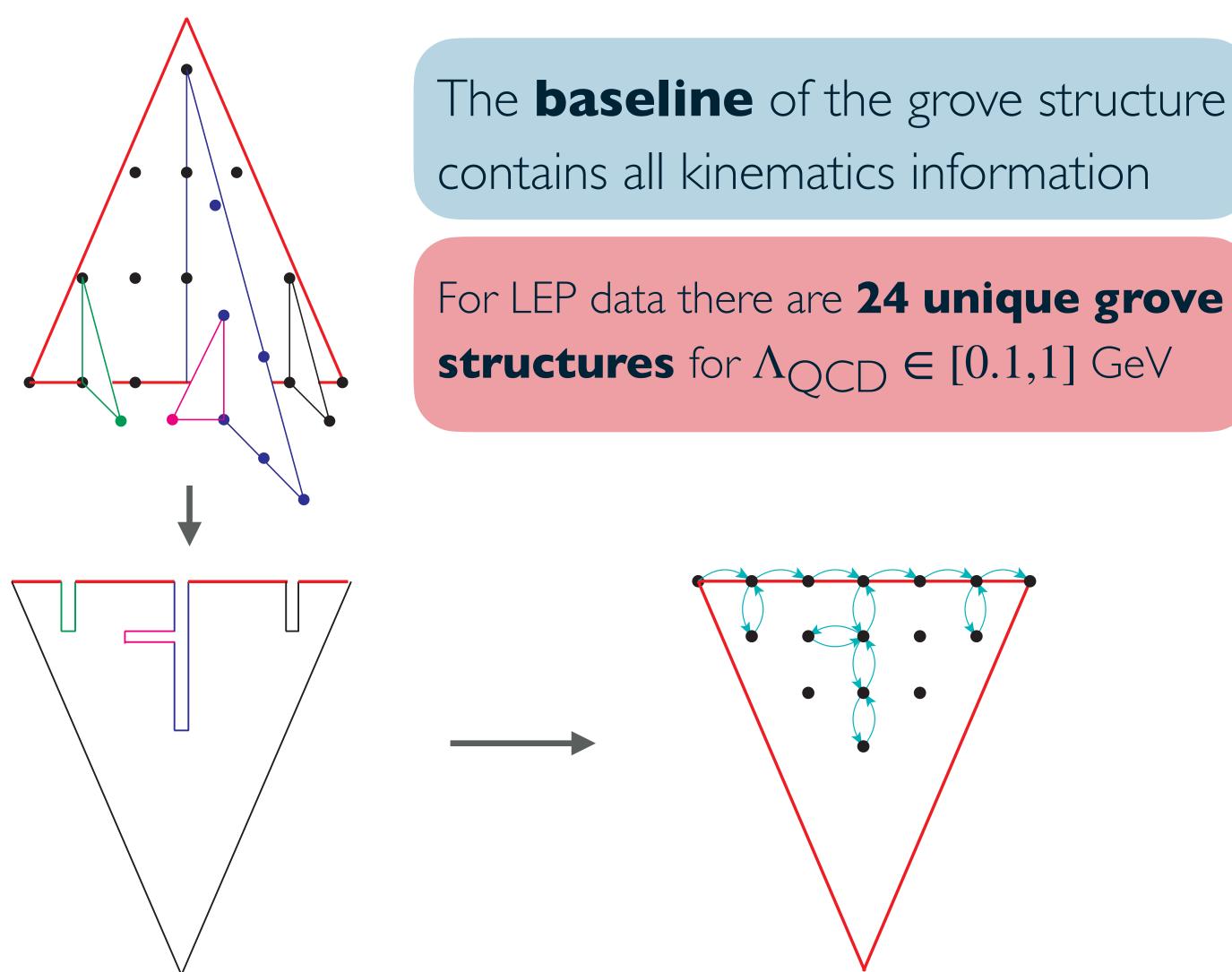
$$\frac{d\kappa}{\kappa} \exp\left(-\int_{\kappa}^{\kappa_{max}} \frac{d\bar{\kappa}}{\bar{\kappa}}\right) = \frac{d\kappa}{\kappa_{max}}$$

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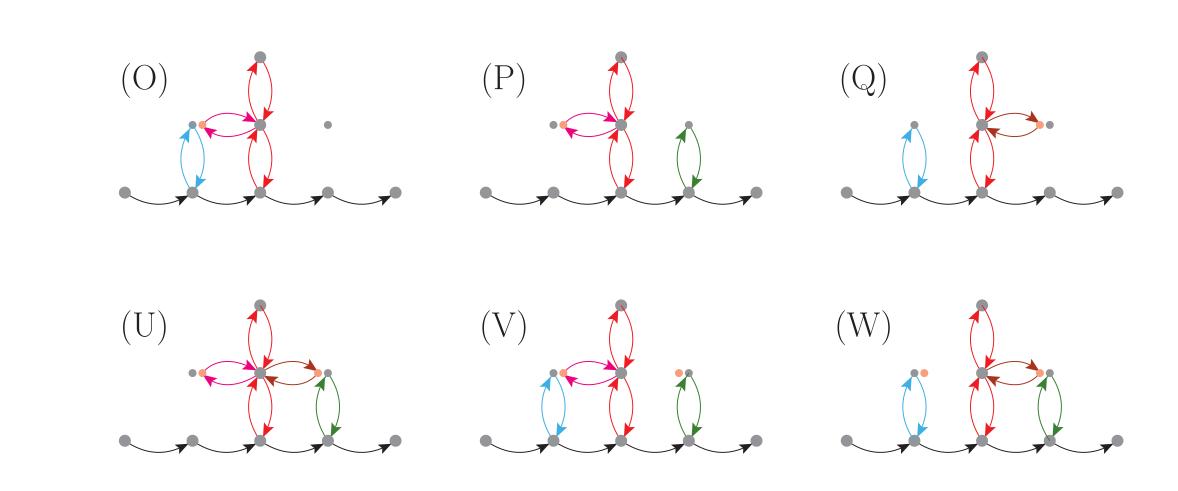


### Discrete QCD as a Quantum Walk



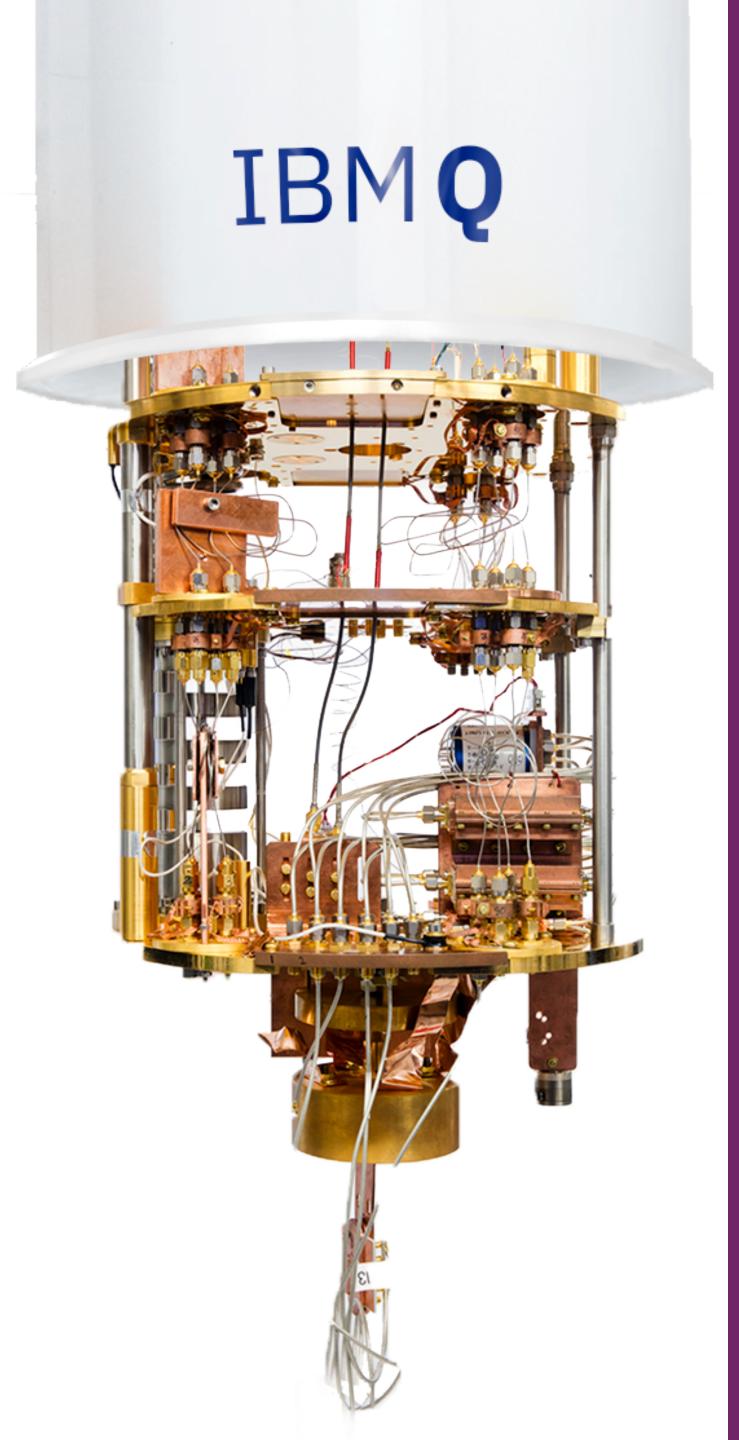
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The groves can be **constructed** and enumerated to achieve an efficient sampling algorithm for the dipole shower











# **Quantum Parton Shower** - Discretising QCD - Parton Shower as a Quantum Walk

G. Gustafson, S. Prestel, M. Spannowsky and S. Williams, Collider Events on a Quantum Computer, *JHEP* 11 (2022) 035, <u>arXiv:2207.10694</u>





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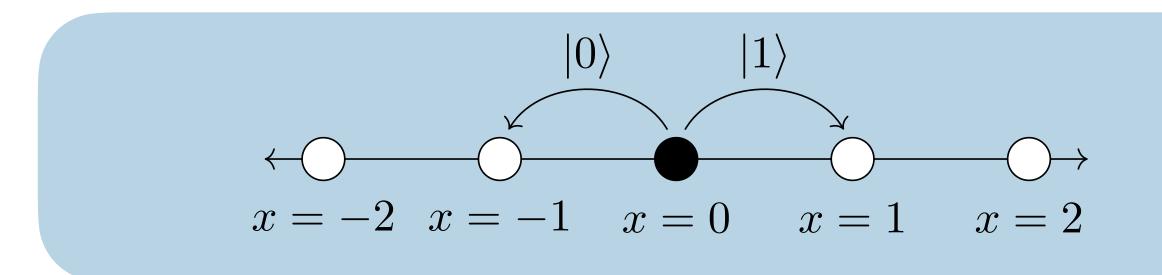




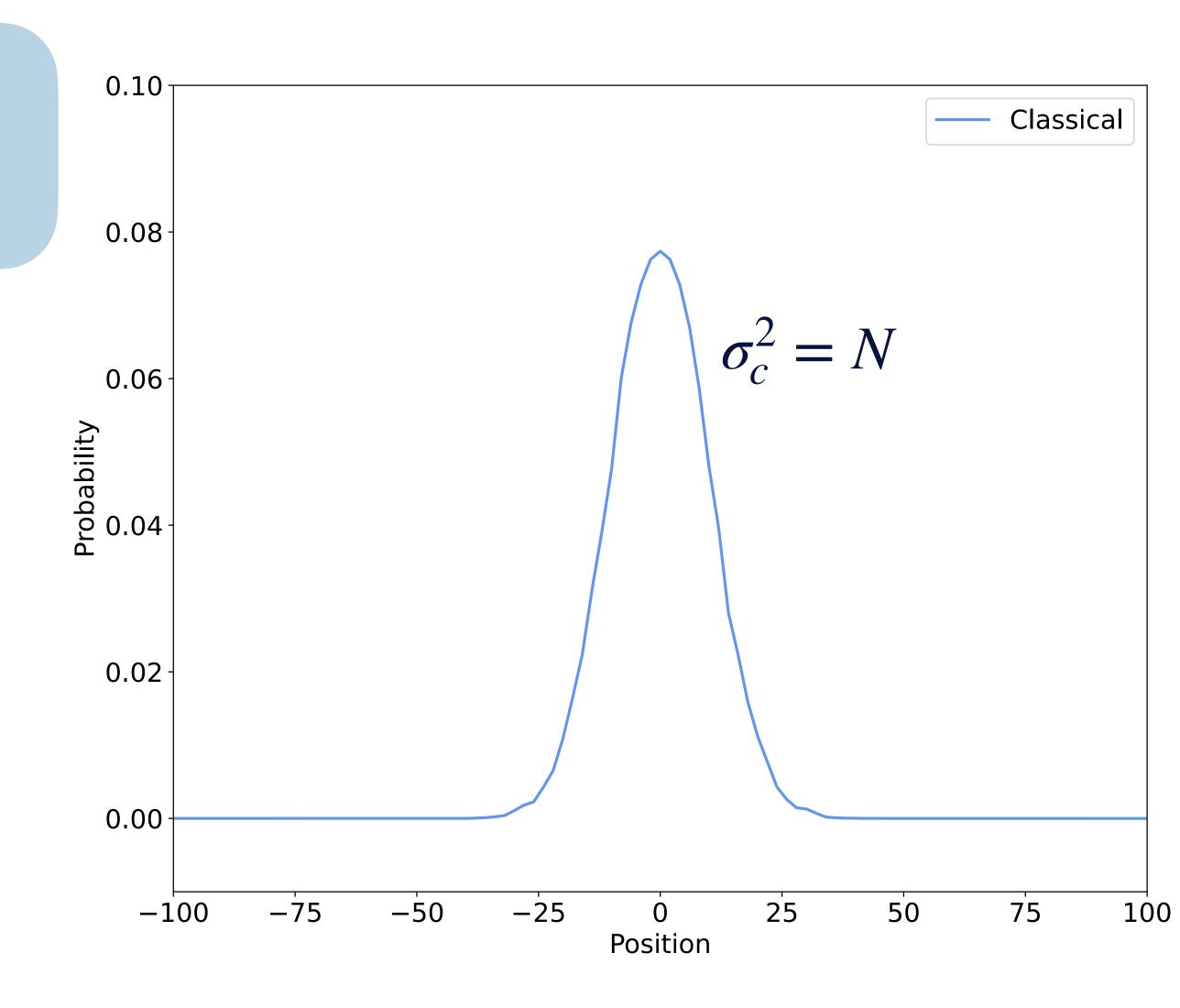


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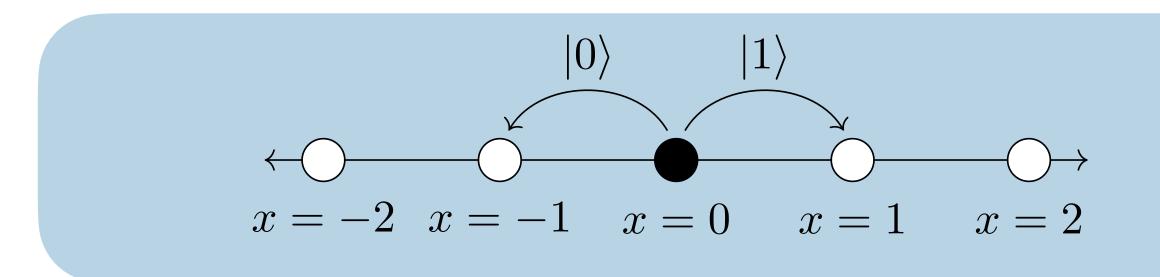




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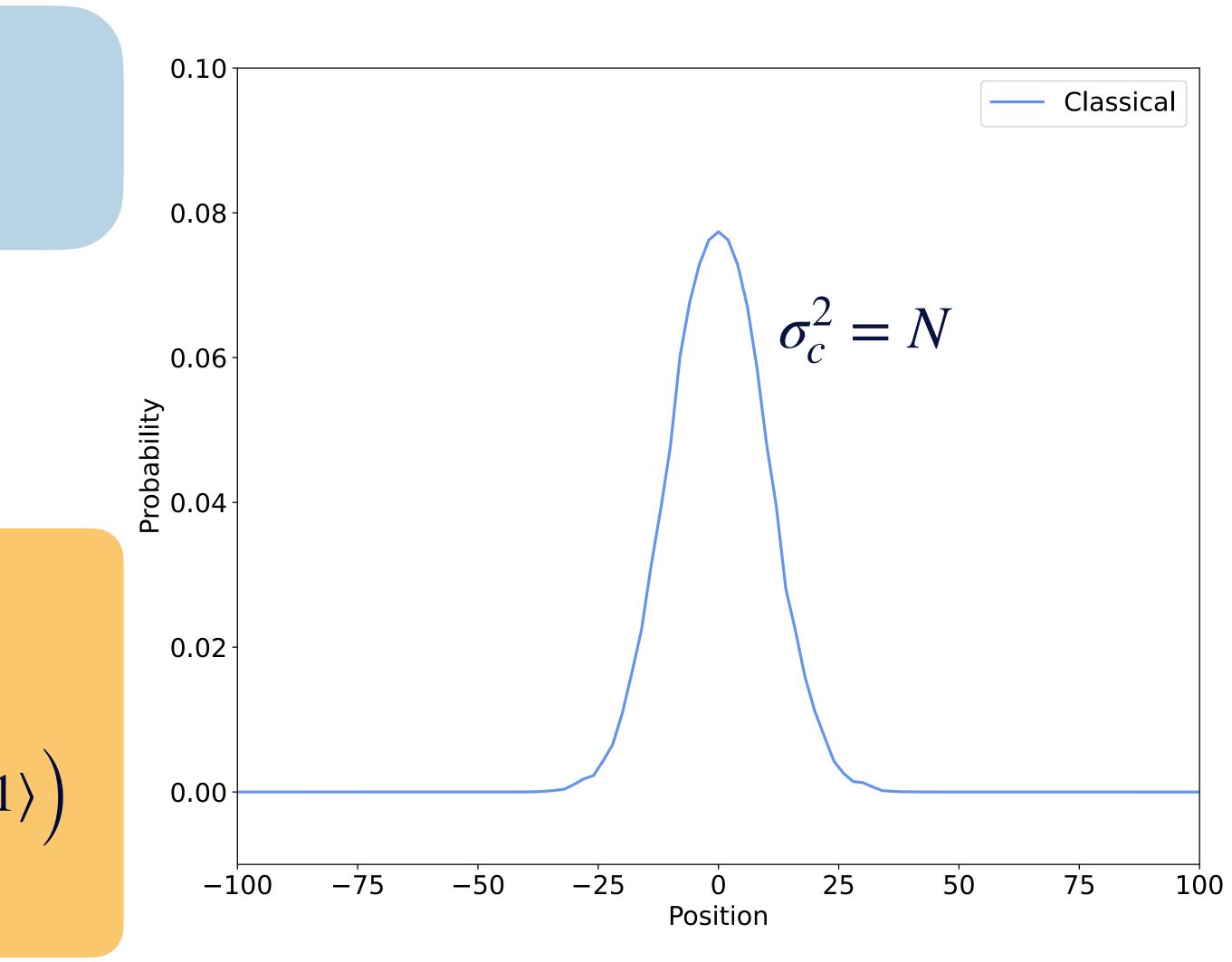




