









#### Menu

#### Outline:

- permanents in linear optics
- computational complexity
- boson sampling as intermediate model for quantum computation





### Permanents in linear optics

lossless beam splitter transformation for photonic amplitude operators:

$$\hat{\mathbf{b}} = \mathsf{T}\hat{\mathbf{a}} = \hat{U}^\dagger \hat{\mathbf{a}} \hat{U} \,, \quad \hat{U} = \exp\left[-i\hat{\mathbf{a}}^\dagger \mathbf{\Phi} \hat{\mathbf{a}} \right] \,, \quad \mathsf{T} = \exp\left[-i\mathbf{\Phi}\right]$$

- equivalent to discrete-time Heisenberg equation of motion
- transform quantum states by discrete-time Schrödinger equation using inverse transformation  $\hat{\varrho}'=\hat{U}\,\hat{\varrho}\,\hat{U}^\dagger$

$$\langle \dot{\hat{O}} \rangle = \mathsf{Tr}[\hat{\varrho} \dot{\hat{\mathcal{O}}}] = \mathsf{Tr}[\hat{\varrho} \underbrace{\hat{\mathcal{U}}^\dagger \hat{O} \hat{\mathcal{U}}}_{\mathsf{Heisenberg}}] = \mathsf{Tr}[\underbrace{\hat{\mathcal{U}} \hat{\varrho} \hat{\mathcal{U}}^\dagger}_{\mathsf{Schrödinger}} \hat{O}] = \mathsf{Tr}[\dot{\hat{\varrho}} \hat{O}]$$





### Permanents in linear optics

transformation matrix  $T \in SU(2)$ , but  $\hat{U}$  in general is not:

- *n*-photon Fock space is *symmetric* tensor product of single-photon spaces
- quantum-state transformation  $\hat{\varrho}' = \hat{U}\hat{\varrho}\hat{U}^{\dagger}$  according to a subgroup of SU(2*n*)

example: matrix representation of  $\hat{U}$  in basis  $\{|0,0\rangle,|1,0\rangle,|0,1\rangle,|2,0\rangle,|1,1\rangle,|0,2\rangle\}$ 

$$\mathbf{U} = \begin{pmatrix} 1 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & T & -R^* & 0 & 0 & 0 & 0 \\ 0 & R & T^* & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & T^2 & \sqrt{2}T^*R^* & R^{*2} \\ 0 & 0 & 0 & \sqrt{2}TR & (|T|^2 - |R|^2) & -\sqrt{2}T^*R^* \\ 0 & 0 & 0 & R^2 & -\sqrt{2}TR & T^{*2} \end{pmatrix} = \bigoplus_{n=0}^{\infty} \mathbf{U}_n$$

- U is block-diagonal with respect to Fock layers of total photon numbers (0, 1, 2)
- U has direct product structure





### Permanents in linear optics

matrix transforming quantum states acts on symmetric subspace  $\Rightarrow$  can be constructed from permanents of transmission matrix  ${\bf T}$ 

define set of all non-decreasing integer sequences  $\omega$  as

$$G_{n,N} = \{ \boldsymbol{\omega} : 1 \leq \omega_1 \leq \ldots \leq \omega_n \leq N \}$$

matrix elements of  $\hat{U}$  in the Fock basis are matrix permanents

$$\langle m_1,\ldots,m_N|\hat{U}|n_1,\ldots,n_N
angle = \left(\prod_i n_i!
ight)^{-1/2} \left(\prod_j m_j!
ight)^{-1/2} \mathsf{per}\,\mathsf{T}[\Omega'|\Omega]$$

$$\Omega = (1^{n_1}, 2^{n_2}, \dots, N^{n_N}), \Omega' = (1^{m_1}, 2^{m_2}, \dots, N^{m_N})$$

 $T[\Omega'|\Omega]$ :  $N \times N$ -matrix with elements from T with row and column indices  $\Omega'$ ,  $\Omega$ 

S. Scheel, quant-ph/0406127; S. Scheel and S.Y. Buhmann, Acta Phys. Slovaca 58, 675-810 (2008).





#### Permanents in linear optics

unitary transformation of N-mode Fock state with total n photons

$$|\hat{U}|n_1,\ldots,n_N
angle = \left(\prod_i n_i!\right)^{-1/2} \sum_{\omega \in G_{m{n},m{N}}} rac{1}{\mu(\omega)} \operatorname{per} \mathsf{T}[\omega|\Omega]|m_1(\omega),\ldots,m_N(\omega)
angle$$

 $m_i(\omega)$ : multiplicities of occurrence of index i in non-increasing integer sequence  $\omega$ 

$$\mu(\boldsymbol{\omega}) = \prod_{i} m_{i}(\boldsymbol{\omega})!$$

per 
$$T = \sum_{\sigma \in S_n} \prod_{i=1}^n T_{i\sigma_i}$$
 matrix permanent of  $T$ ,  $S_n$ : (symmetric) group of permutations

immediate consequence: per T =  $\langle 1, 1, ..., 1 | U | 1, 1, ..., 1 \rangle$ e.g.  $\langle 1, 1 | \hat{U} | 1, 1 \rangle$  = per T =  $T_{11}T_{22} + T_{12}T_{21} = |T|^2 - |R|^2$ 

