

Quantum computation and Shor's factoring algorithm

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- We focus on second question: quantum algorithms

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- **Efficient** if $|C_n| \leq poly(n)$

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- reading the output bit \longrightarrow measuring final state

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 2. **Measurement** gives $|x\rangle$ with probability $|\alpha_x|^2$

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- 2-qubit controlled-NOT: $C = \begin{pmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 1 \\ 0 & 0 & 1 & 0 \end{pmatrix}$

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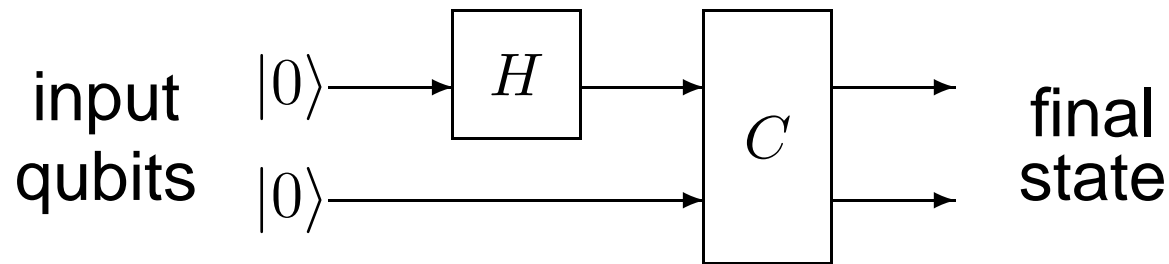
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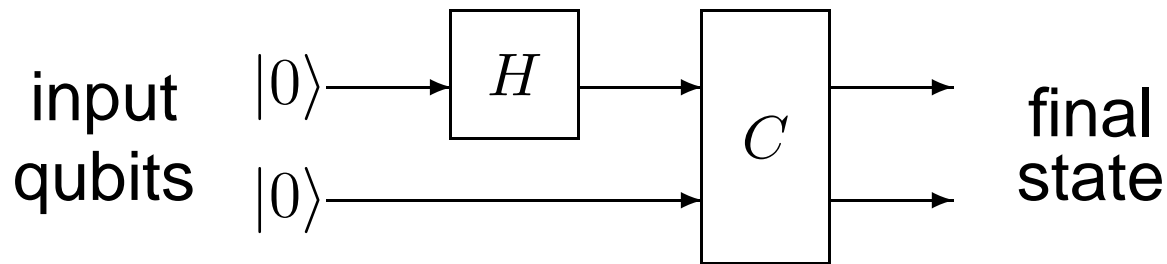
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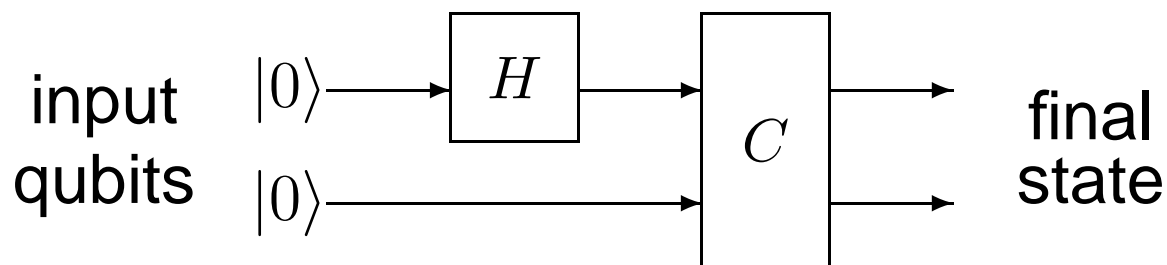
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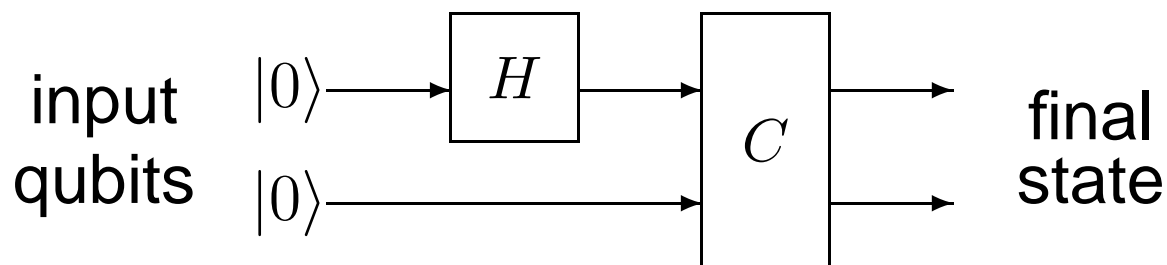
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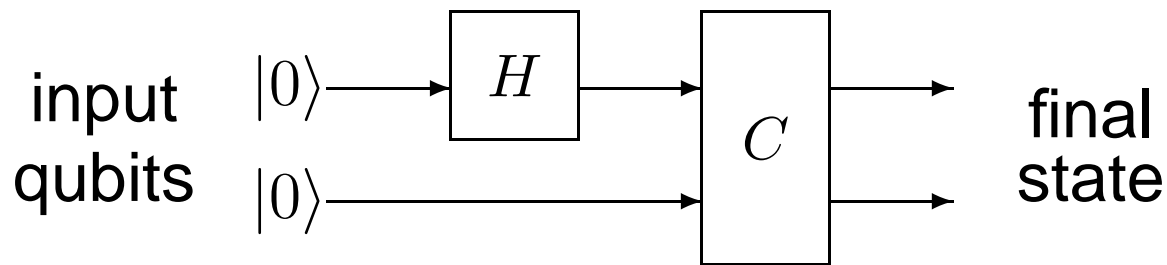
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- Efficient quantum computation: polynomial family

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- **More tricks needed for successful quantum computation**

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- This factor of N can be extracted using gcd-algorithm

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5. Measure 1st register and computer r

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- **Fourier basis** for space with dimension q :

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- For our q , we choose the power of 2 in $(N^2, 2N^2]$

Easy case: $r \mid q$

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$$|s\rangle, |r + s\rangle, |2r + s\rangle, \dots, |q - r + s\rangle$$

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Only the b that are multiples of $\frac{q}{r}$ have non-zero amplitude!

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- Since we can find r , we can factor!

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- **Jones polynomial** (Aharonov et al.)

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