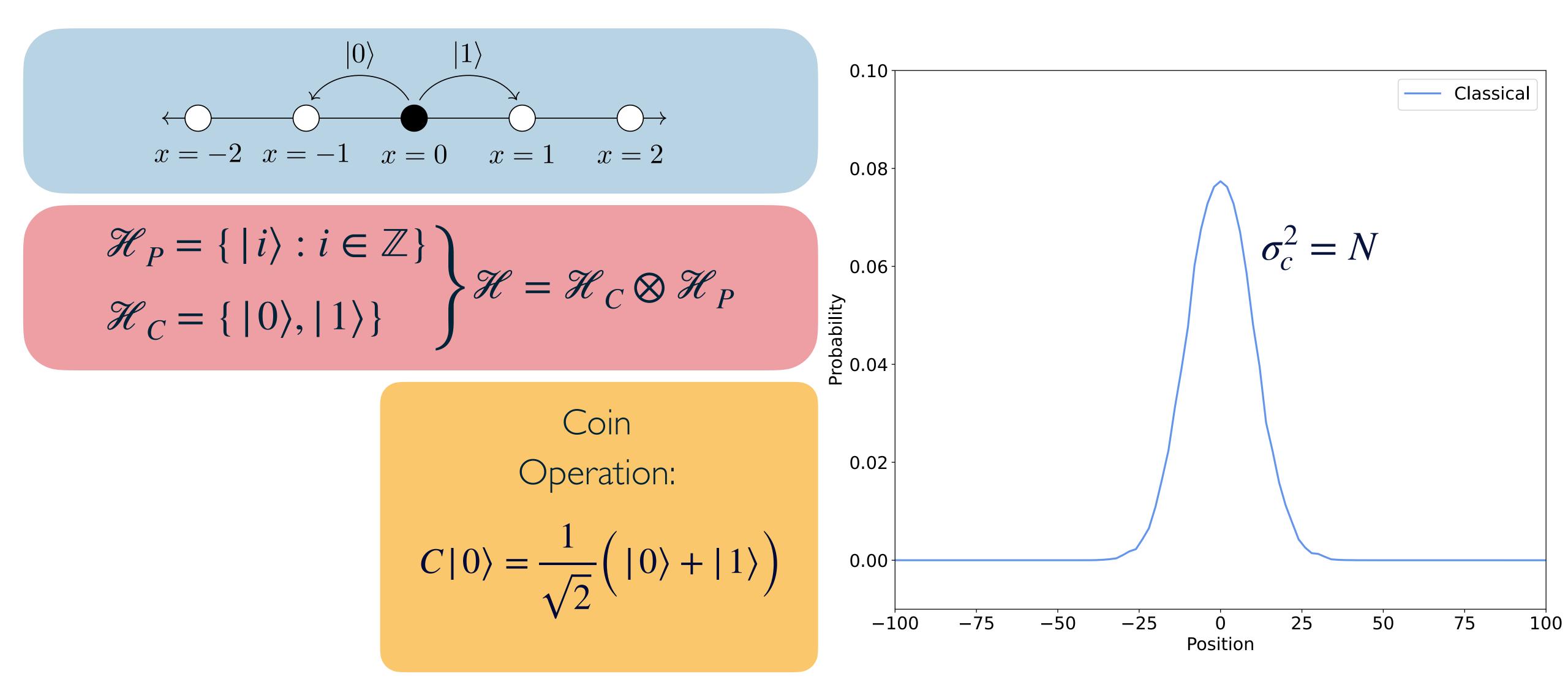


Coin Operation:  $C|0\rangle = \frac{1}{\sqrt{2}} \left(|0\rangle + |1\rangle\right)$ 

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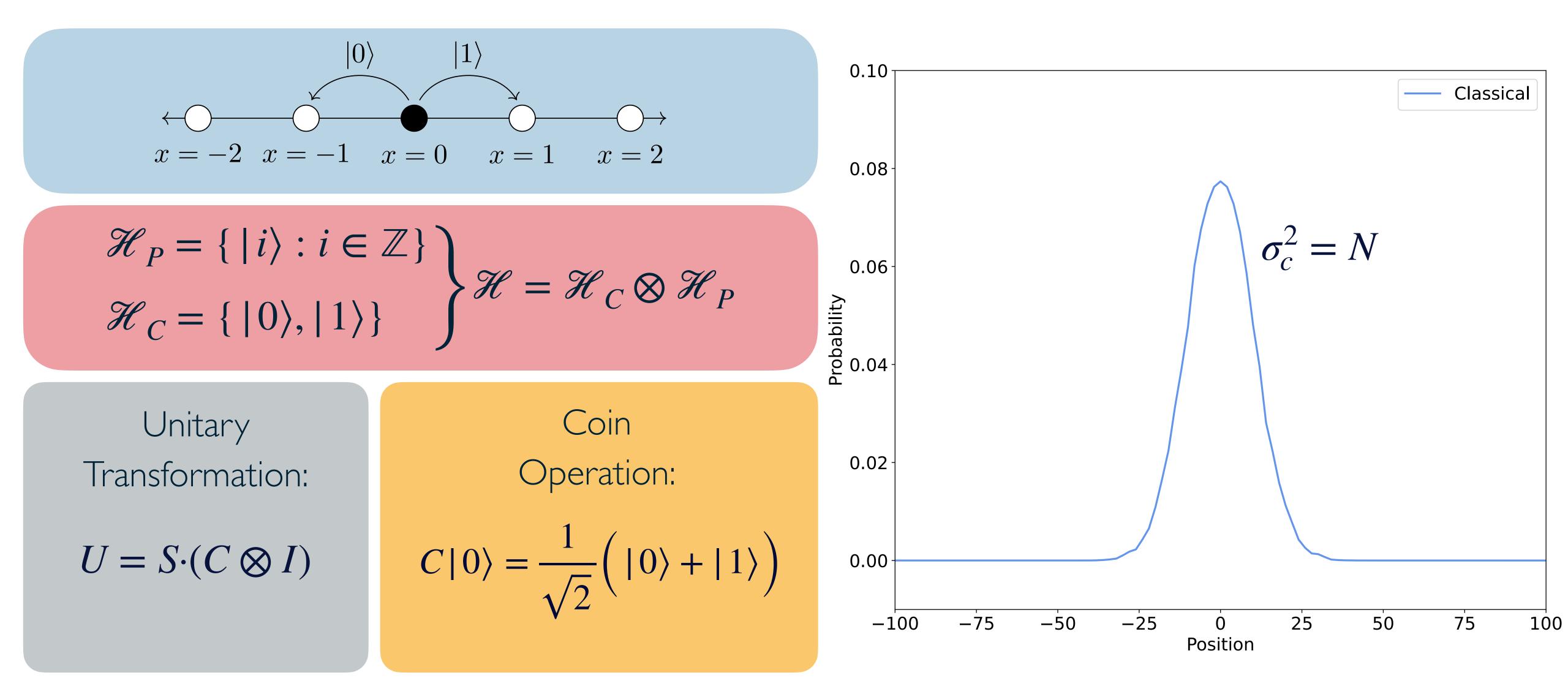






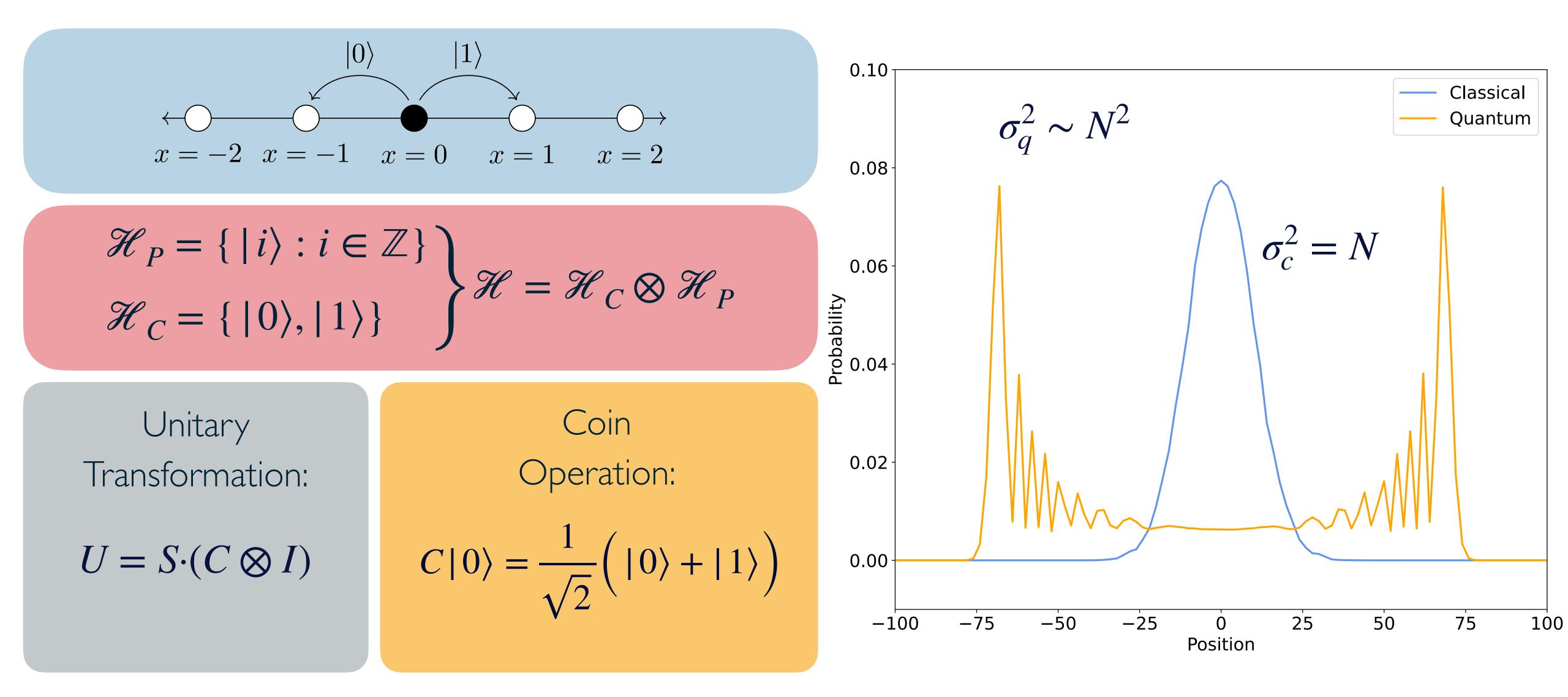
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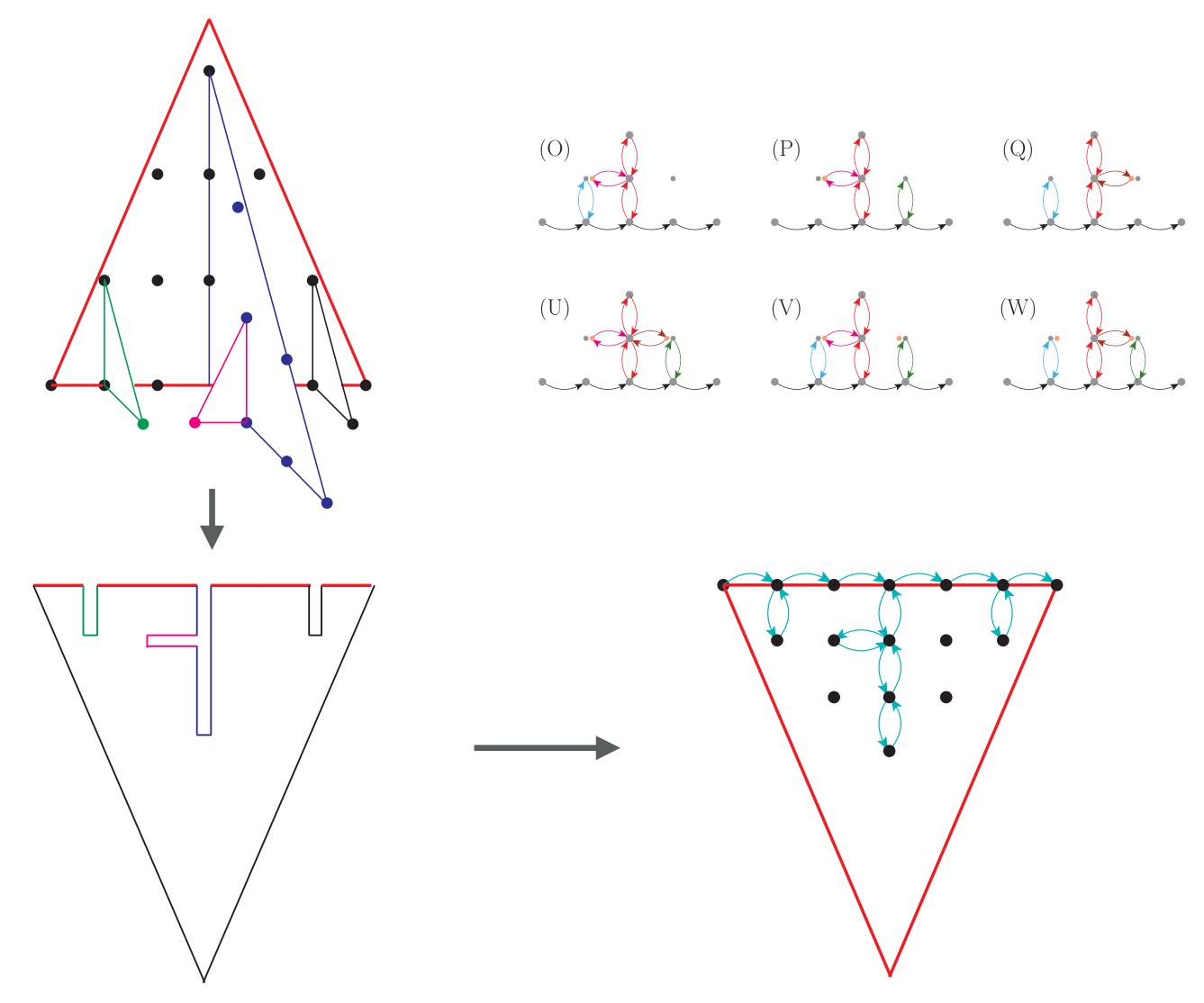




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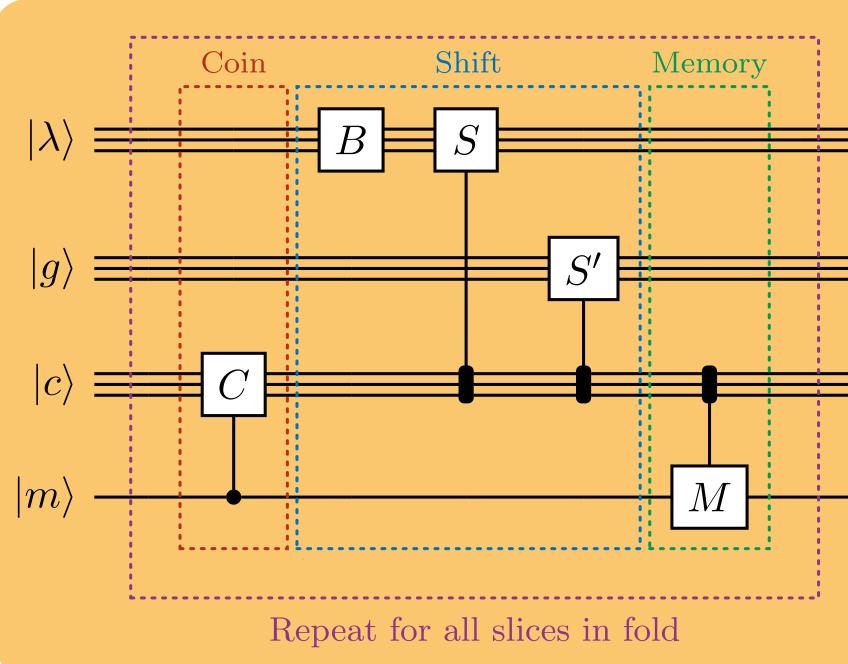


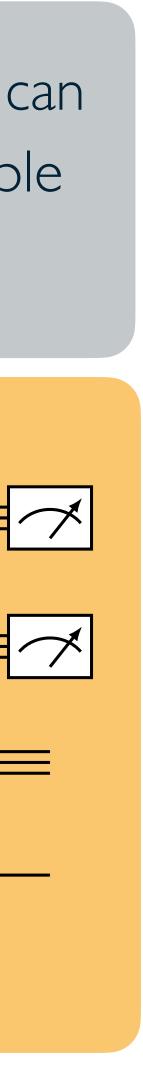
### Discrete QCD as a Quantum Walk



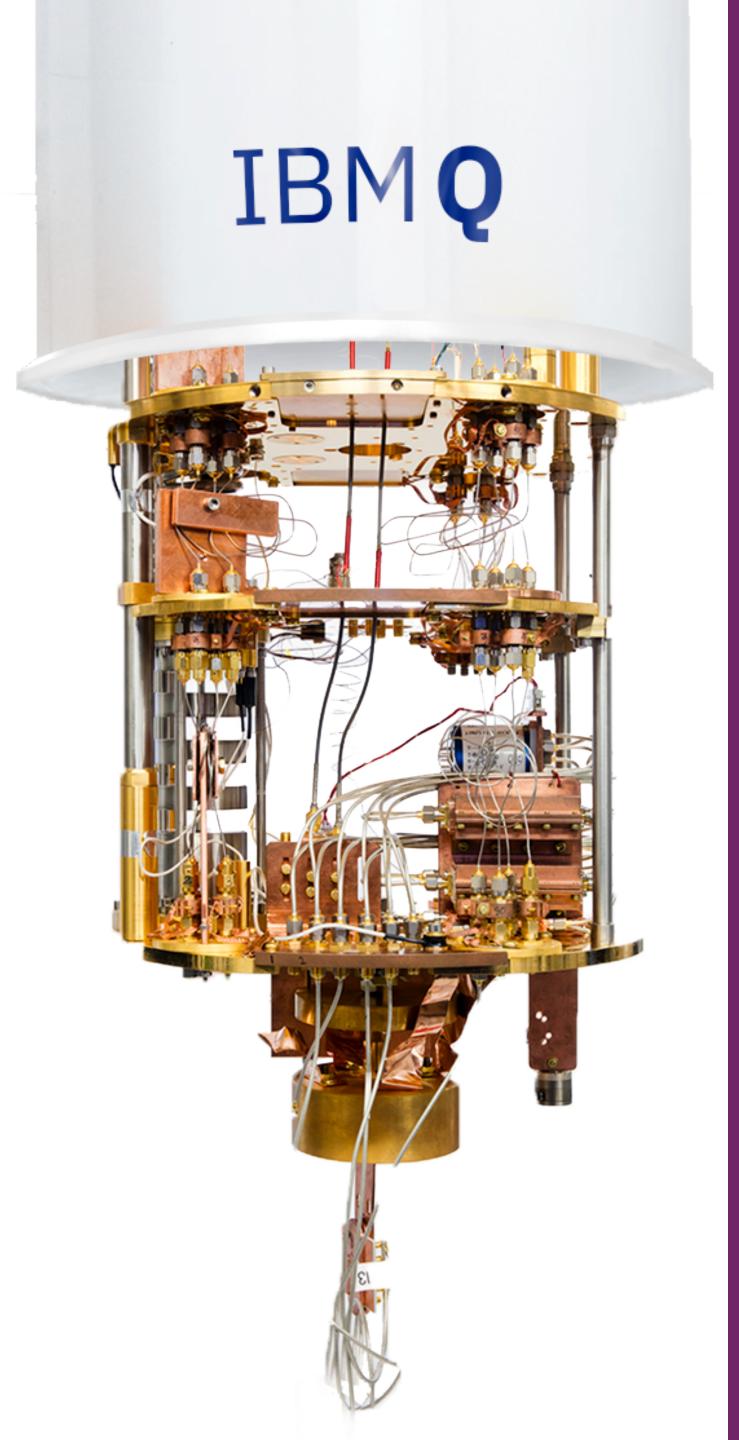
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### The Discrete-QCD dipole cascade can therefore be implemented as a simple **Quantum Walk**











# **Quantum Parton Shower** - Discretising QCD - Parton Shower as a Quantum Walk

G. Gustafson, S. Prestel, M. Spannowsky and S. Williams, Collider Events on a Quantum Computer, *JHEP* 11 (2022) 035, <u>arXiv:2207.10694</u>



### - Generate Scattering Events



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# Generating Scattering Events from Groves

Once the grove structure has been selected, event data can be synthesised in the following steps using the baseline:

- I. Create the highest  $\kappa$  effective gluons first (i.e. go from top to bottom in phase space)
- from the grove

The algorithm has been run on both the ibm\_qasm\_simulator and the ibm\_algiers 27 qubit device. A like-for-like classical implementation has been used as a comparison.

