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## A Hitchhiker's Guide to the Quantum World

# DON'T PANIC

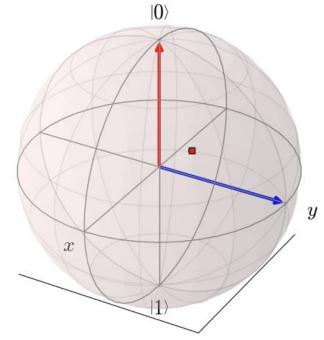
#### Introduction to Qubits

A qubit is a two-dimensional quantum-mechanical system that is in a state

$$|\phi\rangle = \alpha|0\rangle + \beta|1\rangle = \begin{pmatrix} \alpha \\ \beta \end{pmatrix}$$

with 
$$|0\rangle = (0,1)^{\mathsf{T}}$$
 and  $|1\rangle = (1,0)^{\mathsf{T}}$ 

Measuring the qubit leads to the classical bit 0 with probability  $|\alpha|^2$ , 1 with probability  $|\beta|^2$ 



#### Superposition and Entanglement

Two quantum mechanical effects that can outperform classical algorithms are:

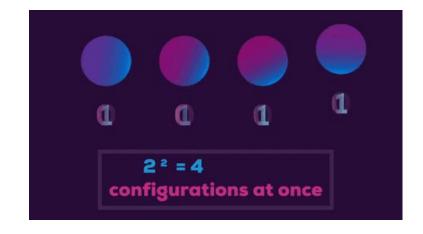
#### superposition and entanglement

each qubit is in both states simultaneously (before measurement)

type of correlation between two or more qubits

#### Why may a quantum computer be faster?

- Quantum computers allows more efficient algorithms
  - → massive parallelism
- Until now: Speed-up "proven" by complexity theory, not by real-life experience



#### Comparing complexities

#### Quantum Algorithm Zoo

- Reliable: National Institute of Standards & Technology (NIST), USA
- Up-to-date: Updated since 2011
- (Relatively) structured: Best classical algorithm vs. best quantum algorithm

https://math.nist.gov/quantum/zoo/

#### Quantum Algorithm Zoo

This is a comprehensive catalog of quantum algorithms. If you notice any errors or omissions, please email me at stephen.jordan@microsoft.com. Your help is appreciated and will be <a href="acknowledged">acknowledged</a>.

#### **Algebraic and Number Theoretic Algorithms**

Algorithm: Factoring

Speedup: Superpolynomial

**Description:** Given an n-bit integer, find the prime factorization. The quantum algorithm of Peter Shor solves this in  $\widetilde{O}(n^3)$  time [82,125]. The fastest known classical algorithm for integer factorization is the

general number field sieve, which is believed to run in time  $2^{\widetilde{O}(n^{1/3})}$ . The best rigorously proven upper bound on the classical complexity of factoring is  $O(2^{n/4+o(1)})$  via the Pollard-Strassen algorithm [252, 362]. Shor's factoring algorithm breaks RSA public-key encryption and the closely related quantum algorithms for discrete logarithms break the DSA and ECDSA digital signature schemes and the Diffie-Hellman key-exchange protocol. A quantum algorithm even faster than Shor's for the special case of factoring "semiprimes", which are widely used in cryptography, is given in [271]. If small factors exist, Shor's algorithm can be beaten by a quantum algorithm using Grover search to speed up the elliptic curve factorization method [366]. Additional optimized versions of Shor's algorithm are given in [384, 386]. There are proposed classical public-key cryptosystems not believed to be broken by quantum algorithms, cf. [248]. At the core of Shor's factoring algorithm is order finding, which can be reduced to the Abelian hidden subgroup problem, which is solved using the quantum Fourier transform. A number of other problems are known to reduce to integer factorization including the membership problem for matrix groups over fields of odd order [253], and certain diophantine problems relevant to the synthesis of quantum circuits [254].

Algorithm: Discrete-log Speedup: Superpolynomial

**Description:** We are given three n-bit numbers a, b, and N, with the promise that  $b=a^s \mod N$  for some s. The task is to find s. As shown by Shor [82], this can be achieved on a quantum computer in poly(n) time. The fastest known classical algorithm requires time superpolynomial in n. By similar techniques to those in [82], quantum computers can solve the discrete logarithm problem on elliptic curves, thereby breaking elliptic curve cryptography [109, 14]. A further optimization to Shor's algorithm is given in [385]. The superpolynomial quantum speedup has also been extended to the discrete logarithm problem on semigroups [203, 204]. See also Abelian hidden subgroup.

