



# A Quantum walk approach for simulating Parton showers

### KHADEEJAH BEPARI

Institute for Particle Physics Phenomenology

Durham University

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Collaborators: Michael Spannowsky, Simon Williams, Sarah Alam Malik, arXiv: 2109.13975

# Outline

- Brief intro to Quantum Computing (QC)
- intro to Quantum Walk algorithms (QW)
- Parton shower basics
- QW approach to parton showers
- Conclusions

# Introduction to Quantum Computing

• Bit :

- Fundamental component of Classical Computation and Information
- Takes values 0 or 1

#### • Qubit:

- Two possible states  $|0\rangle = \begin{pmatrix} 1 \\ 0 \end{pmatrix}$  and  $|1\rangle = \begin{pmatrix} 0 \\ 1 \end{pmatrix} => |\psi\rangle = \alpha |0\rangle + \beta |1\rangle$
- Specific parameterisation:

• 
$$|\psi\rangle = \cos\left(\frac{\theta}{2}\right)|0\rangle + e^{i\varphi}\sin\left(\frac{\theta}{2}\right)|1\rangle$$

- polarisations of photon, alignment of nuclear spin in magnetic field, two states of electron orbiting single atom
- N qubits 2<sup>N</sup> dim Hilbert space



#### K. Bepari, (Durham University)

# Quantum Gates

#### **Multi-qubit gates** Single-qubit gates **TOFFOLI** gate CNOT gate NOT-gate (Pauli X gate) $= \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}.$ $=\begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix}$ X Hadamard gate Can have universal sets e.g. {CNOT, H, T } $- = \frac{1}{\sqrt{2}} \begin{pmatrix} 1 & 1 \\ 1 & -1 \end{pmatrix}$ H**Solovay-Kitaev Th**. Let G a finite subset of SU(2) and $U \in$ SU(2). If the group generated by G is dense in SU(2), then for any $\varepsilon$ it is possible to S gate approximate U to precision $\varepsilon$ using $O(\log^4(1/\varepsilon))$ gates from G. [Nielson Chuang.] $=\begin{pmatrix} 1 & 0\\ 0 & i \end{pmatrix}$ S



## Intro to QW

#### Quantum walks (QW) are the quantum analog of the classical random walks

• using aspects of QM such as interference and superposition.

#### studied in two forms: Continuous-time (CT) QW and Discrete-Time (DT) QWs.

 various applications and studies e.g. in demonstrating exponential speedup over classical computation for a hitting time problem on a glued tree, quantum algorithms like the element distinctness problem, for like triangle finding etc. and also been employed to understand physical systems from phase transitions to modelling photosynthetic systems
 [Chadrasekhar, Banerjee, Srikanth]

**Continuous-time:** directly encode the walk in the position Hilbert space,  $\mathcal{H}_P$ 

**Discrete-time:** necessary to introduce additional coin Hilbert space to determine direction in which particle evolves in position space. Total Hilbert space given by:  $\mathcal{H} = \mathcal{H}_c \otimes \mathcal{H}_P$ 

## CT QW

- Define CT classical random walk, quantize it introducing quantum amplitudes in place of classical probabilities
- Define CT classical random walk on position space spanned by vertex set V of graph G with edge set E, G=(V,E)
- Step of QW described by adjacency matrix, transform prob distribution over V

$$A_{j,k} = \begin{cases} 1 & (j,k) \in E, \\ 0 & (j,k) \notin E, \end{cases}$$

- For each pair (j,k) that belongs to
- Other important matrix is generator matrix

$$\mathbf{H}_{j,k} = egin{cases} d_j \gamma & j = k \ -\gamma & (j,k) \in E \ 0 & ext{otherwise} \end{cases},$$

- Dj= degree of vertex , gamma is prob of transition between neighboring nodes per unit time
- Transition on graph G defined by solution to differential equation

$$\frac{d}{dt}p_j(t) = -\sum_{k \in V} \mathbf{H}_{j,k} p_k(t).$$

- where rate of change of probability of being at vertex j at time t, pj(t)
- Solution:

$$p(t) = e^{-\mathbf{H}t}p(0).$$

arXiv:1001.5326

## CT QW

- Replace probabilities by quantum amplitudes- |j> spans orthogonal position basis, introduce factor i

$$a_j(t) = \langle j | \psi(t) \rangle$$
 where  $| j \rangle$ 

$$egin{aligned} &irac{d}{dt}a_j(t) = \sum_{k\in V}\mathbf{H}_{j,k}a_k(t).\ &irac{d}{dt}|\psi
angle = \mathbf{H}|\psi
angle. \end{aligned}$$