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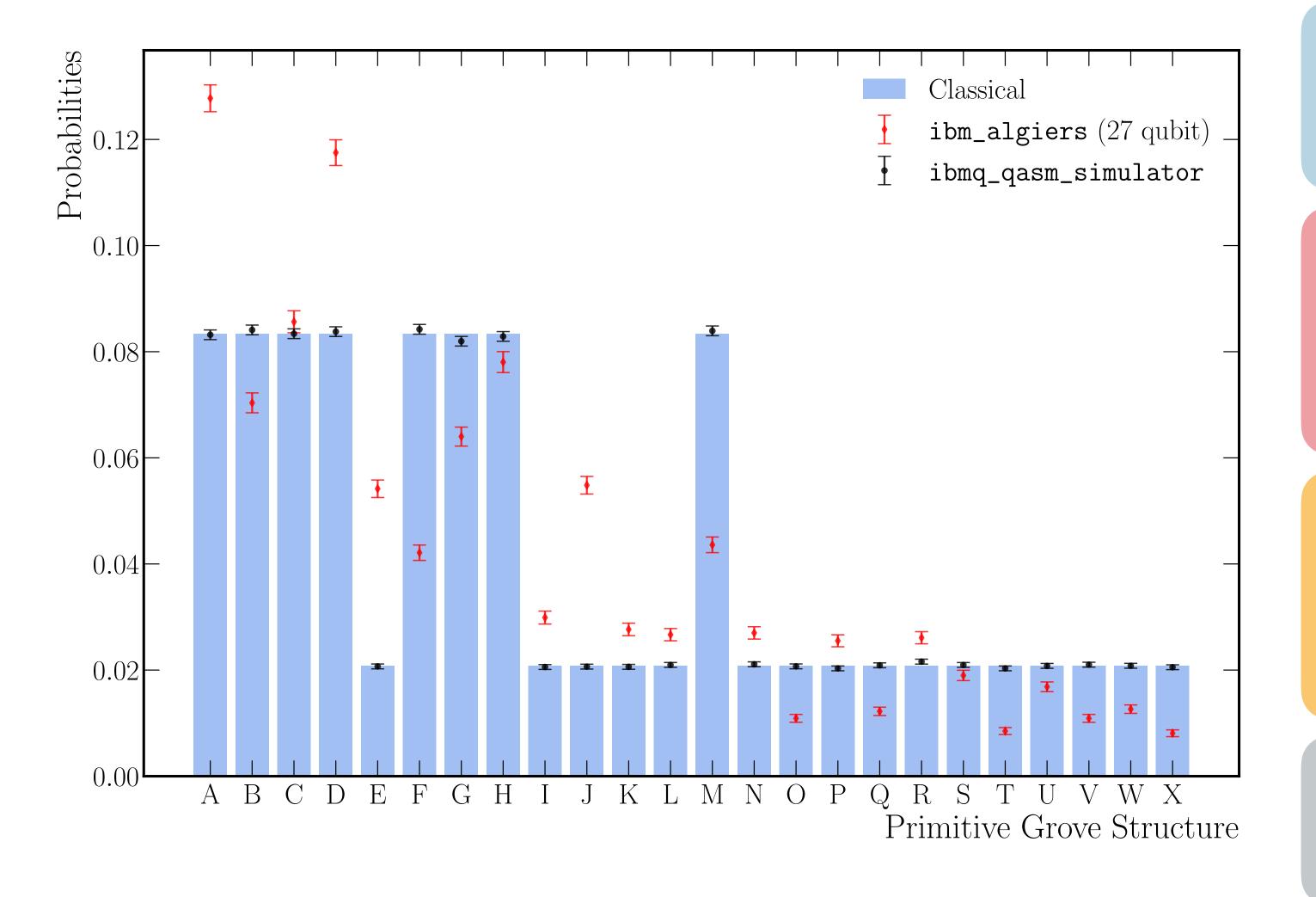
2. For each effective gluon j that has been emitted from a dipole IK, read off the values  $s_{ii}$ ,  $s_{ik}$  and  $s_{IK}$ 

3. Generate a uniformly distributed azimuthal decay angle  $\phi$ , and then employ momentum mapping (here we have used Phys. Rev. D 85, 014013 (2012), 1108.6172) to produce post-branching momenta





### Discrete QCD as a Quantum Walk - Raw Grove Simulation



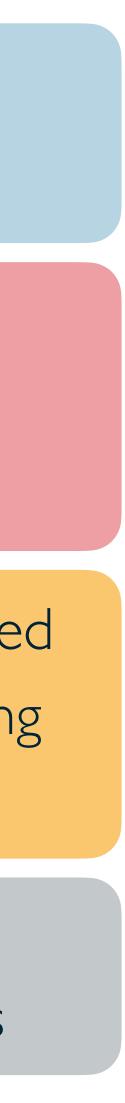
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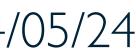
### The algorithm has been run on the **IBM Falcon 5.11r chip**

The figure shows the uncorrected performance of the **ibm\_algiers** device compared to a simulator

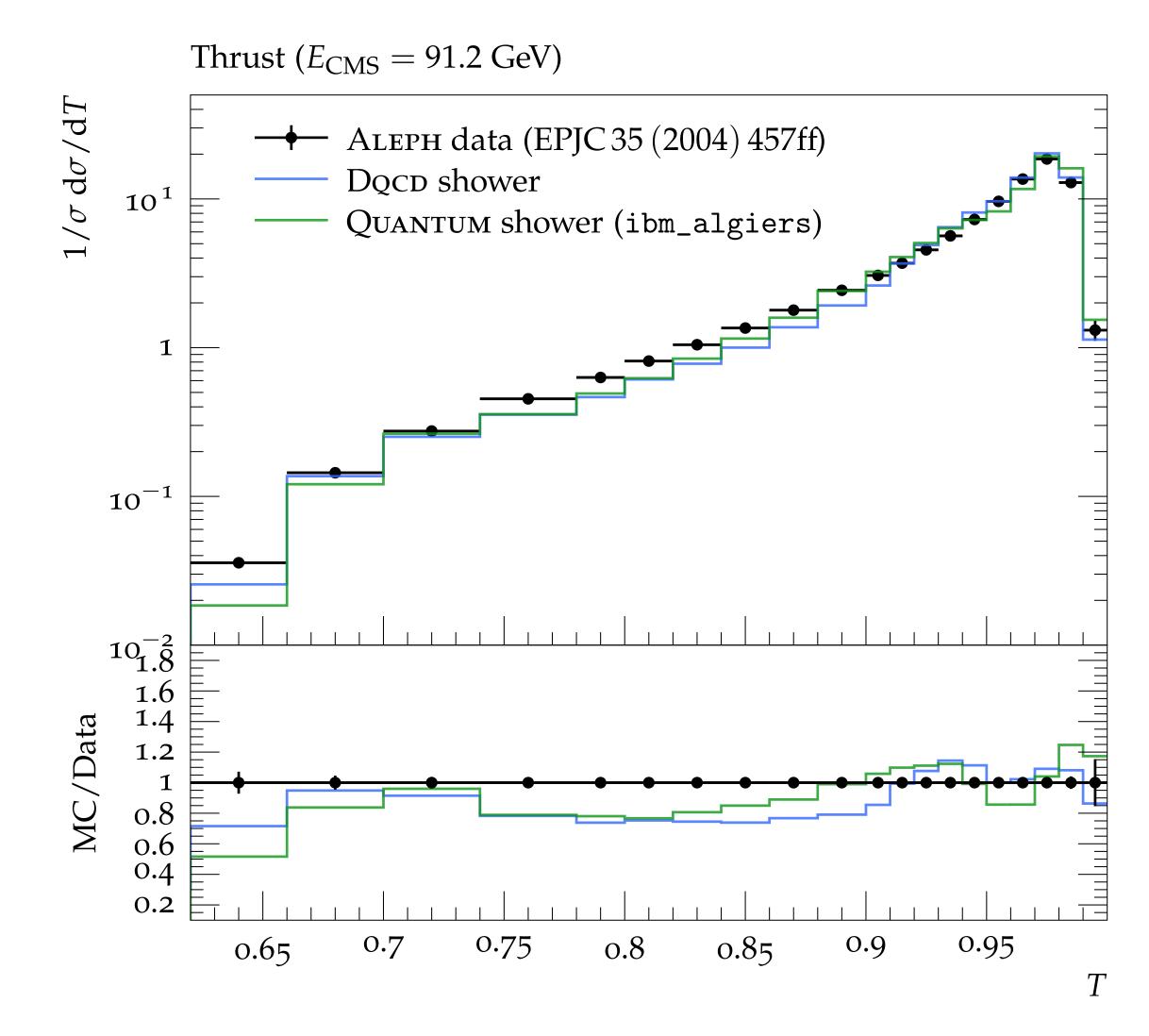
The 24 grove structures are generated for a  $E_{CM} = 91.2$  GeV, corresponding to typical collisions at LEP.

Main source of error from CNOT errors from large amount of SWAPs

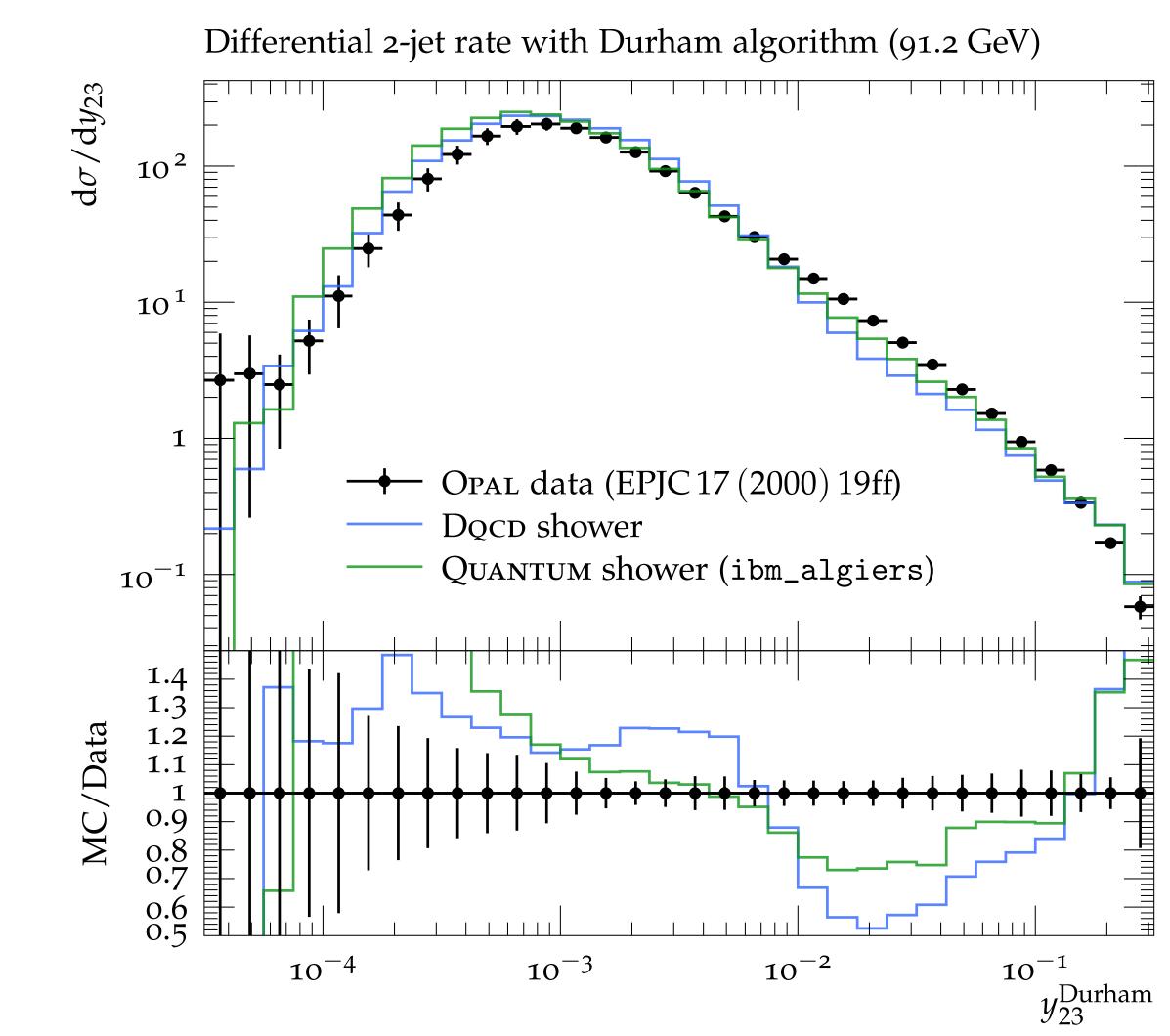




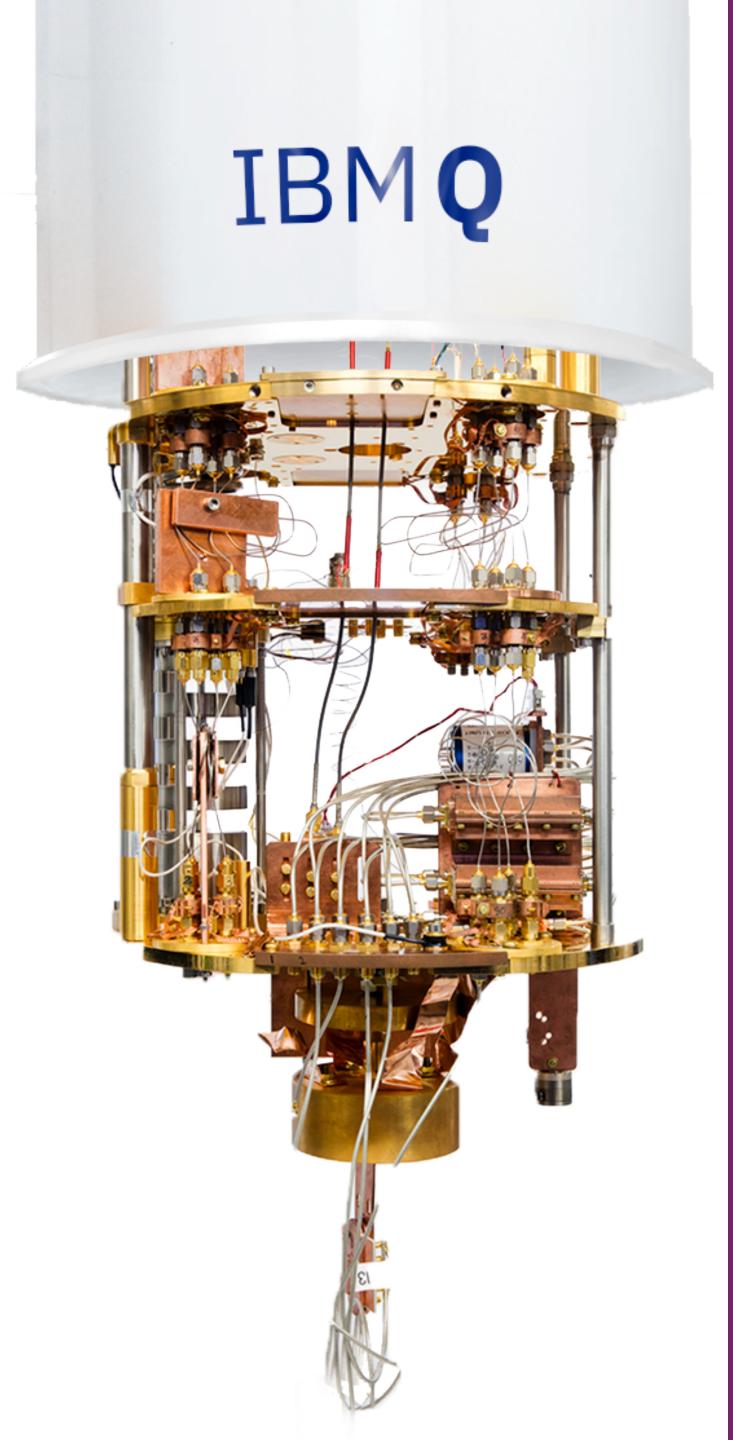
### Collider Events on a Quantum Computer



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C. Brown, M. Spannowsky, A. Tapper, S. Williams and I. Xiotidis (2024) Quantum pathways for charged track finding in high-energy collisions. Front. Artif. Intell. 7:1339785. <u>arXiv:2311.00766</u>