Algorithm: Pell's Equation Speedup: Superpolynomia

#### Web scraping: Workflow

**Algorithm:** Factoring **Speedup:** Superpolynomial **Description:** Given an n-bit integer, find the prime factorization. The quantum algorithm of Peter Shor solves this in  $\widetilde{O}(n^3)$  time [82,125]. The fastest known classical algorithm for integer factorization is

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the synthesis of quantum circuits [<a href="#RS12">254</a>].

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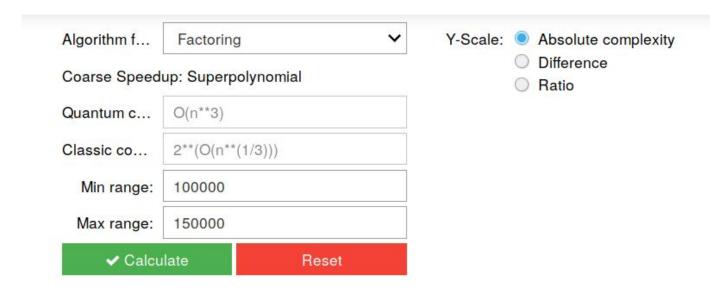
#### Web scraping: Workflow

```
In [1]: import requests
        from bs4 import BeautifulSoup
        import re
        from copy import deepcopy
        import csv
        import itertools
        bigrams = lambda l: list(zip(l[:-1], l[1:]))
        new sent sign = '<NEWSENT>'
In [2]: page = requests.get('https://math.nist.gov/quantum/zoo/')
        contents = str(page.content)
        contents = contents.replace('<b>Algorithm: </b>', '<b>Algorithm:</b>')
        contents = contents.replace('<b>Description: </b>', '<b>Description:</b>')
        # soup = BeautifulSoup(contents, 'html.parser') #don't even need bs, as the page is very non-semantic anyway
In [3]: indices = bigrams([m.start() for m in re.finditer('<b>Algorithm:</b>', contents)]+[len(contents)])
        complete txts = [str(contents)[i[0]:i[1]] for i in indices]
In [4]: all algos = []
        for i in complete txts:
            this algorithm = {}
            for name, searchstring in [['name', '<b>Algorithm:</b>'], ['speedup coarse', '<b>Speedup:</b>'], ['description', '
                tmp = i[i.find(searchstring)+len(searchstring):]
                this algorithm[name] = tmp[:tmp.find('<br />')].strip()
```

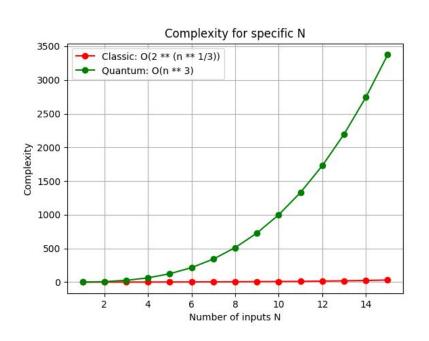
# Visualising complexities

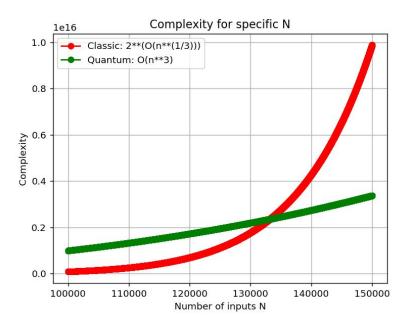
ui[ ui[	ui["text_max_range"].value "text_coarse_speedup"].valu "text_min_range"].value = ' "text_max_range"].value = ' hm"].observe(on_dropdown_ch	alue = "" = "1" = "50"
Algorithm f	Enter manually	Y-Scale: Absolute complexity Difference
Coarse Speedu	ıp:	Ratio
Quantum c	Please enter O().	
Classic co	Please enter O().	
Min range:	1	
Max range:	50	
✓ Calcul	ate Reset	