- CT QW ⇔ Schrodinger eqn
- E.g. CT on line, basis states  $|\psi_j\rangle$ , where  $j \in \mathbb{Z}$ .
- Evolve system via  $U(t) = \exp(-i\mathbf{H}t).$
- Where Hamiltonian=generator matrix which evolves prob distribution given by

$$\mathbf{H}|\psi_{j}\rangle = -\gamma|\psi_{j-1}\rangle + 2\gamma|\psi_{j}\rangle - \gamma|\psi_{j+1}\rangle$$

## DT QW (1D)

- Discrete time QW similar to the classical discrete random walk where the walk takes places on a position space with instruction from a coin operation
- Classsical there is a coin flip, determines direction particles moves in, position shift moves the particle in corresponding direction
- Walk on line: 2 sidied coin head and tails with equal prob determines movement to left or right
- In quantum case: coin flip replaced by quantum coin operation which creates a superposition of directions to which the particle evolves simultaneously
- Followed by unitary shift operation, repeated with large number of steps without intermediate measurements, retaining coherence of wavefunction
- Hilbert space give by

$$\mathcal{H}=\mathcal{H}_c\otimes\mathcal{H}_p,$$

- Consider initial state defined by, particle at origin

$$|\Psi_{in}\rangle = \left(\cos(\delta)|0\rangle + e^{i\eta}\sin(\delta)|1\rangle\right) \otimes |\psi_0\rangle,$$

- A general coin operation belongs U(2) defined by 4 parameters  $B_{\zeta,\alpha,\beta,\gamma} = e^{i\zeta}e^{ilpha\sigma_x}e^{ieta\sigma_y}e^{i\gamma\sigma_z},$
- The shift operation is defined such that if the coin state is in |0> move right and if in |1> Move left i.e.

$$S = |0\rangle\langle 0| \otimes \sum_{j \in \mathbb{Z}} |\psi_{j-1}\rangle\langle\psi_j| + |1\rangle\langle 1| \otimes \sum_{j \in \mathbb{Z}} |\psi_{j+1}\rangle\langle\psi_j|.$$

- Entire operation given by

$$W_{\zeta,\alpha,\beta,\gamma} = S(B_{\zeta,\alpha,\beta,\gamma} \otimes \mathbb{1})$$

## DT QW(1D)-dynamic structure

Starting off with DT classical random walk

- For QW, information in coin state carried throughout making QW reversible. Lets see how this happens Describe wavefunction of state by 2-component vector of amplitudes being at positon j at time t with left
- moving and right moving components i, t-p(j,t)
- With symmetric structure, where  $\Psi(j,t) = \begin{pmatrix} \Psi_L(j,t) \\ \Psi_R(j,t) \end{pmatrix}$ . article at positon j ant time t, prob at next time step given by equal measure from imm\_\_\_\_\_\_
- Some is a classical  $\pi$  in the standards classical  $\pi$  in the standards classical  $\pi$  is the standards classical some  $\pi$  is the standards classical  $\pi$  is the standard is the standard standards classical  $\pi$  is the standard sta diffusion eqn

$$B_{0,\theta,-rac{\pi}{2}} = egin{pmatrix} \cos( heta) & -i\sin( heta) \ -i\sin( heta) & \cos( heta) \end{pmatrix}$$

Writeroversibletion of command conditional shift as

- non-relativistic 
$$\begin{pmatrix} \Psi_L(j,t+1) \\ \Psi_R(j,t+1) \end{pmatrix} = \begin{pmatrix} \cos(\theta)a & -i\sin(\theta)a^{\dagger} \\ -i\sin(\theta)a^{\dagger} & \cos(\theta)a \end{pmatrix} \begin{pmatrix} \Psi_L(j,t) \\ \Psi_R(j,t) \end{pmatrix},$$
 (1)

- Where 
$$a\Psi(j,t) = \Psi(j+1,t),$$
  
 $a^{\dagger}\Psi(j,t) = \Psi(j-1,t).$ 

## A. Decoupled DT QW in Klein Gordon form

Using (1) we can write out the individual LM and RM components at time t+1 as

 $\Psi_L(j,t+1) = \cos(\theta)\Psi_L(j+1,t) - i\sin(\theta)\Psi_R(j-1,t),$  $\Psi_R(j,t+1) = \cos(\theta)\Psi_R(j-1,t) - i\sin(\theta)\Psi_L(j+1,t).$ 