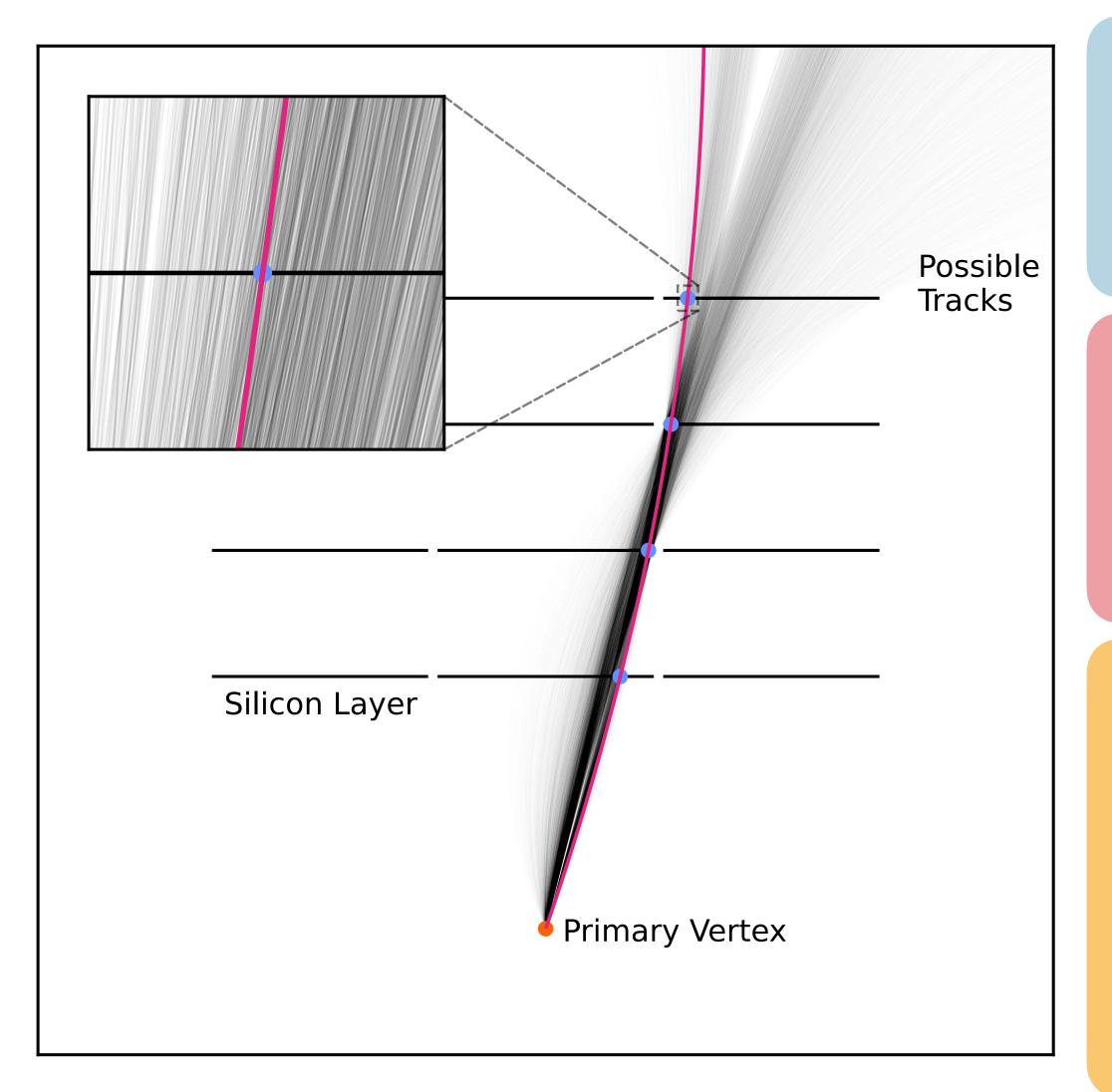


# **Quantum Charged Track Finding**

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### Track Finding via Associative Memory



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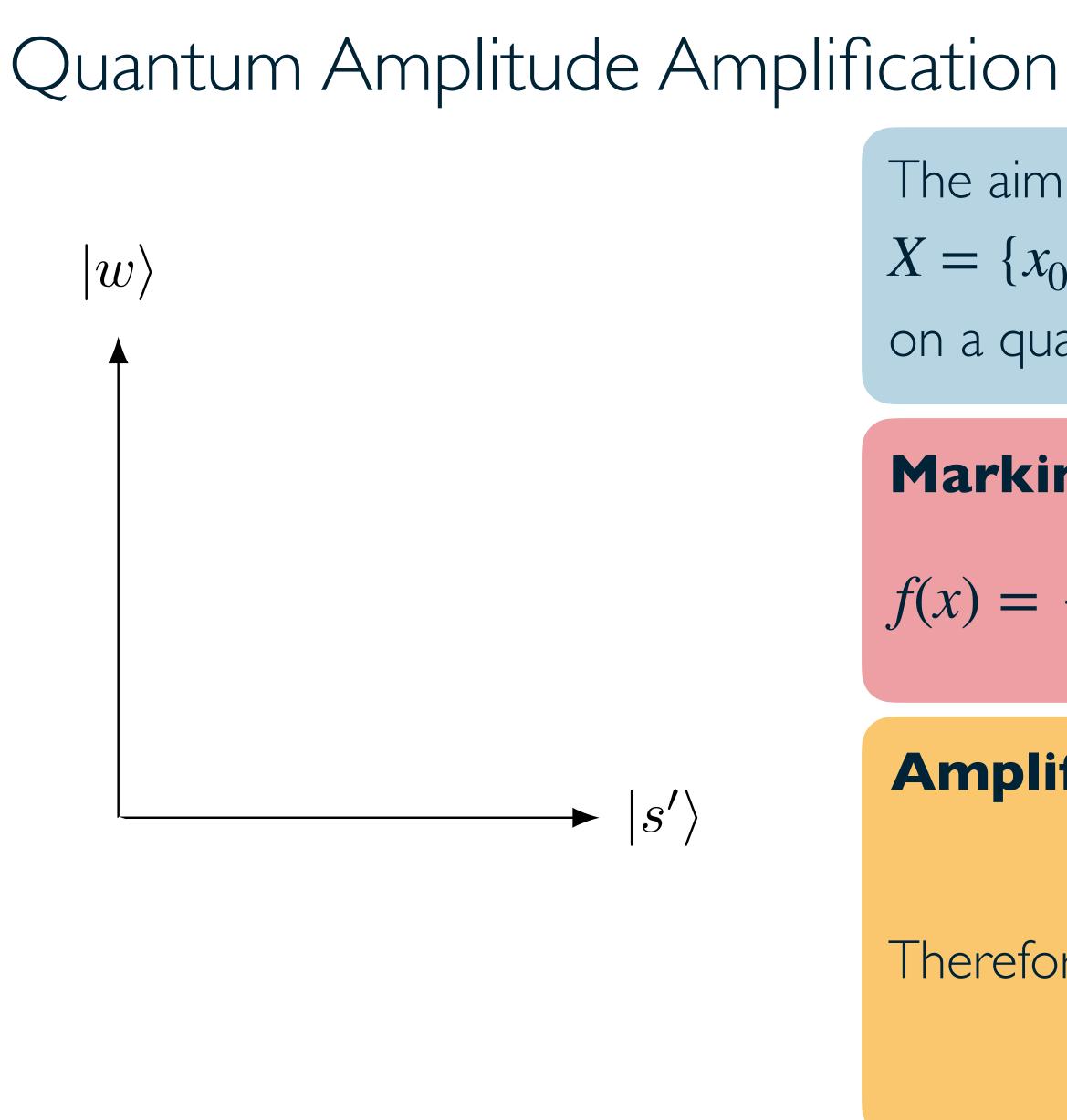
A critical stage of event reconstruction and classification in modern colliders is the identification of charged particle trajectories

Highly granular detectors are used to efficiently measure the **position** of **charged particles** as they move through the detector

Classical techniques like Associative Memory have been shown to be **highly effective**, but **new approaches** are required as collider **energy** and luminosity increase to handle the growing number of tracks and combinatorics







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The aim is to **identify** interesting states in a database  $X = \{x_0, x_1, \dots, x_N\}$  with **interesting states**  $m_i$  encoded on a quantum device as  $|s\rangle = \mathscr{A} |0\rangle^{\otimes n}$ 

ing interesting states, 
$$|m\rangle$$
 using the **oracle**  

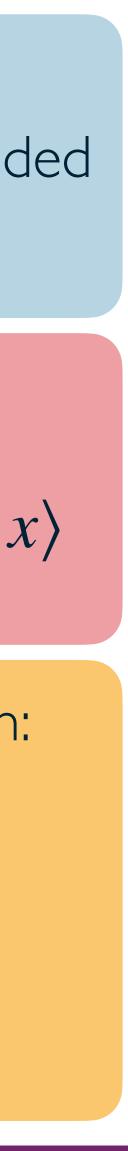
$$\begin{cases}
1 & \text{if } x = m, \\
0 & \text{otherwise.}
\end{cases} \xrightarrow{W} S_f |x\rangle = (-1)^{f(x)}|$$

**Amplify marked states** using the diffusion operation:

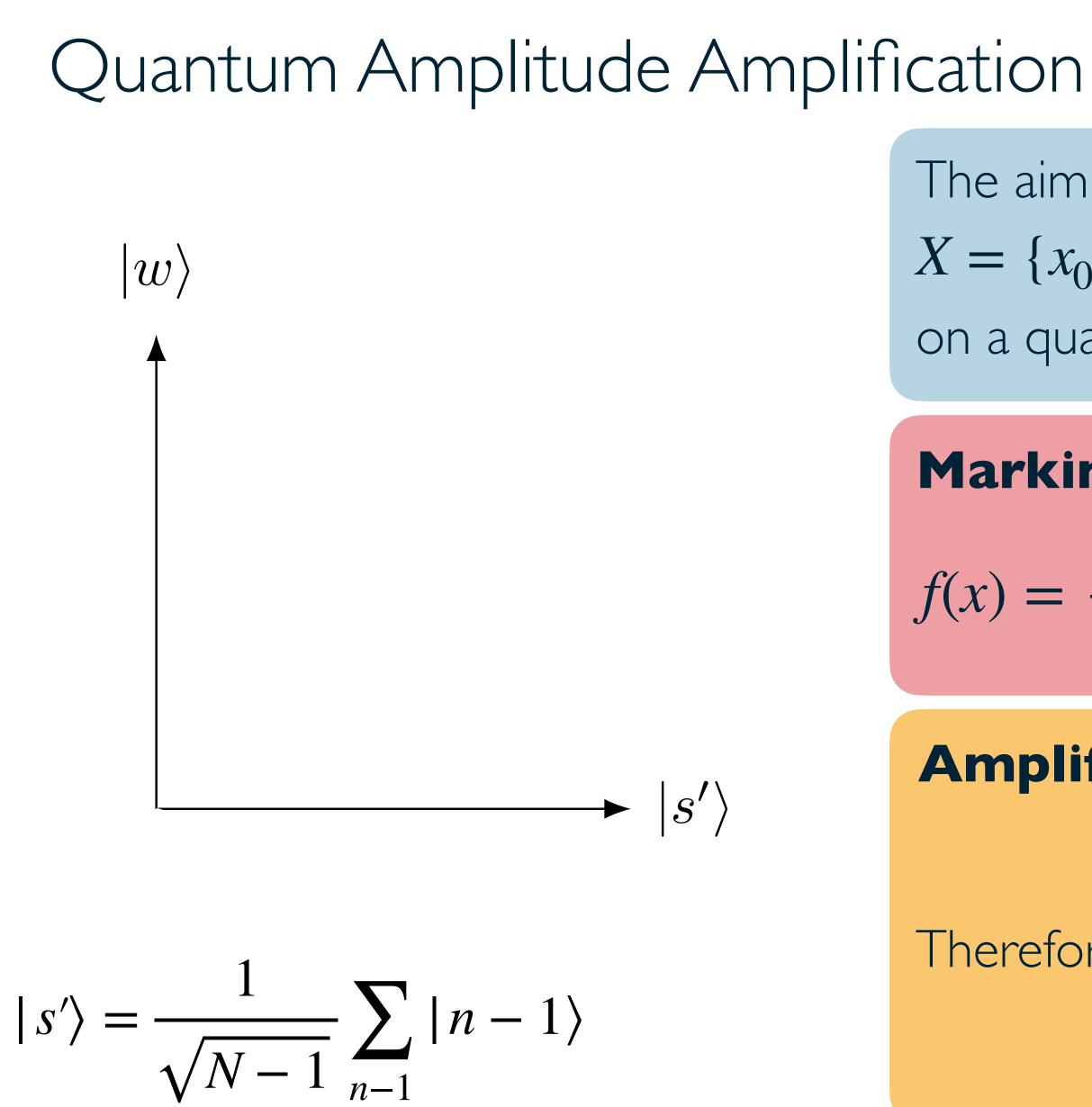
$$D = \mathscr{A}^{\dagger} S_0 \mathscr{A}$$

Therefore, can iteratively apply the **Grover Iterator**:

$$Q = \mathscr{A}^{\dagger} S_0 \mathscr{A} S_f$$







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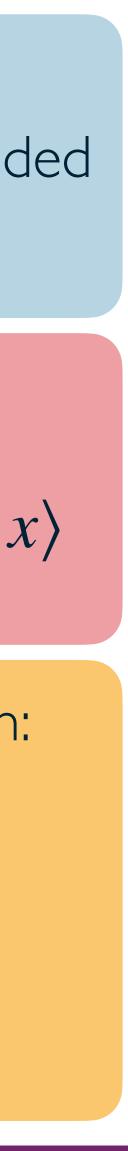
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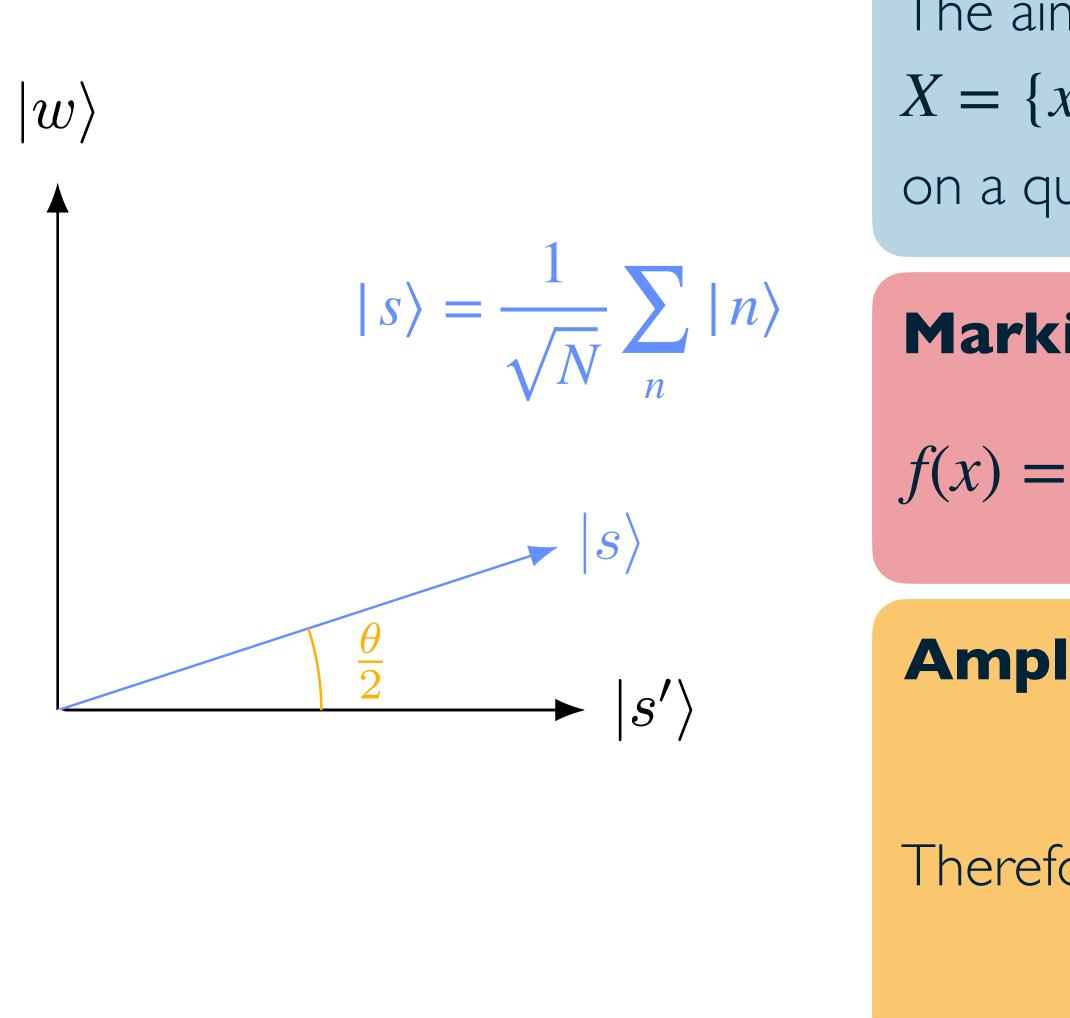
**Amplify marked states** using the diffusion operation:

$$D = \mathscr{A}^{\dagger} S_0 \mathscr{A}$$

$$Q = \mathscr{A}^{\dagger} S_0 \mathscr{A} S_f$$







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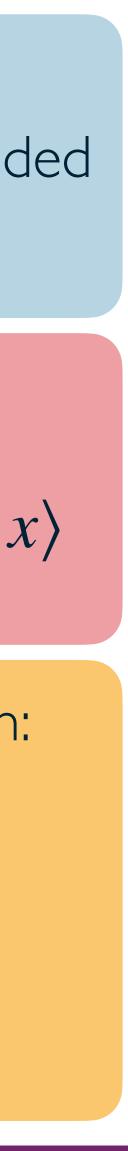
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\end{cases} \xrightarrow{W} S_f |x\rangle = (-1)^{f(x)}|$$