#### Visualising complexities

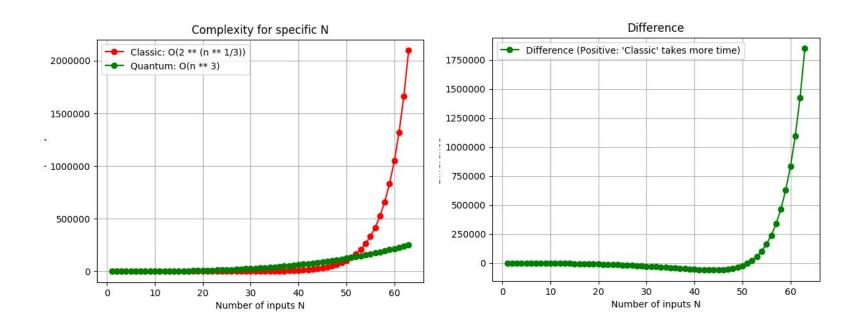


#### Visualisation: Domain matters!



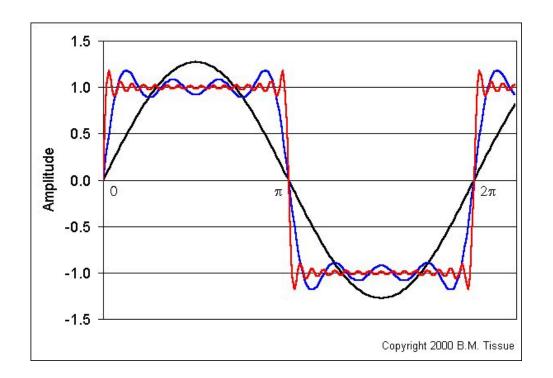


## Choose way of visualisation



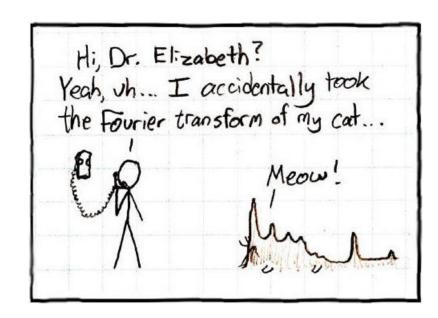
#### Idea of Fourier Transform

- Decompose complex signals into its basic components,
   e.g. with sin, cos
- In order to make it computationally solvable, the signal has to be discretised
   → leads to the idea of FFT

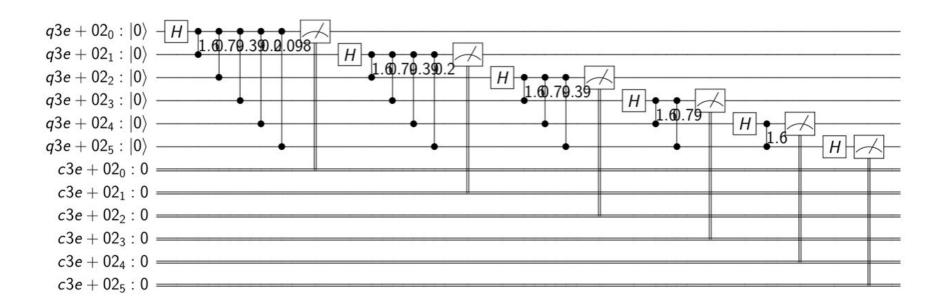


#### **Quantum Fourier Transform**

- Decomposition of Discrete Fourier
   Transformation into the product of unitary matrices
- Can be computed more efficiently by using quantum gates
  - → Combination of Hadamard Gates and Conditional Phase Rotations

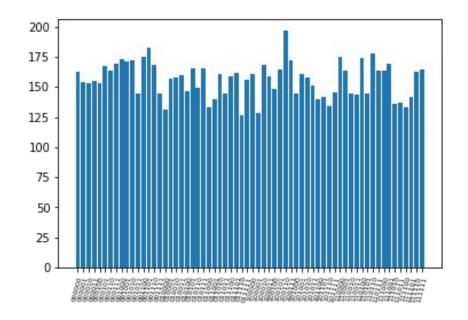


#### Circuit for Quantum Fourier Transform



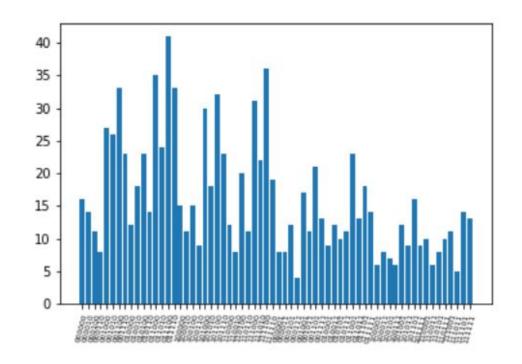
## Result for multiple tries

- Example with all inputs set to zero
- Simulated with 30000 shots



## Result for multiple tries

- Same run on a
   Quantum computer
- Simulated with 1024 shots

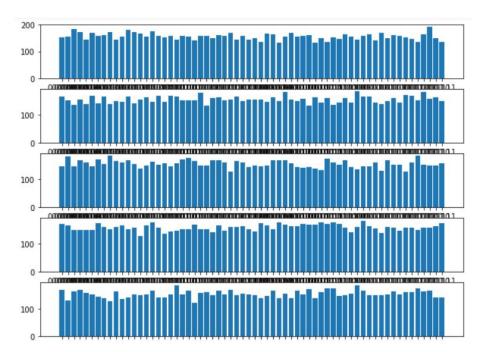


#### Result for multiple tries with different initialisations

How can we achieve different initialisations?