Can decouple  $\Psi_L$  and  $\Psi_R$  components to get

Where

a free spin-0 particle

$$\Psi_R(j,t+1) + \Psi_R(j,t-1) = \cos(\theta) [\Psi_R(j+1,t) + \Psi_R(j-1,t)],$$
  
$$\Psi_L(j,t+1) + \Psi_L(j,t-1) = \cos(\theta) [\Psi_L(j+1,t) + \Psi_L(j-1,t)].$$

- Using the definitions of the difference operator (\*)
- If we subtract  $2\Psi_R(j,t)$  from both sides of (1) we obtain a difference equation corresponding to the differential equation -

$$\begin{bmatrix} \cos(\theta) \frac{\partial^2}{\partial j^2} - \frac{\partial^2}{\partial t^2} \end{bmatrix} \Psi_R(j,t) = 2(1 - \cos(\theta))\Psi_R(j,t), \quad (2)$$
Re-arranging this we see that this corresponds to the Klein-Gordon equation
Where
$$c \equiv \sqrt{\cos(\theta)},$$
So that each component of the DT
QW has the relativistic character of a free spin-0 particle
$$m \equiv \sqrt{\frac{2[\sec(\theta) - 1]}{\cos(\theta)}}. \qquad (1)$$

## B. Decoupled DT QW in Schrodinger form

- KG eqn's can then be transformed into the Schrodinger equation -
- Transform (2)-second order in time-into system of 2 coupled differential equations first order in time using ansatz -

$$-----\Psi_R = \varphi_R + \chi_R \qquad , \qquad i\hbar \frac{\partial \Psi_R}{\partial t} = \sqrt{2[1 - \cos(\theta)]} \ (\varphi_R - \chi_R), ----(3)$$

 $2_{1}$ 

Can show that the following coupled eqns are equivalent to (2) -

$$i\hbar\frac{\partial\varphi_R}{\partial t} = -\frac{\hbar^2}{2\sqrt{\frac{2[\sec(\theta)-1]}{\cos(\theta)}}} \,\Delta(\varphi_R + \chi_R) + \sqrt{2[1-\cos(\theta)]} \,\varphi_R, \tag{4}$$
$$i\hbar\frac{\partial\chi_R}{\partial t} = \frac{\hbar^2}{2\sqrt{\frac{2[\sec(\theta)-1]}{\cos(\theta)}}} \,\Delta(\varphi_R + \chi_R) - \sqrt{2[1-\cos(\theta)]} \,\chi_R, \tag{5}$$

Subtracting (5) from (4), and re-arranging (3) -

$$i\hbar\frac{\partial}{\partial t}(\varphi_R - \chi_R) = -\frac{\hbar^2}{\sqrt{\frac{2[\sec(\theta) - 1]}{\cos(\theta)}}} \ \Delta(\varphi_R + \chi_R) + \sqrt{2[1 - \cos(\theta)]} \ (\varphi_R + \chi_R),$$

$$i\hbar\frac{\partial}{\partial t}\left(\frac{i\hbar}{\sqrt{2[1-\cos(\theta)]}}\frac{\partial\Psi_R}{\partial t}\right) = -\frac{\hbar^2}{\sqrt{\frac{2[\sec(\theta)-1]}{\cos(\theta)}}}\;\Delta\Psi_R + \sqrt{2[1-\cos(\theta)]}\;\Psi_R,$$

$$\frac{1}{\sqrt{2[1-\cos(\theta)]}}\frac{\partial^2 \Psi_R}{\partial t^2} = \frac{1}{\sqrt{\frac{2[\sec(\theta)-1]}{\cos(\theta)}}} \ \Delta \Psi_R - \sqrt{2[1-\cos(\theta)]} \ \Psi_R,$$

$$\frac{1}{\sqrt{2[\sec(\theta)-1]\cos(\theta)}}\frac{\partial^2\Psi_R}{\partial t^2} = \frac{\sqrt{\cos(\theta)}}{\sqrt{2[\sec(\theta)-1]}} \ \Delta\Psi_R - \sqrt{2[\sec(\theta)-1]\cos(\theta)} \ \Psi_R.$$

Thus we get:

$$\left(\frac{1}{\cos(\theta)}\frac{\partial^2}{\partial t^2} - \Delta\right) \Psi_R = -2[\sec(\theta) - 1] \Psi_R.$$