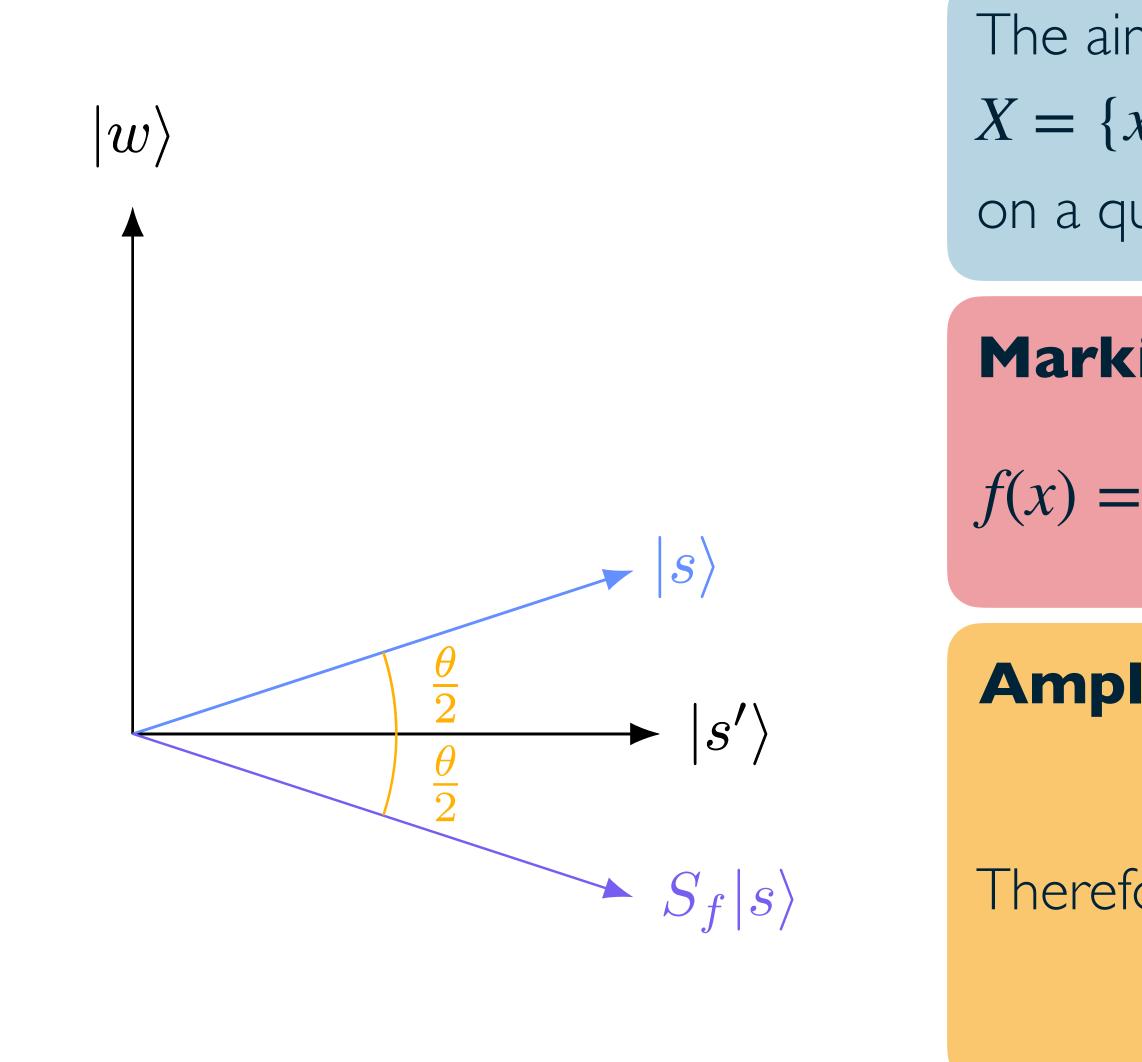
**Amplify marked states** using the diffusion operation:

$$D = \mathscr{A}^{\dagger} S_0 \mathscr{A}$$

$$Q = \mathscr{A}^{\dagger} S_0 \mathscr{A} S_f$$







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The aim is to **identify** interesting states in a database  $X = \{x_0, x_1, \dots, x_N\}$  with **interesting states**  $m_i$  encoded on a quantum device as  $|s\rangle = \mathscr{A} |0\rangle^{\otimes n}$ 

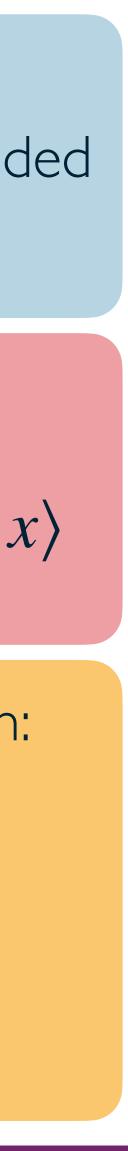
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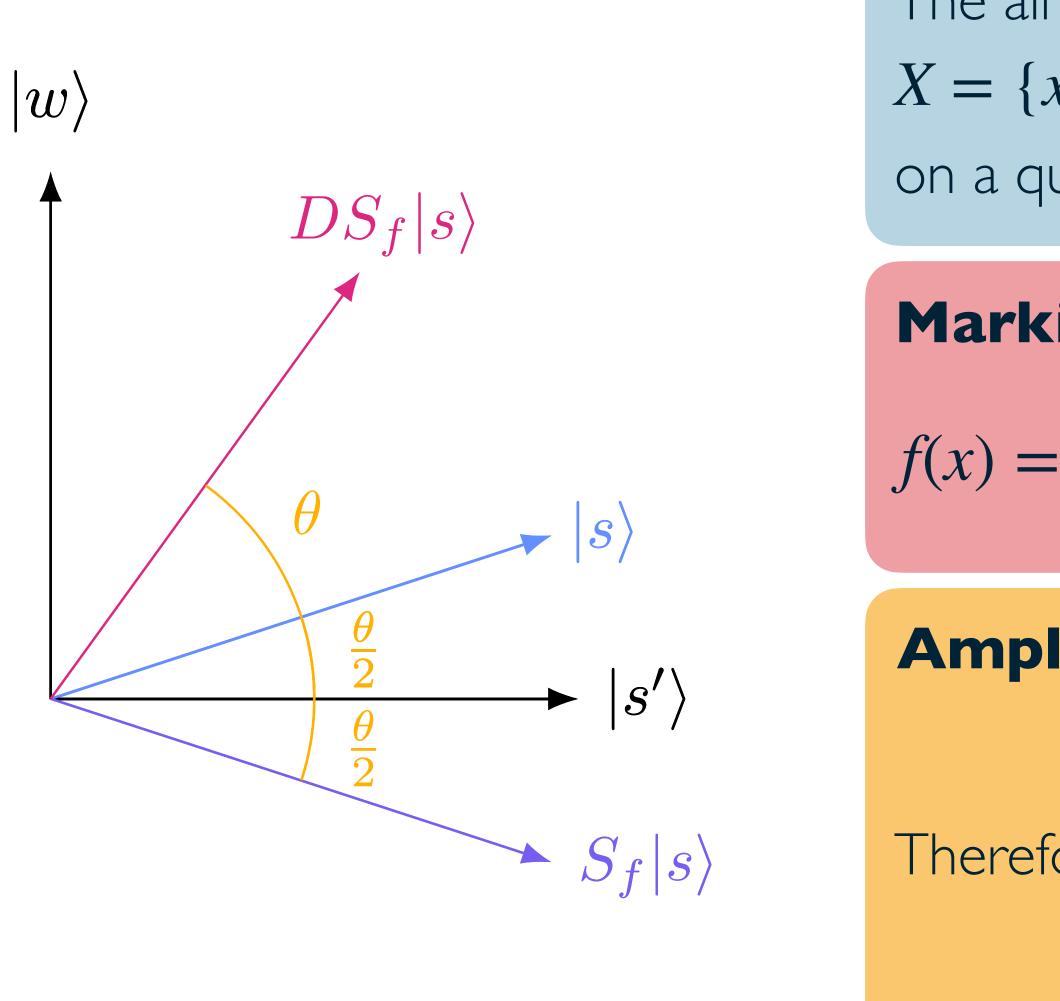
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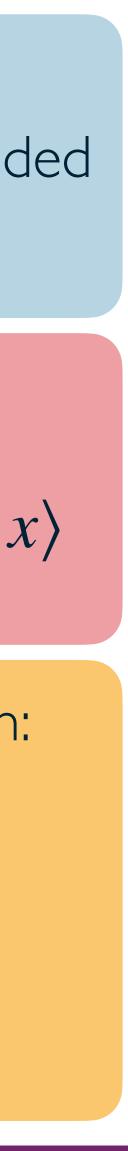
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The optimal number of iterations of the QAA routine Q is given by

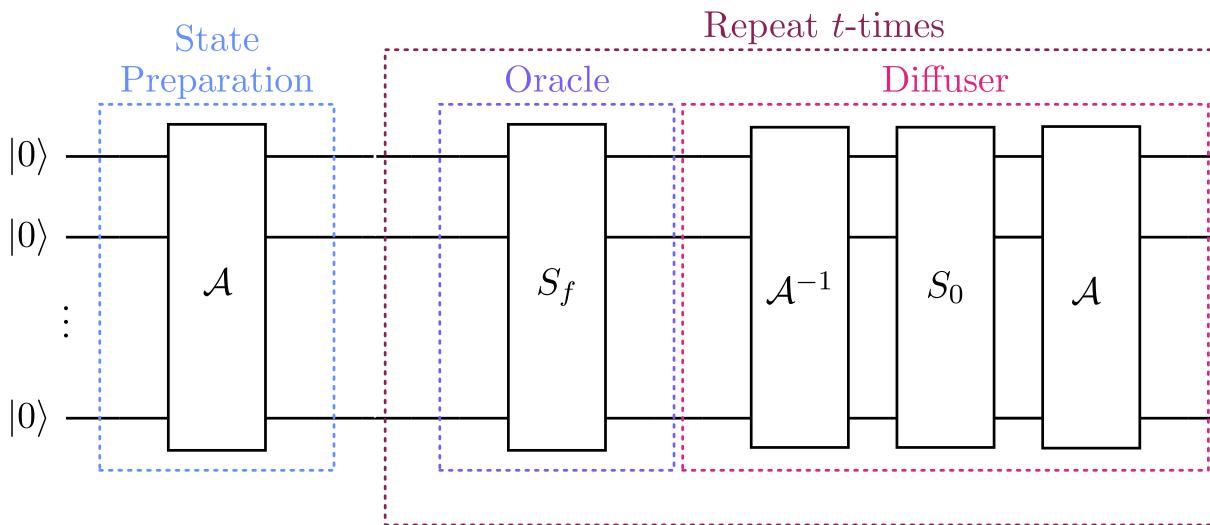
$$t = \left\lfloor \frac{\pi}{4} \sqrt{\frac{N}{m}} \right\rfloor$$

After t iterations of Q, measurement will return a marked state with high probability

QAA therefore scales as  $\mathcal{O}(\sqrt{N})$ , thus achieving a **polynomial speedup** over classical search algorithms, which scale as  $\mathcal{O}(N)$ 

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### **Oracle Construction**

Consider a two qubit example where  $|11\rangle$  is the marked state

$$S_f: I \otimes |0\rangle \langle 0| + Z \otimes |1\rangle \langle$$





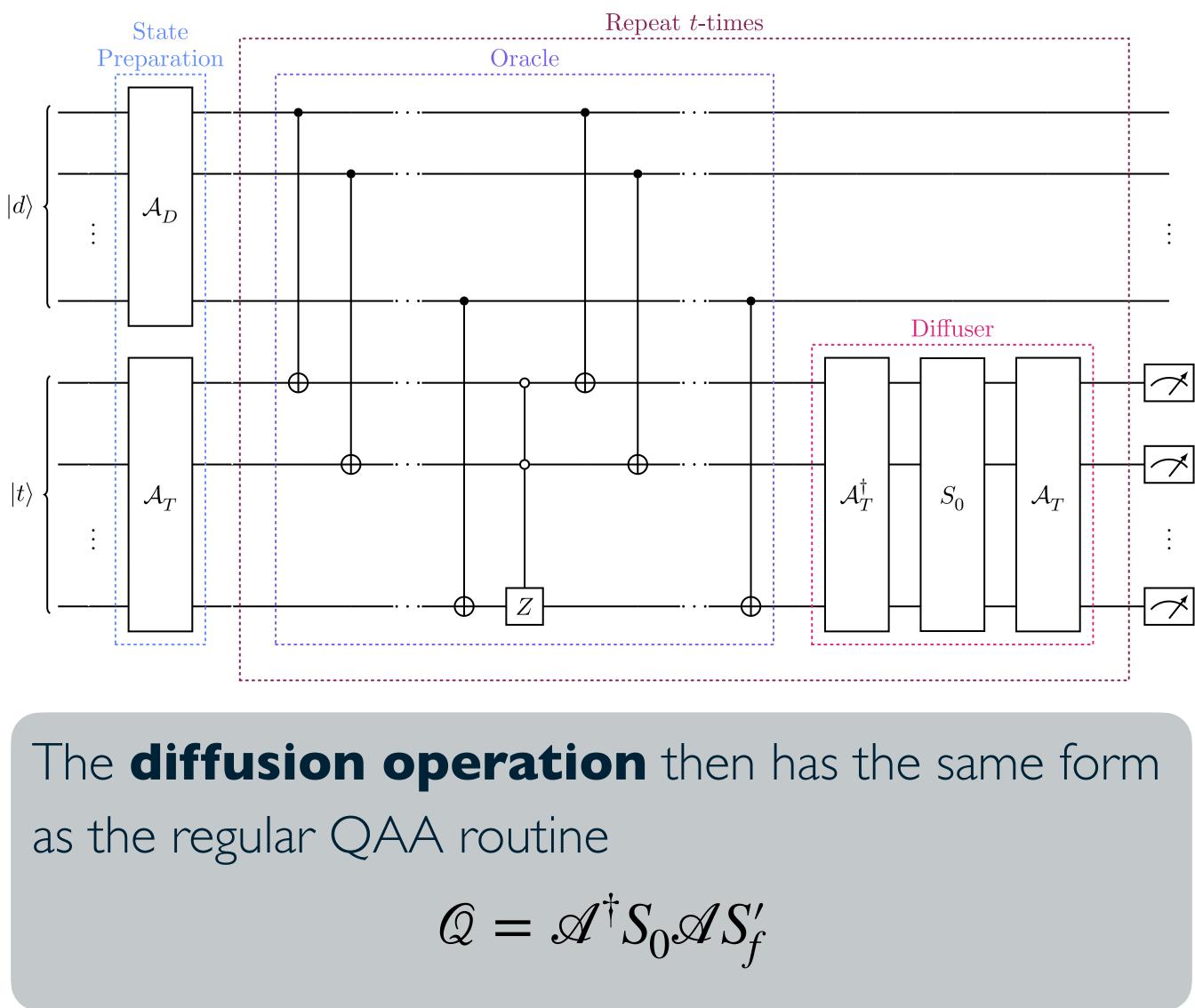


## Quantum Template Matching

The perform template matching, we must **abstract** the QAA routine by constructing a new oracle

Introducing a new **data register** and acting the oracle across two registers allows for data to be parsed directly to the algorithm

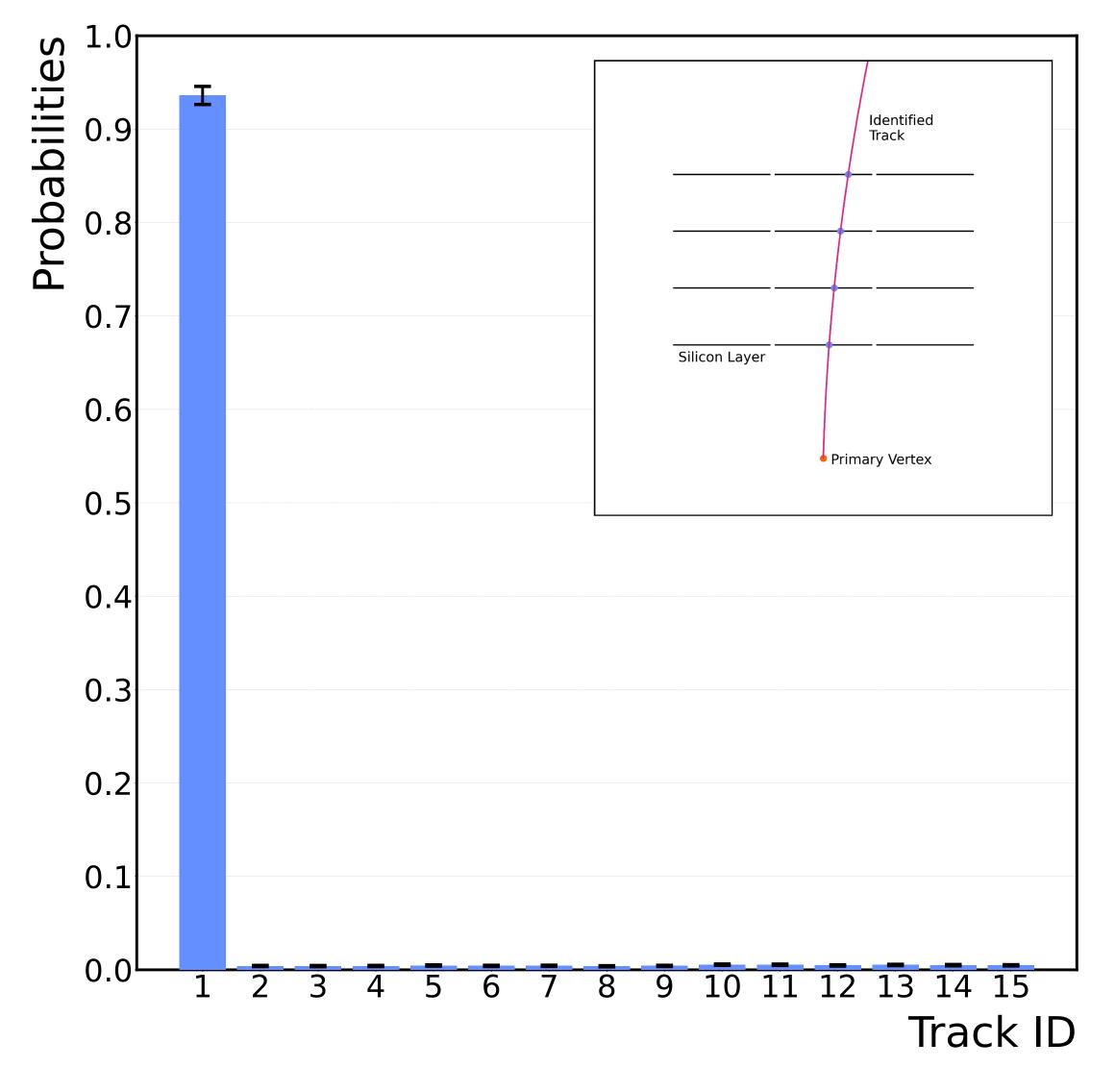
The oracle is constructed from a series of **CNOT** gates and a phase inversion about the zero state on the template register



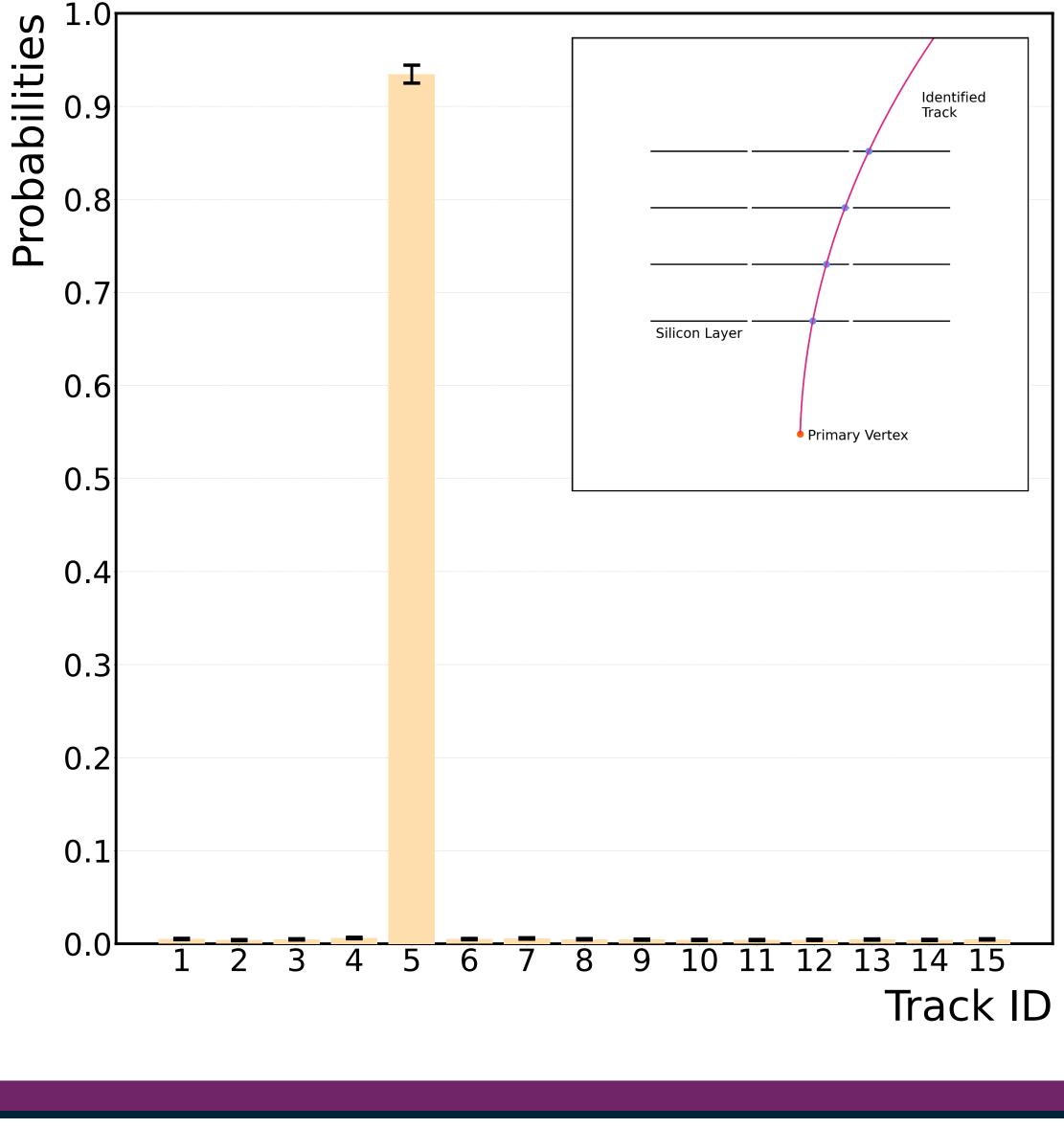
$$Q = \mathscr{A}^{\dagger} S_0 \mathscr{A} S_f'$$