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e.g. 
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## Complexity of computing matrix permanents

What is a permanent anyway, and why is it so special?

matrix determinant: 
$$\det \mathbf{M} = \sum_{\sigma \in \mathcal{S}_n} (-1)^{\chi(\sigma)} \prod_i^n M_{i\sigma_i}$$

- has its roots in linear algebra
- volume of parallelepiped spanned by the column vectors of M
- only defined for square matrices
- similarity (principal axes) transformation → diagonal form
- computational demand:  $\mathcal{O}(n^3)$  for LU/QR/Cholesky decomposition





## Complexity of computing matrix permanents

What is a permanent anyway, and why is it so special?

matrix permanent: 
$$\det \mathbf{M} = \sum\limits_{\sigma \in \mathcal{S}_{\pmb{n}}} \prod\limits_{i}^{\pmb{n}} M_{i\sigma_{\pmb{i}}}$$

- has its roots in combinatorics and graph theory
- # permutations with restricted positions, weights of perfect matchings of a graph
- also defined for rectangular matrices
- only invariant under permutations
- computational demand:  $\mathcal{O}(n2^n)$  for exact computation





## Complexity of computing matrix permanents

#### Theorem (Valiant)

The complexity of computing the permanent of  $n \times n(0,1)$ -matrices is NP-hard and, in fact, of at least as great difficulty (to within a polynomial factor) as that of counting the number of accepting computations of any nondeterministic polynomial time Turing machine.

#### consequences:

- computing permanents is really hard (#P-complete, i.e. not possible in polynomial time)
- designing linear-optical networks for a specific task requires computing the permanent of the network ⇒ designing LOQC is itself hard

L.G. Valiant, Theor. Comp. Science 8, 189 (1979).





## Complexity of computing matrix permanents

#### approximations to permanents:

- Jerrum, Sinclair, and Vigoda: matrix elements nonnegative: approximations to per M
  can be made in probabilistic polynomial time
- matrix elements complex: even approximating per M to within a constant factor is #P-complete!

M. Jerrum, A. Sinclair, and E. Vigoda, J. ACM 51, 671 (2010).





## Boson sampling model

Extended Church–Turing Thesis: all computational problems that are efficiently solvable by realistic physical device, are solvable by a probabilistic Turing machine.

Shor: Predicting the (probabilistic) results of a given quantum-mechanical experiment, to finite accuracy, cannot be done by a classical computer in probabilistic polynomial time, unless factoring integers can as well.

Shor's argument is only valid if factoring is classically hard (not known)!

Does one need a fully fledged universal quantum computer to disprove Extended Church-Turing Thesis? Aaronson and Arkhipov: no, linear optics is enough!





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### Boson sampling model



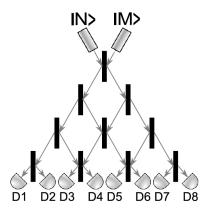
- Galton board: 'computer' to generate samples from a binomial distribution
- uses classical particles
- input: exact arrangement A of pegs
- 'output': number of balls that have landed in each bin (sample from the joint distribution D<sub>A</sub> over these numbers)

S. Aaronson and A. Arkhipov, The computational complexity of linear optics, Theory of Computing 9, 143-252 (2013).





### Boson sampling model



- 'quantum quincunx' (boson sampler):
   'computer' to generate samples from a distribution involving permanents
- uses photons
- 'input': beam splitter array T
- 'output': distribution of photon numbers across the bins





## Boson sampling model

#### Theorem (Aaronson and Arkhipov)

The exact boson sampling problem is not efficiently solvable by a classical computer, unless  $P^{\#P} = BPP^{NP}$  and the polynomial hierarchy collapses to the third level.

further: even approximating the probability of some particular basis state when a boson computer is measured to within a multiplicative constant is a #P-hard problem.

- ⇒ sampling from a permanent distribution is hard
- ⇒ although boson sampling does not constitute universal quantum computing, it represents an intermediate computational model that shows quantum supremacy

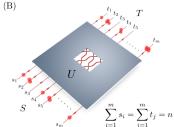
experimental realization ⇒ see next lecture!





#### Boson sampling model





world record (as of 2016): computation of permanent of a (48  $\times$  48)-matrix on then world's fastest supercomputer Tianhe-2 in  $\approx$ 4500s

J. Wu et al., arXiv:1606.05836.





## Take-home messages

- probability distribution of obtaining certain combination of photon number patterns at the output of a linear optical network is given by matrix permanents
- permanents are matrix invariants associated with symmetric tensor products of Hilbert spaces
- permanents naturally occur in combinatorics and graph theory in counting problems, not in linear algebra
- computing permanents is computationally hard
- linear-optical networks (boson sampling) provide intermediate computational model for quantum computing without being universal
- experimentally realizable (in contrast to a universal quantum computer)