## B. Decoupled DT QW in Schrodinger form

- So looking at (4) and (5) they can be combined by introducing the column vector

And using the 4 2x2 matrices

$$\sigma_1 = \begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix}, \qquad \sigma_2 = \begin{pmatrix} 0 & -i \\ i & 0 \end{pmatrix}, \qquad \sigma_3 = \begin{pmatrix} 1 & 0 \\ 0 & -1 \end{pmatrix}, \qquad \mathbbm{1} = \begin{pmatrix} 1 & 0 \\ 0 & 1 \end{pmatrix},$$

- with algebraic relations  $\sigma_k^2 = \mathbb{1}$  ,  $\sigma_k \sigma_l = \sigma_l \sigma_k = i \sigma_m$  , k, l, m = 1, 2, 3 - in a cycle.

- We can form the schrodinger-type equation

$$\left(i\hbar\frac{\partial}{\partial t}-\hat{\mathbf{H}}_{\mathbf{R}}\right)\Psi_{R}=0,$$

- Where

$$\hat{\mathbf{H}}_{\mathbf{R}} = (\sigma_3 + i\sigma_2) \frac{\hat{P}^2 \sqrt{\cos(\theta)}}{2\sqrt{2[\sec(\theta) - 1]}} + \sigma_3 \sqrt{2[1 - \cos(\theta)]}.$$

- And  $\hat{P} = i\hbar \nabla$
- And we can obtain a similar eqn for  $\Psi_L$
- We have found that each component of DT QW has a structure similar to KG eqn which can also be written as coupled schrodinger eqn
- So a DT QW can be described as a coupled form of the CT QW driven by 2 Hamiltonians  $\widehat{H}_L$  and  $\widehat{H}_R$

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### arXiv:quant-ph/0303081

- Both discrete and continuous QWs have natural implementations within quantum computers
- A very well studied type of DT QW implemented on a quantum computer is the Hadamard walk coin operation is given by the hadamard gate
- Again the coin space is defined in this 1D walk by the computational basis of a qubit i.e. |0> and |1>

 $\uparrow$ 

- Whilst position states defined by integers

So what + how?

- If we start with initial state  $|\uparrow\rangle\otimes|0
  angle$
- a single step first applies the coin operator and then applies a shift

$$\begin{array}{ccc} \otimes |0\rangle & \xrightarrow{H} & \frac{1}{\sqrt{2}}(|0\rangle + |1\rangle) \otimes |0\rangle \\ & \xrightarrow{S} & \frac{1}{\sqrt{2}}(|\uparrow\rangle \otimes |1\rangle + |\downarrow\rangle \otimes |-1\rangle). \end{array}$$

- Measuring in the standard coin basis gives with probability ½

$$\{|\uparrow\rangle\otimes|1\rangle,|\downarrow\rangle\otimes|-1\rangle\}$$

- If we continued by measuring after each iteration we would get the classical random walk on the line where the limiting distribution approaches a gaussian distribution with mean zero and variance

$T^{i}$	-5	-4	-3	-2	-1	0	1	2	3	4	5
0						1					
1					$\frac{1}{2}$		$\frac{1}{2}$				
2				$\frac{1}{4}$		$\frac{1}{2}$		$\frac{1}{4}$			
3			$\frac{1}{8}$		$\frac{3}{8}$		<u>3</u> 8		$\frac{1}{8}$		
4		$\frac{1}{16}$		$\frac{1}{4}$		$\frac{3}{8}$		$\frac{1}{4}$		$\frac{1}{16}$	
5	$\frac{1}{20}$		$\frac{5}{20}$		$\frac{5}{10}$		$\frac{5}{10}$		5		$\frac{1}{20}$





- In the QW i.e. without measurement the interference will cause a radically different behavior of the QW
- Just by considering the initial state after 3 steps we get, asymmetry with respect to different positons

$$|\Phi_{in}\rangle \xrightarrow{U} \frac{1}{\sqrt{2}} (|\uparrow\rangle \otimes |1\rangle - |\downarrow\rangle \otimes |-1\rangle)$$

$$\xrightarrow{U} \frac{1}{2} (|\uparrow\rangle \otimes |2\rangle - (|\uparrow\rangle - |\downarrow\rangle) \otimes |0\rangle + |\downarrow\rangle \otimes |-2\rangle)$$

$$\xrightarrow{U} \frac{1}{2\sqrt{2}} (|\uparrow\rangle \otimes |3\rangle + |\downarrow\rangle \otimes |1\rangle + |\uparrow\rangle \otimes |-1\rangle$$

$$-2|\downarrow\rangle \otimes |-1\rangle - |\downarrow\rangle \otimes |-3\rangle). (16)$$