## Quantum Template Matching for Track Finding



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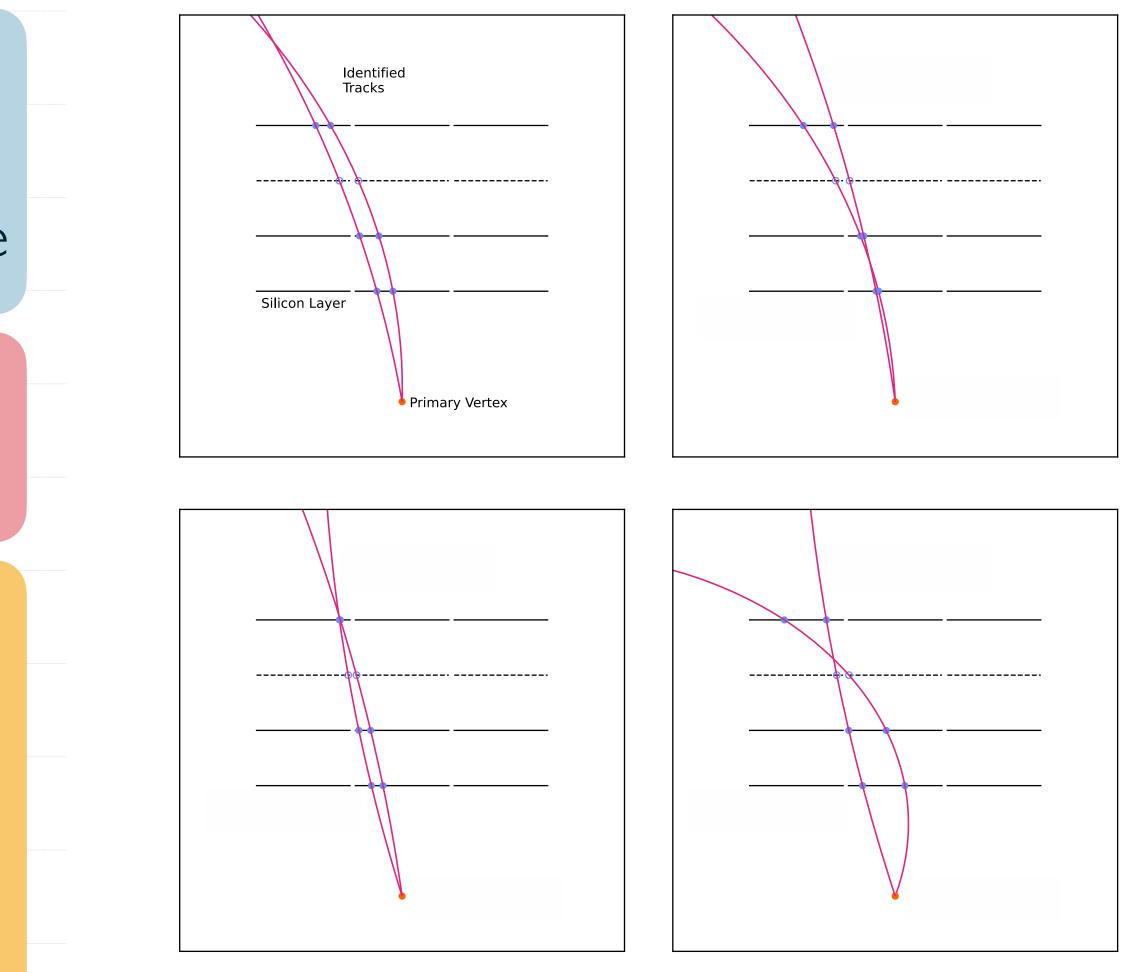
## Quantum Track Finding with Missing Hits

A primary challenge for track finding algorithms is when a particle traverses a detector without registering a hit in one or more detector module

An Associative Memory approach to track finding cannot manage missing hit data

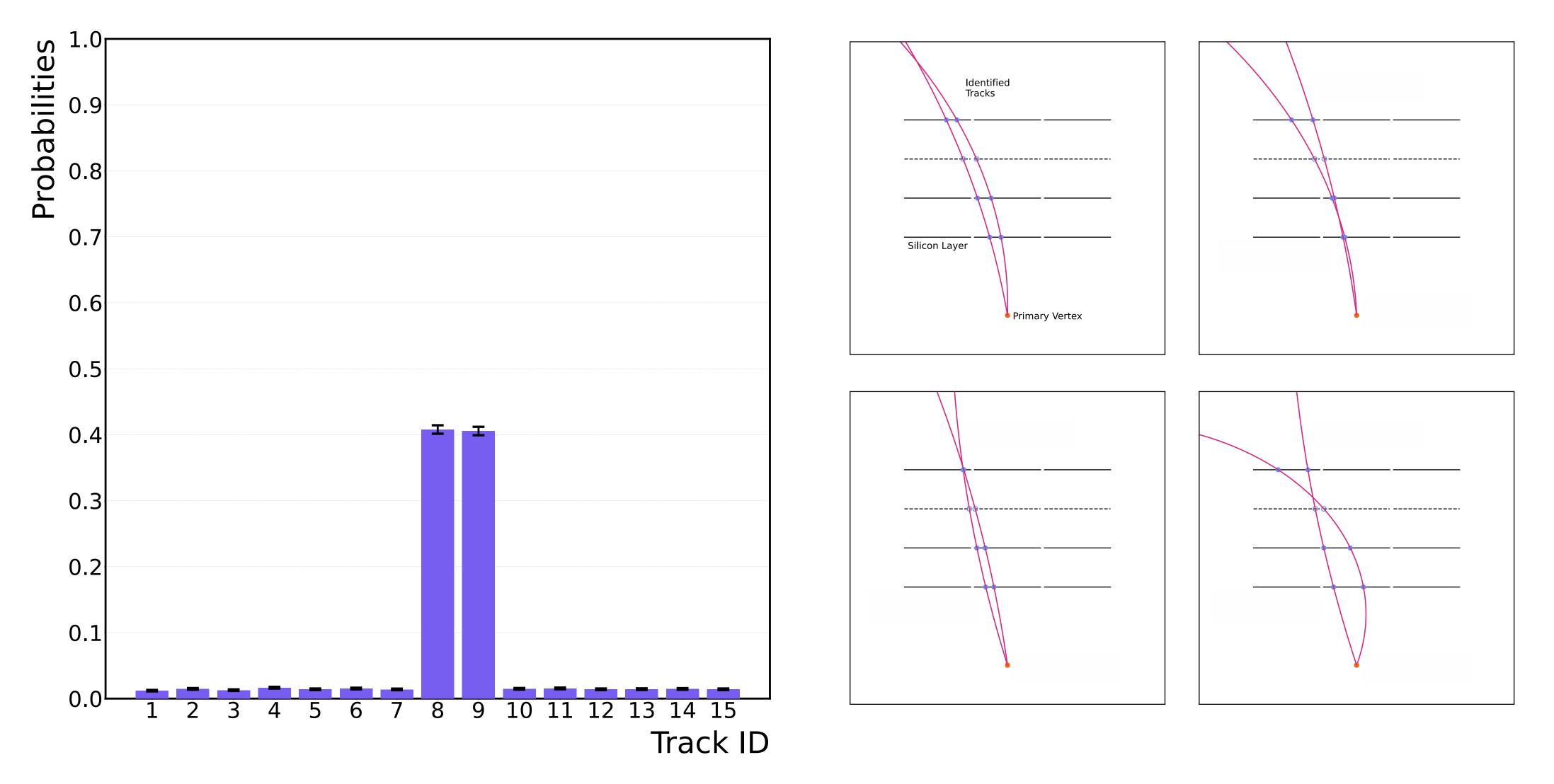
## Modifying the oracle allows for the quantum template algorithm to efficiently search on missing hit data, without an increase in resources and retaining the high accuracy and speedup

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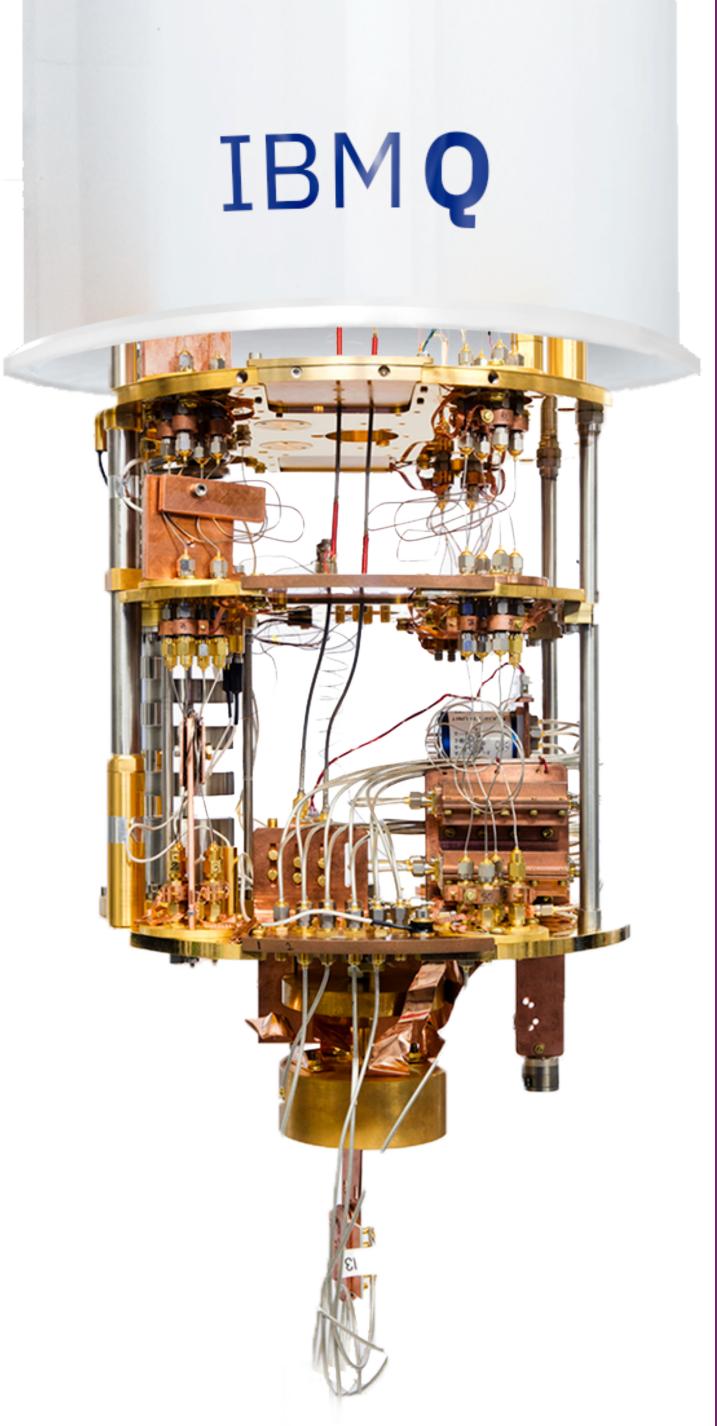


## Quantum Track Finding with Missing Hits



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## Summary

High Energy Physics is on the edge of a computational frontier, the High Luminosity Large Hadron Collider and FCC will provide unprecedented amounts of data

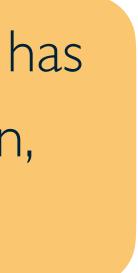
Quantum Computing offers an impressive and powerful tool to combat computational bottlenecks, both for theoretical and experimental purposes

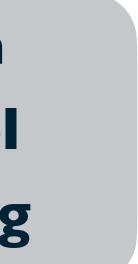
We present an efficient approach to track finding using quantum computers by exploiting the **QAA** routine and employing a **novel** oracle paving the way for practical quantum track finding

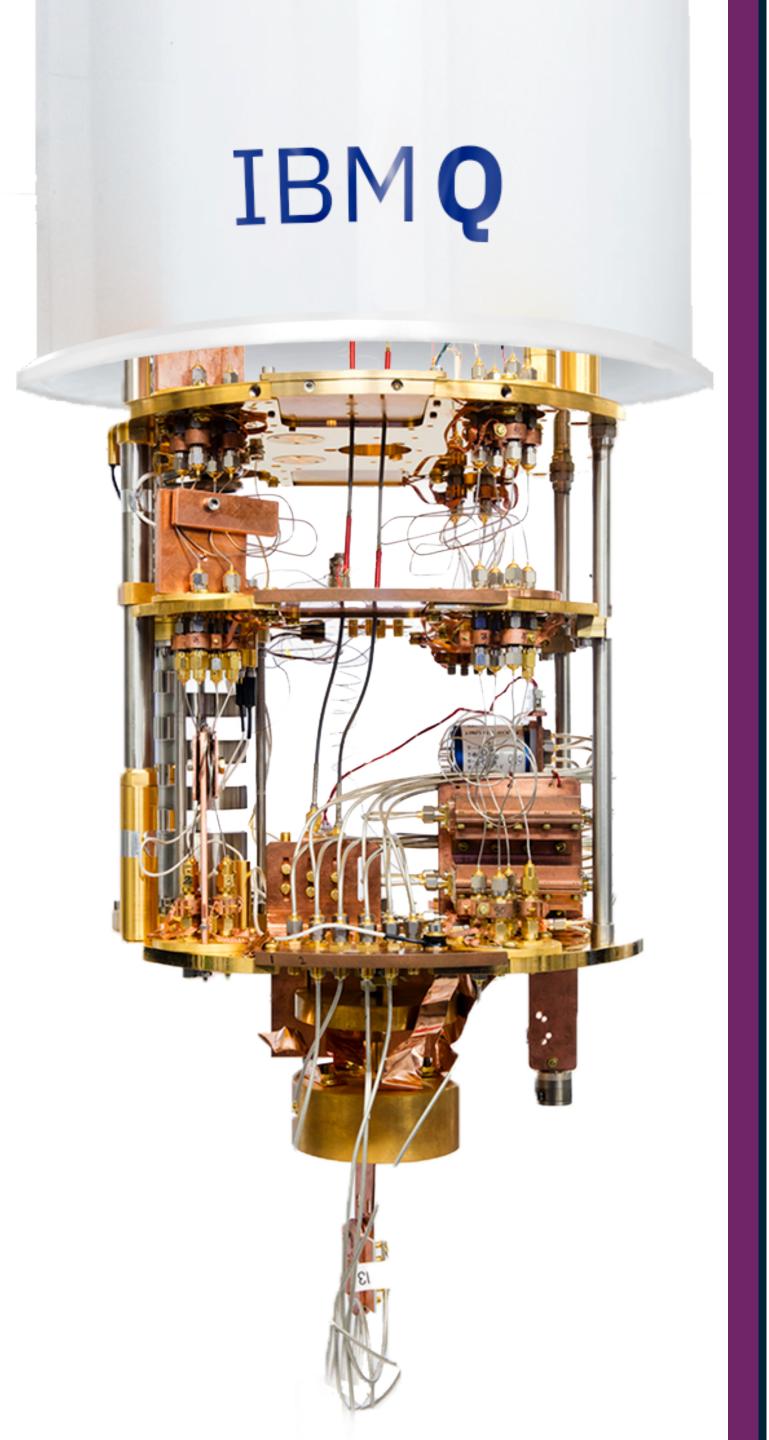
## The first realistic simulation of a high energy collision has been presented using a compact quantum walk implementation, allowing for the algorithm to be run on a **NISQ device**















# **Backup Slides**

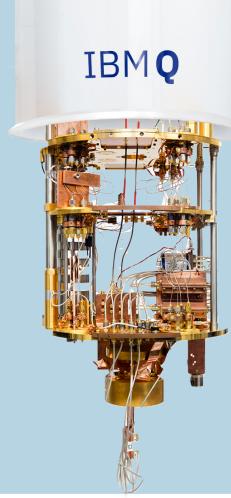
Simon Williams

Future Colliders, Corfu Summer Institute, 24th May 2024

## Noisy Intermediate-Scale Quantum Devices

### **NISQ devices:**

No continuous quantum error correction, prone to large noise effects from environment.



### **Transpilation:**

Loading the circuit onto the backend, transpilation can be used to optimise the circuit: qubit and coupling mapping, noise models, etc.

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### **Quantum errors:**

Mutliqubit qubit gates: CNOT gates have higher associated errors than single qubit gates.

**SWAP errors:** SWAP operations require 3 CNOT gates

**TI times:** The time it takes for an excited qubit to decay back to the ground state.

Circuit depth! - Compact circuits needed!