→ by inverting some qubits

As you can see, different initialisations have no impact, all results are uniformly distributed

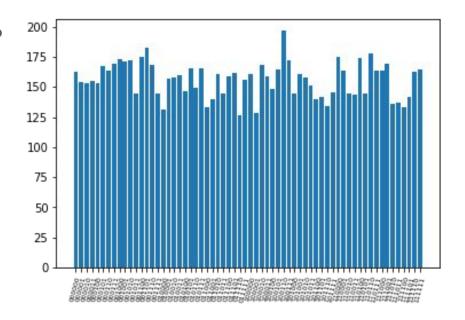


#### Result for multiple tries with entanglement

How can we achieve entanglement?

→ applying CNOT Gates

But simple entanglement has no impact, because all results are still equally distributed

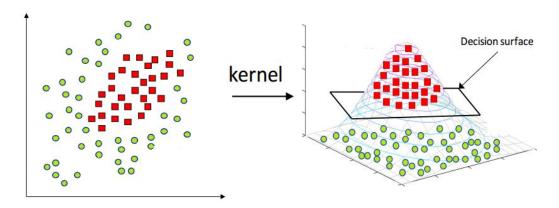


#### Which quantum gates are necessary for...

Classical computation	Probabilistic Computation	Quantum Computation
- CNOT - 180° rotation	- CNOT - 180° rotation - Hadamard	<ul><li>CNOT</li><li>Hadamard</li><li>Phase Shift</li></ul>

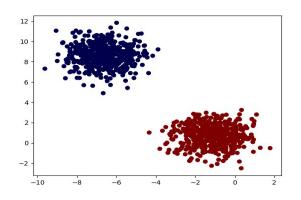
#### Quantum machine learning: SVM

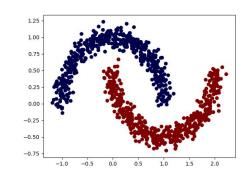
- Classical method of Data Mining and Artificial Intelligence
- Complexity: High possible speed-up (*M*: Samples, *N*: Features)
  - Classical:  $O(M^2(M+N))$
  - Quantum:  $O(\log(M*N))$

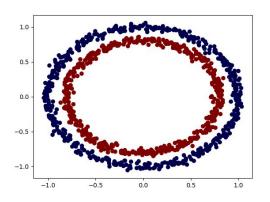


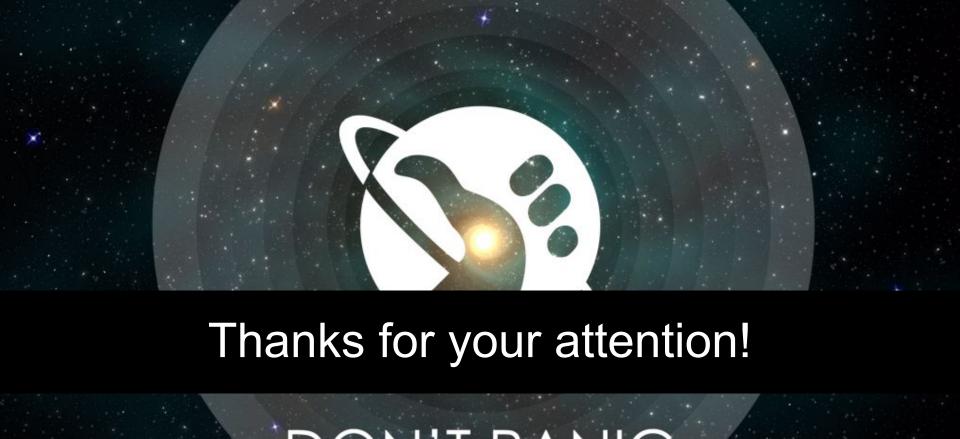
Rebentrost, P.; Mohseni, M. & Lloyd, S. Quantum support vector machine for big feature and big data classification. arXiv:1307.0471, 2013.

## SVM: Testing with custom data









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