- Staring with a symmetric initial state i.e. superposition of coin states, the hadamard walk after 100 steps results in the following distribution
- This has a variance of which gives an expected distance from the original of ~ the QW propagates quadratic ally faster
- Another example where there is speed up in QWs is in **expected hitting time** in graphs, i.e. the time it takes for a random walk to reach a point T on a graph from point S.
- a graph Gn of to n-level binary trees glued together at their leaves for example G4
- For classical case it was found that the prob of reaching column 2n in polynomial time in n was exponentially small in n
- Whilst implementing the walk as CT QW with 2n+1 vertices it was found that speed of propagation on infinite line was linear in time T



# Parton Shower Quantum Algorithm?



- Markov chain algorithm->Random walk?
- Previous Quantum algorithms for parton showers: arXiv:1904.03196v2

- Monte Carlo event generators are used to simulate high energy collisions at the LHC
- simulation is split into several stages.
  - hard-scattering of incoming partons stemming from colliding protons
  - Producing highly energetic states which then decay.
- Going to lower energetic scales, the incoming hadrons as well as the outgoing particles radiate lighter particles, like gluons and photons
- they are able to radiate further, producing a cascade of particles which realised through the parton shower algorithm
- Evolve down energy scales leading to hadronization

#### K. Bepari, (Durham University)

## Parton Shower-Outline

- We consider a discrete, collinear toy QCD model comprising one gluon and one quark flavour
- Only consider collinear splittings, not keeping track of kinematics which means can also be encoded in available qubit-restricted quantum computers



## Parton Shower - outline

Sudakov factors are used to determine whether an emission occurs

 $\Delta_{i,k}(z_i, z_k) = exp\left[-\alpha_s^2 \int_{z_1}^{z_2} P_{k'}(z')dz'\right], \qquad \Delta_{tot}(z_1, z_2) = \Delta_g^{n_g}(z_1, z_2)\Delta_q^{n_q}(z_1, z_2)\Delta_{\bar{q}}^{n_{\bar{q}}}(z_1, z_2),$ 

• The overall splitting probability is given by the Sudakovs, and the splitting functions such that

$$Prob_{k \to ij} = (1 - \Delta_k) \times P_{k \to ij}(z)$$

• Shower evolution is determined by exponentially decreasing the evolution variable z with number of steps

- consider an initial simple model with a single particle type,  $\phi$
- probability of emission in the QW formalism is encoded within the coin operation given by

$$C = \begin{pmatrix} \sqrt{1 - P_{jk}} & -\sqrt{P_{jk}} \\ \sqrt{P_{jk}} & \sqrt{1 - P_{jk}} \end{pmatrix}$$

- define the position Hilbert space where basis states given by number of phi particle,  $|n_{\phi}\rangle$
- Where  $n_{\phi} \in \mathbb{Z}^*$







- Now we consider a 2 dimensional model considering simulation of both quarks and gluons
- enlarge the coin Hilbert space to encode 3 types of splitting probabilities given by

 $P_{ij} = (1 - \Delta_k) \times P_{k \to ij}(z)$ 

• S operator now updates either the gluon number or quark number on each respective axis conditioned on the states of the coin space





- algorithm was implemented on IBM Q Quantum Simulator, using 16 qubits simulating 31 shower steps
- The algorithm scales as  $2log_2(N + 1) + 4$
- By reframing the parton shower in the quantum walk framework greatly increases number of shower steps possible to simulate in comparison to previous quantum algorithms, whilst also using less volume



- Probability distribution of the number of gluons measured at the end of the 31-step parton shower for the classical and quantum algorithms
- zero quark anti-quark pairs (left) and exactly one quark anti-quark pair (right)
- run on the IBMQ 32-qubit quantum simulator for 500,000 shots, and the classical algorithm has been run for 10<sup>6</sup> shots.

# Summary

Presented a dedicated quantum algorithm for the simulation of parton shower in high energy collisions

- Demonstrated the ability to calculate shower histories of parton shower in full superposition
- Found that reframing parton shower in as a quantum walk algorithm provides a more natural and efficient approach to simulating parton showers

#### In the future:

• Would like to introduce kinematics which will vastly increase realism of the quantum algorithm. Algorithm presented here can be seen as a first step towards a full and realistic quantum simulation of a high energy collision process.