## Speed up via Quantum Walks

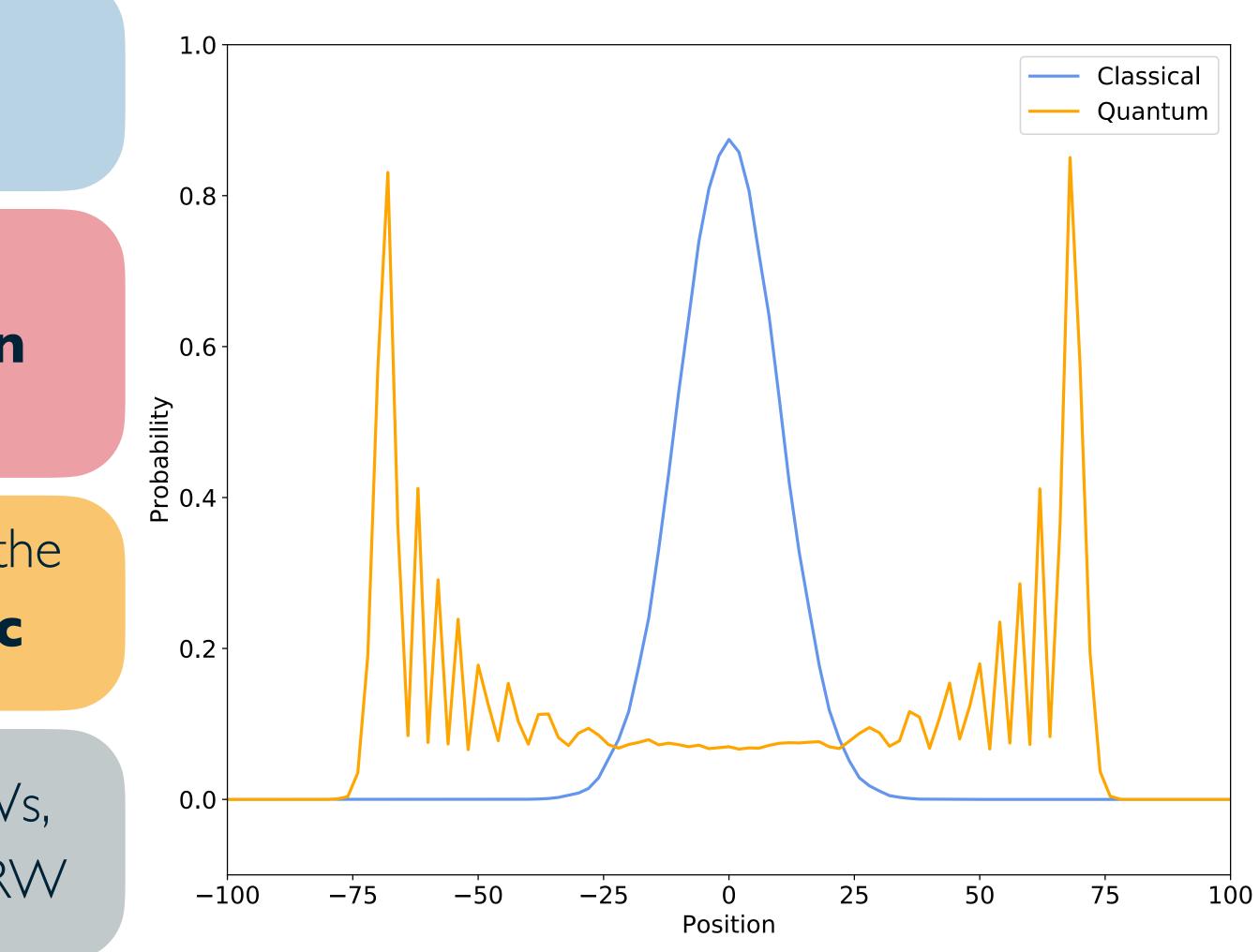
Quantum Walks have long be conjectured to achieved at least quadratic speed up

Szegedy Quantum Walks have been proven to achieve quadratic speed up for Markov Chain **Monte Carlo** 

This has been proven under the condition that the MCMC algorithm is **reversible and ergodic** 

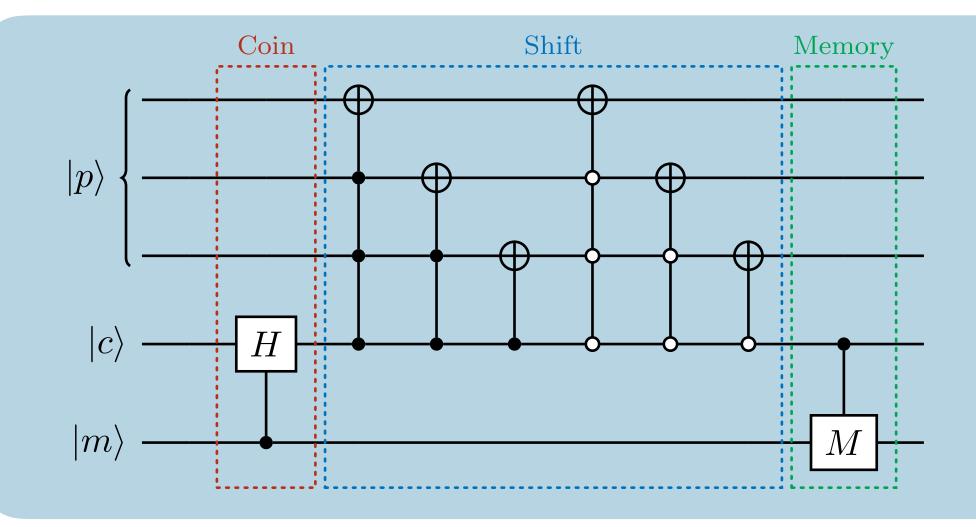
Work is ongoing to prove this is true for all QWs, but latest upper limits are on par with classical RW

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## Quantum Walks with Memory



### **Advantages:**

- Arbitrary dynamics
- Classical dynamics in unitary evolution

### **Disadvantages:**

- Tight conditions on quantum advantage

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### **Qubit model:**

Augment system further by adding an additional memory space

 $\mathcal{H} = \mathcal{H}_P \otimes \mathcal{H}_C \otimes \mathcal{H}_M$ 

#### **Quantum Parton Showers:**

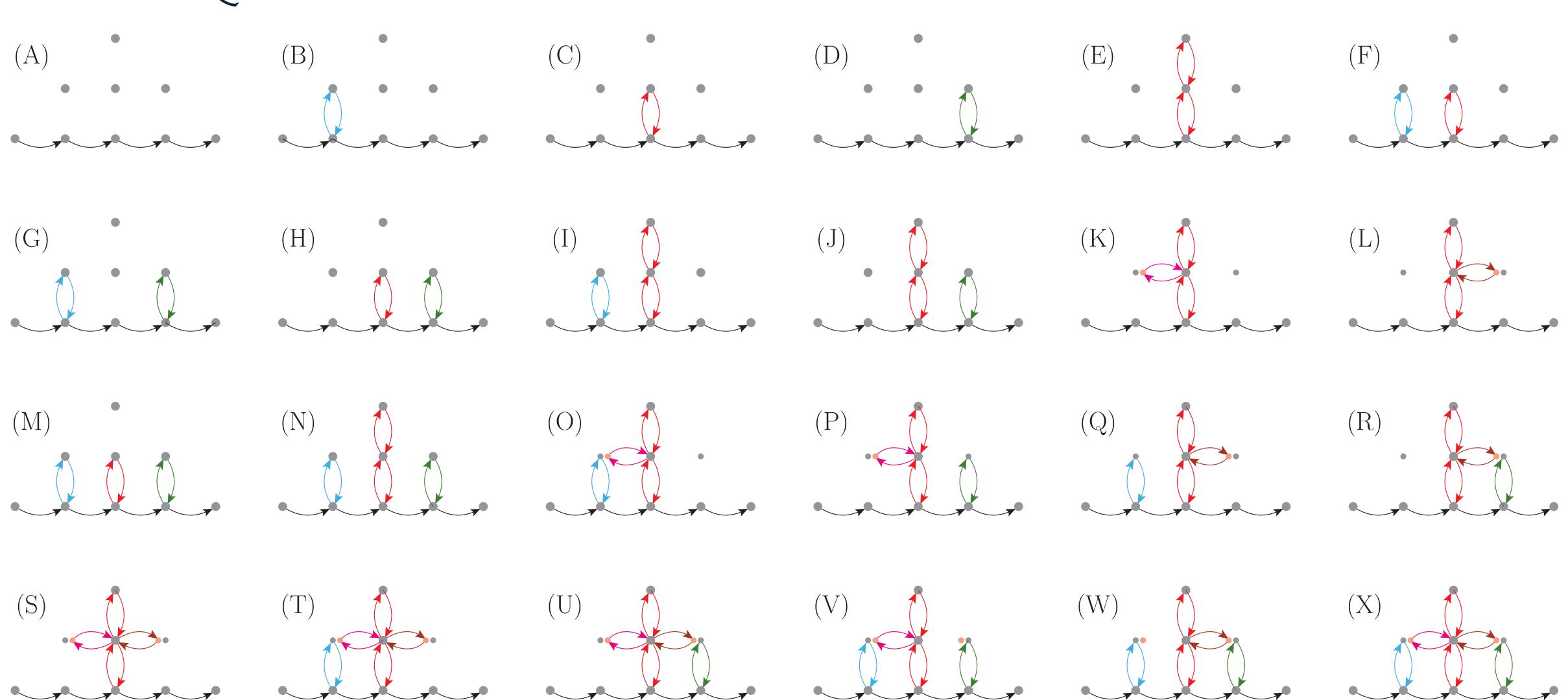
Quantum Walks with memory have proven to be very useful for quantum parton showers.

K. Bepari, S. Malik, M. Spannowsky and SW, Phys. Rev. D 106 (2022) 5,056002





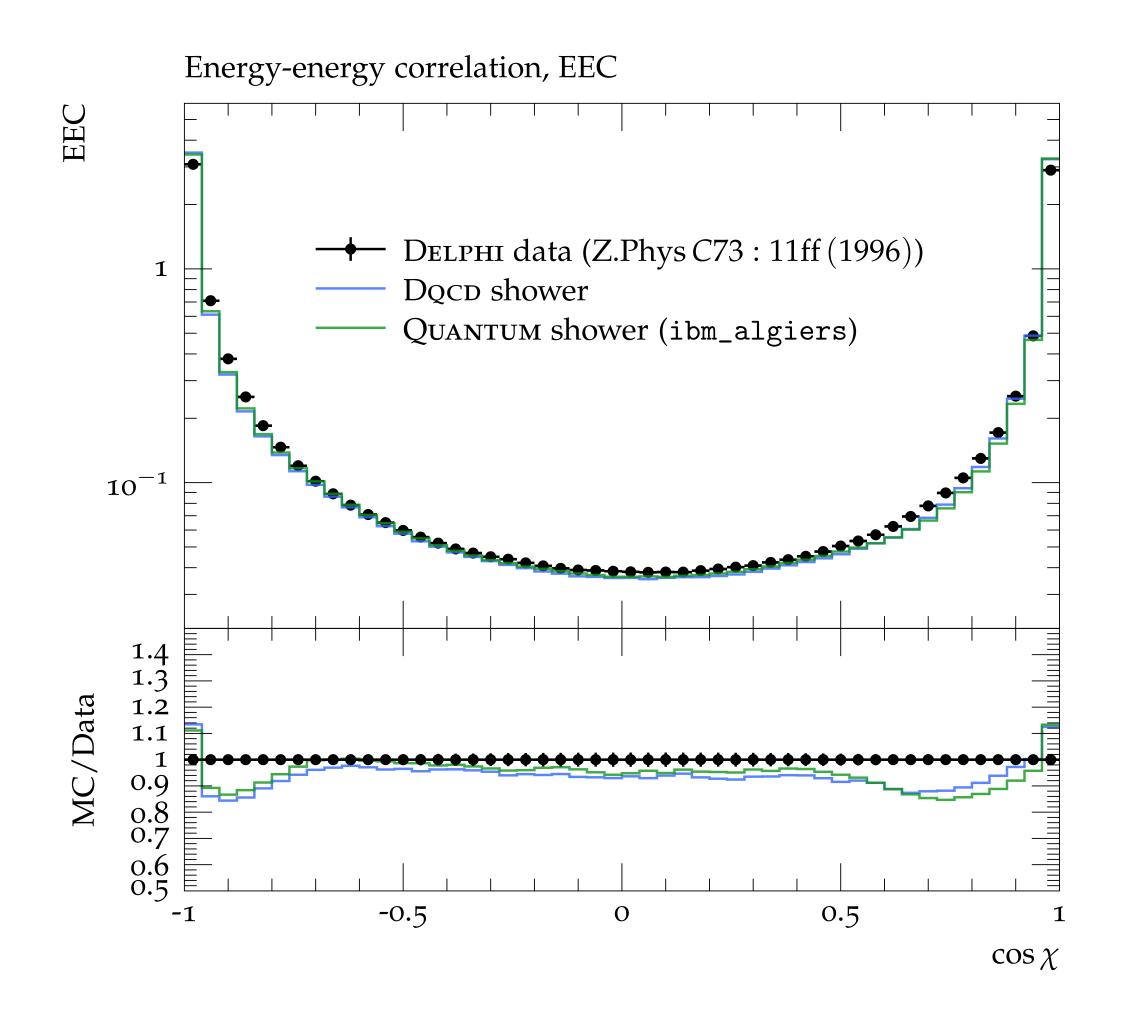
Discrete QCD - Grove Structures



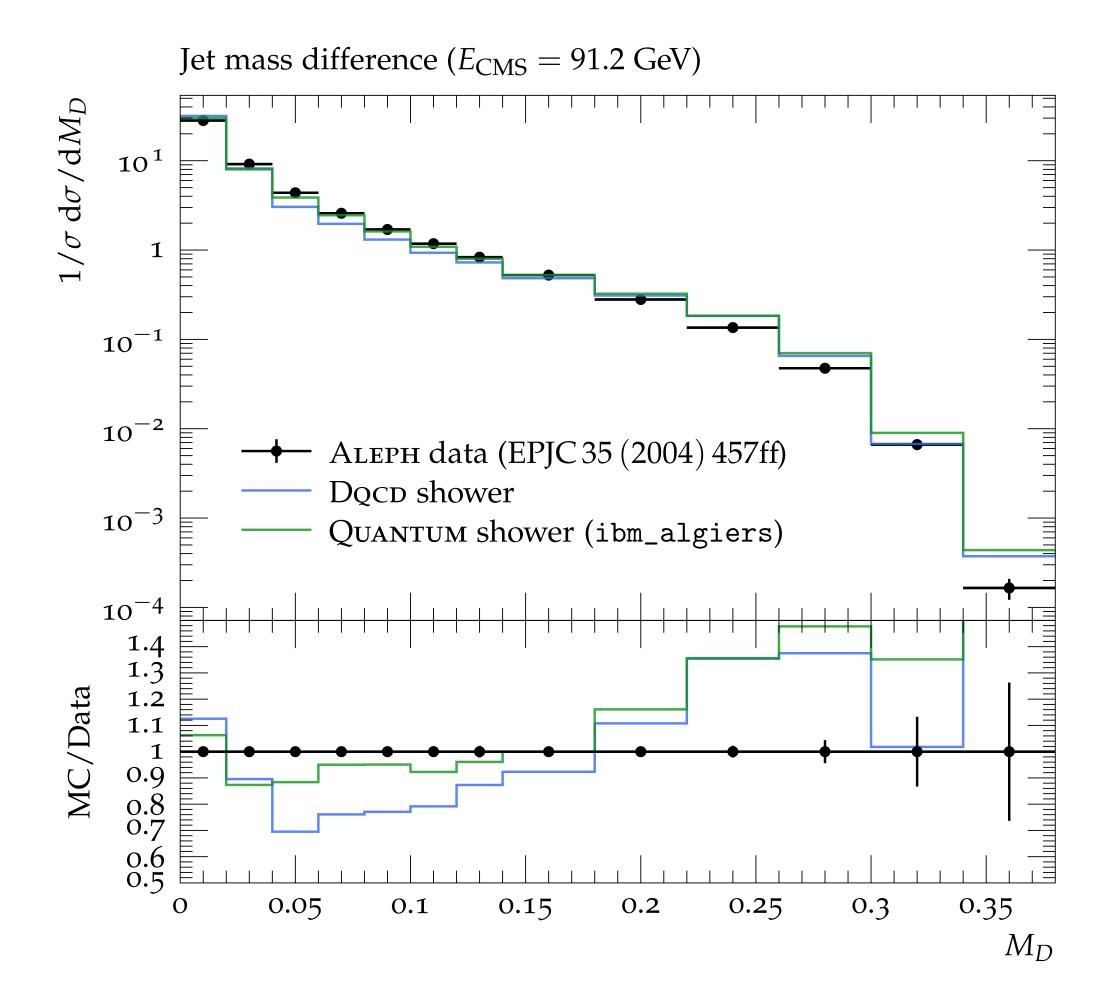
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## Collider Events on a Quantum Computer

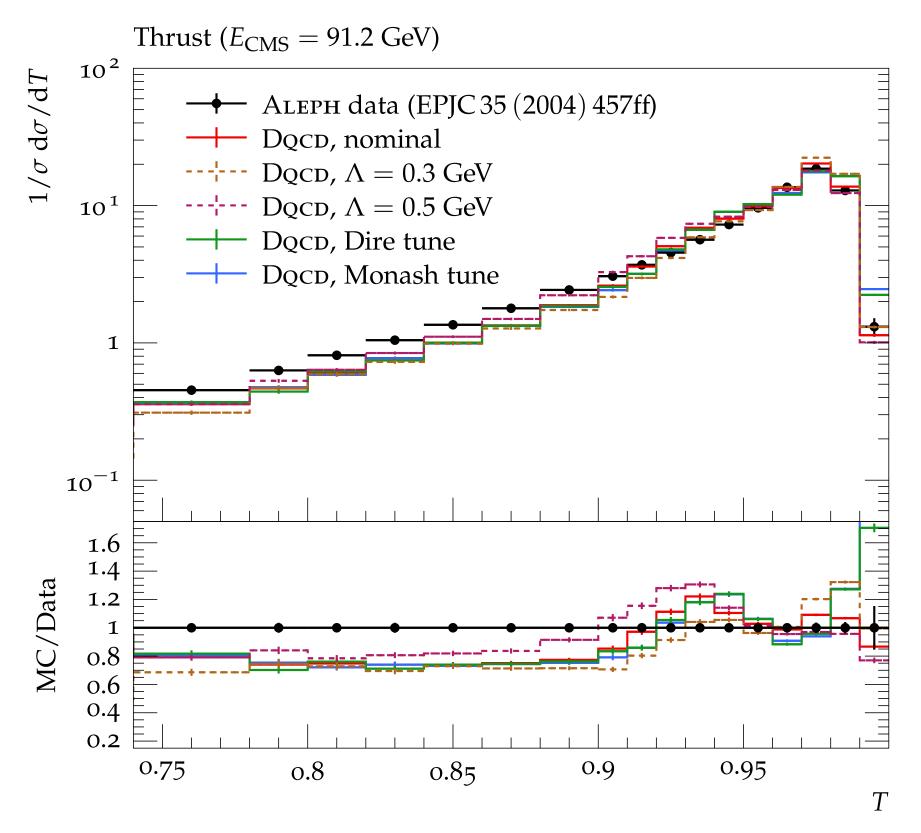


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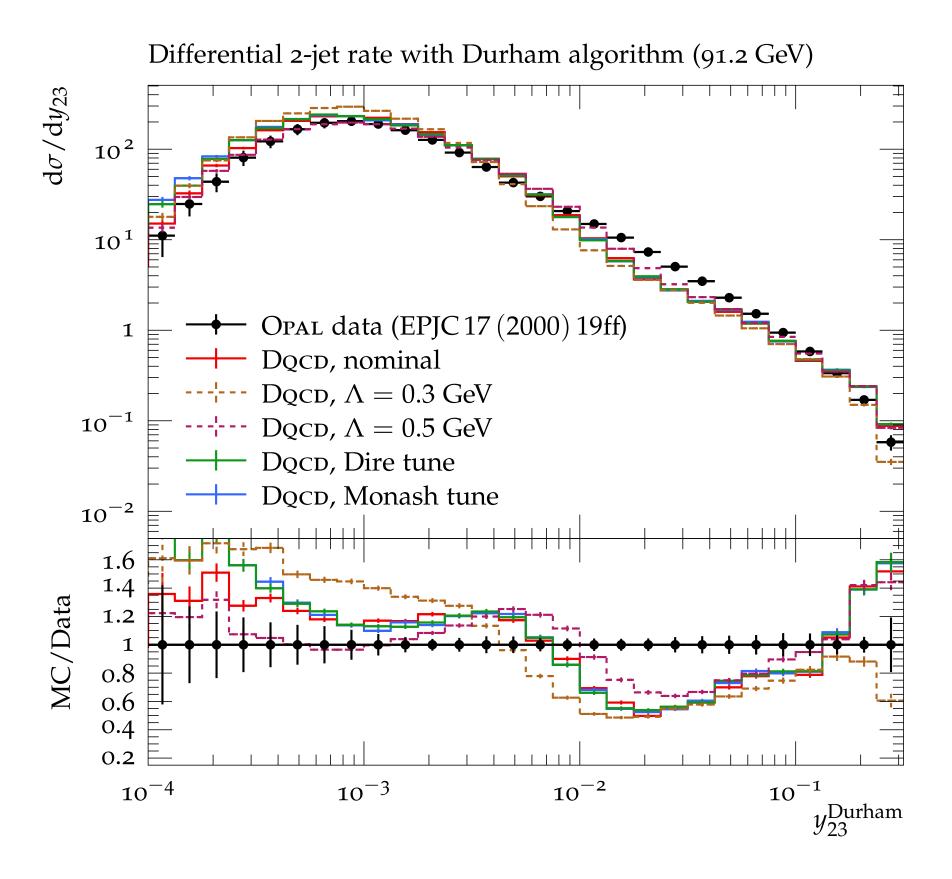




# Collider Events on a Quantum Computer - Varying $\Lambda$



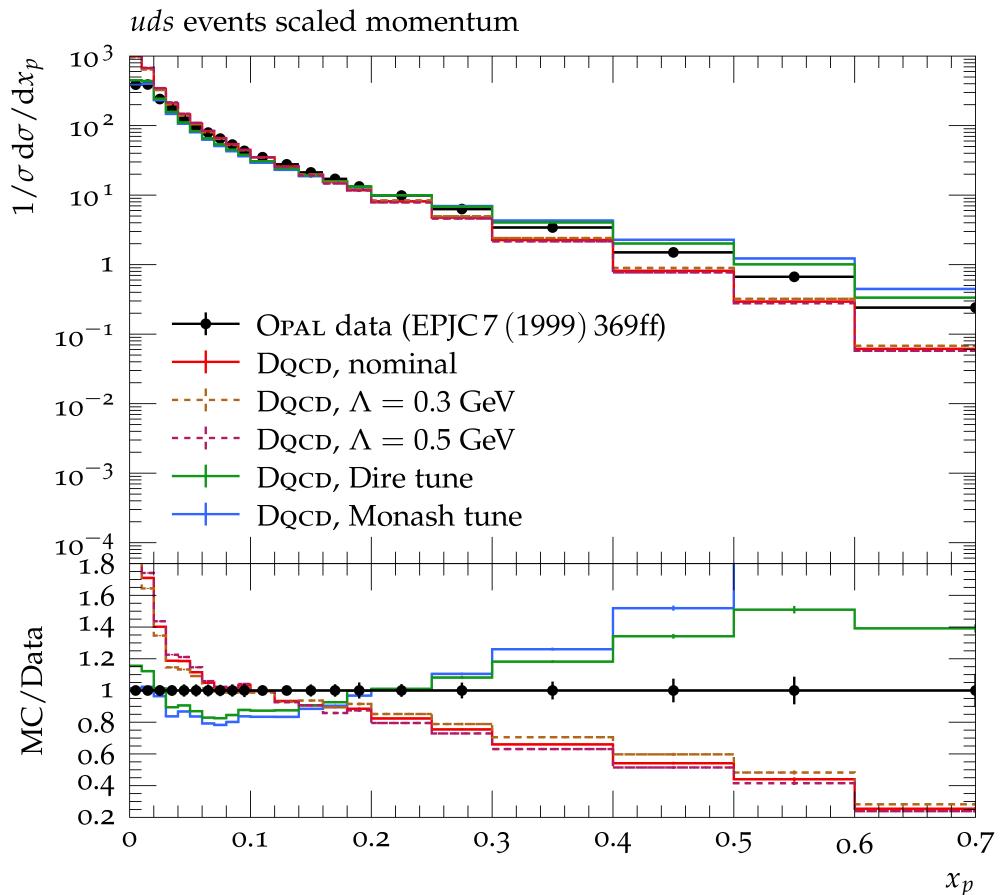
Varying values for the mass scale  $\Lambda$ . This leads to non-negligible uncertainties, however this is expected from a leading logarithm model.



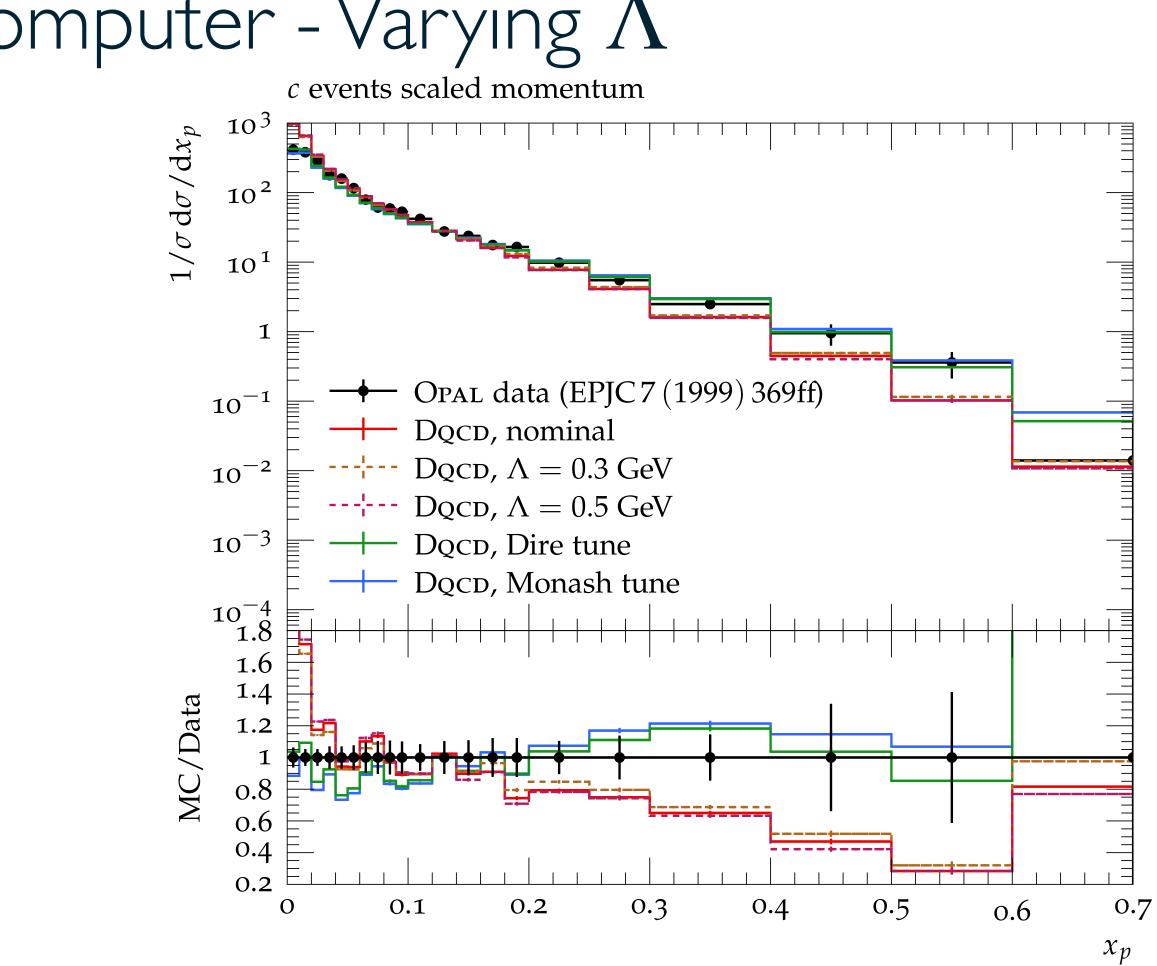




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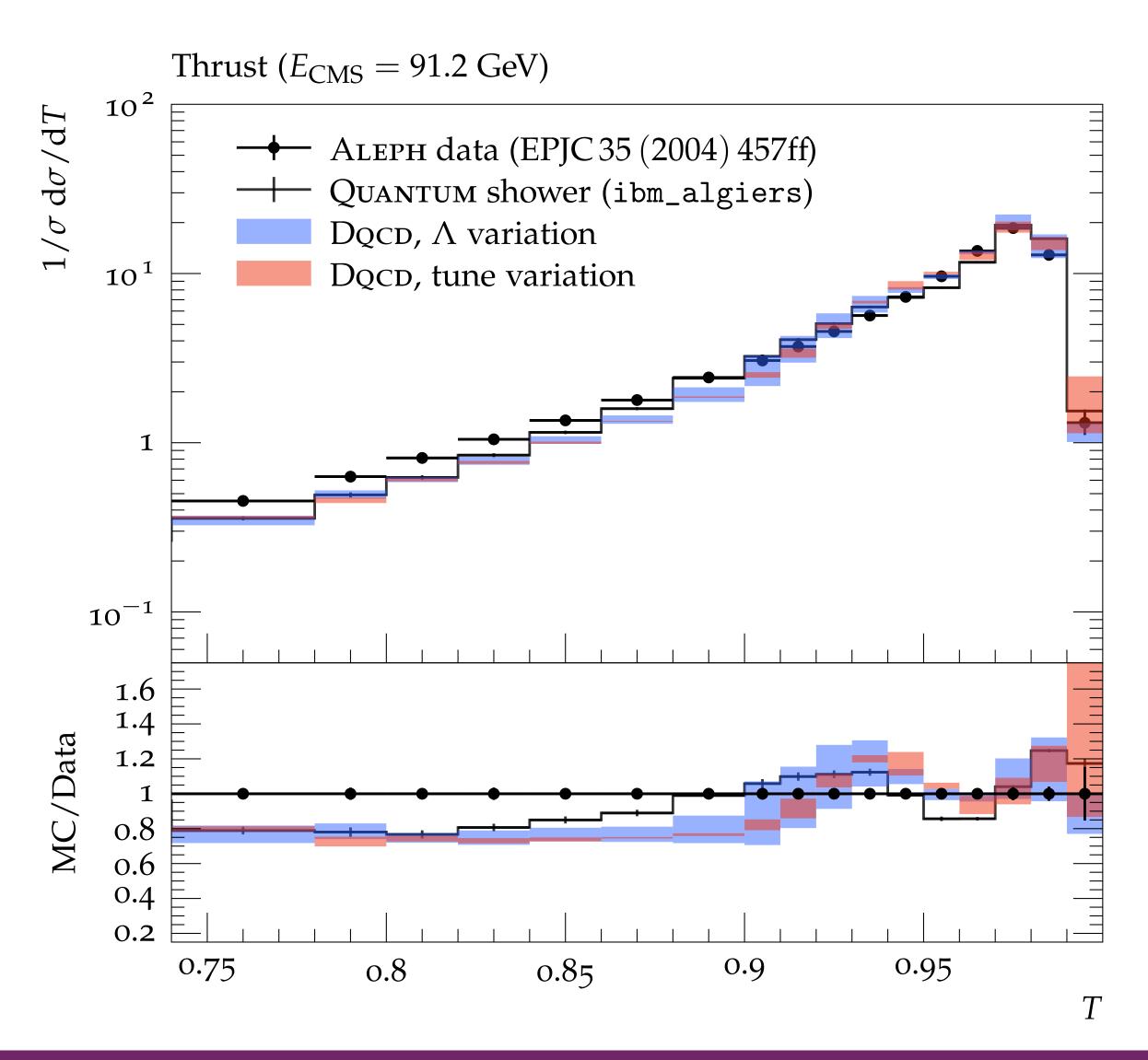
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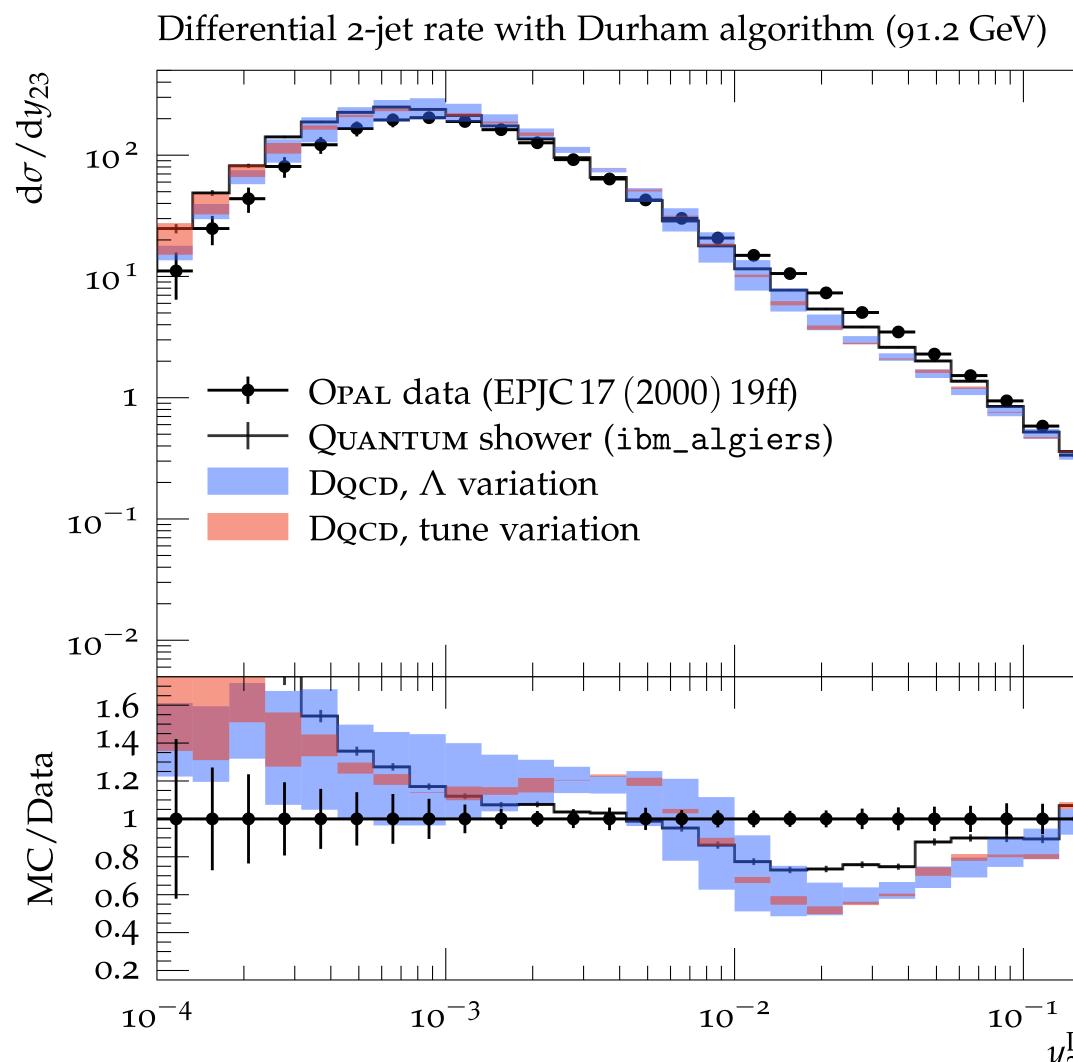


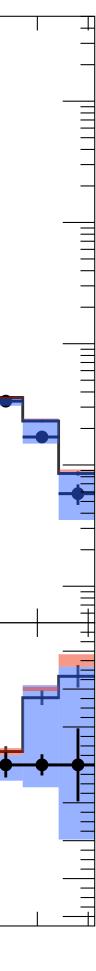


## Collider Events on a Quantum Computer



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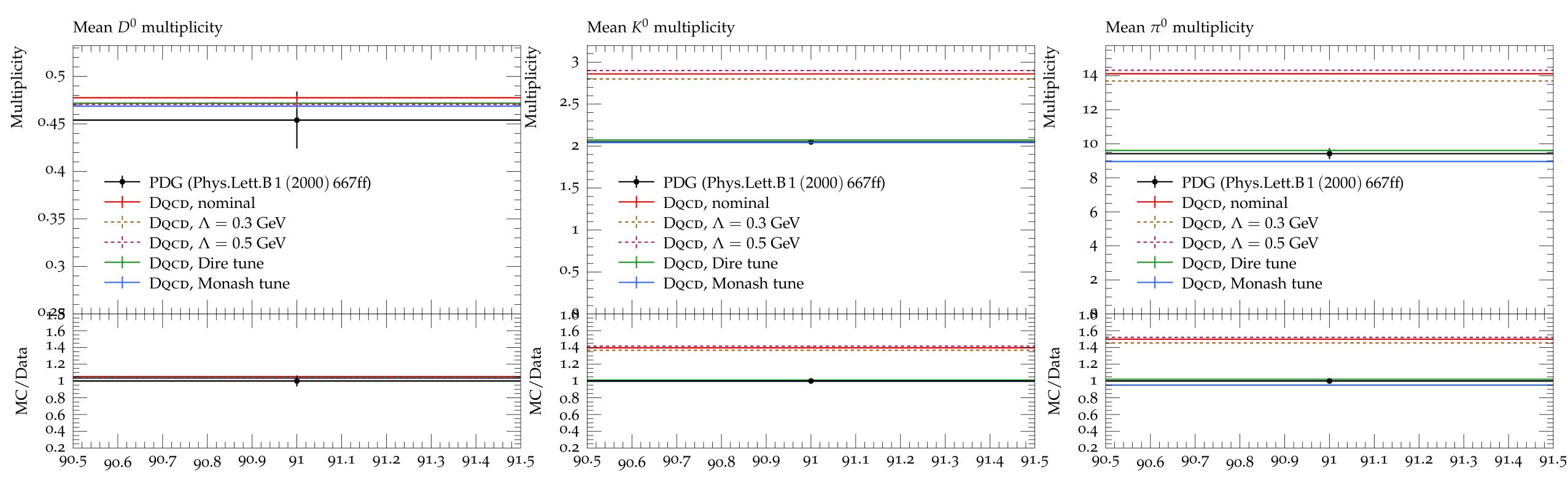








## Collider Events on a Quantum Computer - Changing tune



Observables dominated by non-perturbative dynamics show mild dependence on the mass scale  $\Lambda$ , but are highly sensitive to changes in the tune.



