### An Introduction to Quantum Computing Fabio A. González **Universidad Nacional de Colombia**

**Quantum Computer Programming 2021-2** 





# Past, present and future

### Past



1982

### A Recent History 1994 2000 Eddie Farhi at MIT Peter Shor develops algorithm that could be develops idea for 2013 used for quantum codeadiabatic quantum **Richard Feynman** D-Wave Two, breaking computing envisions quantum 512 qubits computing .................... 1999 2010 1985 D-Wave Systems D-Wave One: David Deutsch describes founded by Geordie first commercial universal quantum Rose quantum computer, computer 128 qubits





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LinkedIn SlideShare: 17 Nov 2014 – "Quantum Computing: Welcome to the Future" by Vern Brownell CEO

https://catonmat.net/ftp/simulating-physics-with-computers-richard-feynman.pdf

DIMOVE

The Questo in Long Longer

### Present Several companies building quantum hardware





# **Present**Different quantum computing frameworks



Source: https://quantumcomputingreport.com/review-of-the-cirq-quantum-software-framework/

Present Quantum cloud services				Home / Services			ZURE       Explore ~       Products ~       Solutions ~       Pricing ~       Partners ~       Resources ~       Free accounts         Services       /       Azure Quantum       Azure Quan			Free account			
IBM Quantum				Azure Quantum       PREVIEW         Experience quantum impact today on Azure									
	Graphically build circuits with IBM Quantum Composer	Develop quantum experiments in IBM Quantum Lab	Jump back in: ブ entanglement example.ipynb	API token (i) ********* View account detail	S S		Start free Azure Quantum	Login to Azure	Quantum rerview Features	s Customer stories	5 Pricing	FAQs	
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### **Future IBM's quantum roadmap**

### Scaling IBM Quantum technology

IBM Q System One	(Released)	(In development)		
2019	2020	2021		
27 qubits	65 qubits	127 qubits		
Falcon	Hummingbird	Eagle		







### Next family of IBM Quantum systems and beyond 2022 2023 Path to 1 million qubits 433 qubits 1,121 qubits and beyond Osprey Condor Large scale systems Key advancement Key advancement Key advancement Miniaturization of components Integration Build new infrastructure, quantum error correction

### Future

### Development Roadmap



### IBM Quantum

# Why quantum computing?

### Problems

Problems we can't address adequately today

> Problems we can address today

Source: https://ispd.cc/ispd2022/slides/2021/protected/9\_3\_Stok.pdf



Problems we can address with quantum

### Are quantum computers "faster"? Multiplication



Source: https://ispd.cc/ispd2022/slides/2021/protected/9\_3\_Stok.pdf

Classical Cost of multiplication [1]: ~ 0.0025s Quantum Cost of multiplication [2]: ~ 75.0000s

[1]: A. Emerencia,. "Multiplying huge integers using fourier transforms." (2007).

[2]: C. Gidney, Craig, and M. Ekerå. arXiv preprint arXiv:1905.09749 (2019).

### Are quantum computers "faster"? Factorization



Source: https://ispd.cc/ispd2022/slides/2021/protected/9\_3\_Stok.pdf

**Classical Cost of** factoring [1]: ~ 4.7 billion CPU years

(largest factored number RSA-768 bit for approx. 1500 CPU years)

[1]: Kleinjung, Thorsten, et al. "Factorization of a 768-bit RSA modulus." Annual Cryptology Conference. Springer, Berlin, Heidelberg, 2010.

Quantum Cost of factoring [2]:  $\sim$  8 hours

[2]: C. Gidney, Craig, and M. Ekerå. arXiv preprint arXiv:1905.09749 (2019).

### Applications

- Chemestry, molecular simulation: drug discovery, new fertilizers, more efficient batteries
- Optimization: better financial models, transport optimization
- Machine learning: quantum machine learning

### Problems

### "Hard" Problems For classical computing (NP)

13x7=? 937x947=?

Simulating Quantum Source: https://indico.cern.ch/event/719844/contributions/3019718/attachments/1749768/2835637/CERN\_Tavernelli4\_pdf ICS

### Factoring

Possible with quantum computing

> 91=? x ? 887339 = ? x ?

Material, Chemistry

Machine Learning

Optimization



# How quantum computers work?

### Quantum computers types

### **Quantum Annealing**

### **Optimization Problems**

- Machine learning
- Fault analysis
- Resource optimization
- etc...  $\bullet$





Many 'noisy' qubits can be built; large problem class in optimization; amount of quantum speedup unclear

### Approximate NISQ-Comp.

### Simulation of Quantum Systems, Optimization

- Material discovery
- Quantum chemistry
- Optimization  $\bullet$ (logistics, time scheduling,...)
- Machine Learning  $\bullet$



Hybrid quantum-classical approach; already 50-100 "good" physical qubits could provide quantum speedup.



### Noisy Intermediate-Scale Quantum

### **Fault-tolerant Universal** Q-Comp.

### **Execution of Arbitrary Quantum** Algorithms

- Algebraic algorithms (machine learning, cryptography,...)
- Combinatorial optimization •
- Digital simulation of quantum systems



Surface Code: Error correction in a Quantum Computer

Proven quantum speedup; error correction requires significant qubit overhead.





### Quantum annealing Adiabatic quantum computer

ntum

solution to the problem

H(s) = Combined Hamiltonial to evolve slowly:

S = 0

- $H_{B}$  = Initial Hamiltonian, which ground state is easy to find
- $H_{P}$  = Problem Hamiltonian, whose ground state encodes the
  - A(s) decrease smoothly and monotonically B(s) increase smothly and monotonically
    - $H(s) = A(s)H_{B} + B(s)H_{P}$



Source: https://indico.cern.ch/event/865287/attachments/1971786/3280301/Lecture\_1\_v1.pdf

### Universal quantum computer **DiVincenzo's Criteria**

- A scalable physical system with well characterized qubits.
- The ability to initialize the state of the qubits to a simple fiducial state, such as |000....000>
- Long relevant decoherence times, much longer than the gate operation time.
- A "universal" set of quantum gates.
- A qubit-specific measurement capability.

DiVincenzo, D. P. (2000). The physical implementation of quantum computation. Fortschritte der Physik: Progress of Physics, 48(9-11), 771-783.

# Inside an IBM Q quantum computing system

### Microwave electronics



Source: https://indico.cern.ch/event/719844/contributions/3019718/attachments/1749768/2835637/CERN\_Tavernelli4\_I.pdf



Refrigerator to cool qubits to 10 - 15 mK with a mixture of <sup>3</sup>He and <sup>4</sup>He



PCB with the qubit chip at 15 mK protected from the environment by multiple shields



Chip with superconducting qubits and resonators



### The Quantum Era of Accelerated Discovery

Dario Gil, Ph.D. Director of IBM Research

### https://youtu.be/zOGNoDO7mcU?t=650

### https://youtu.be/zOGNoD07mcU?t=1887

IBM Quant

### The power of quantum computing is more than the number of qubits

Improving the error rate will result in a more powerful **Quantum Computer** 

### Quantum Volume depends upon

Number of physical QBs

Connectivity among QBs

Available hardware gate set

Error and decoherence of gates

Number of parallel operations



### Fault-tolerant universal quantum computer



"Quantum computing in the NISQ era and beyond" Preskill, 2018 https://arxiv.org/abs/1801.00862

- Noisy Intermediate Scale Quantum
  - - Quantum chemistry

### Quantum supremacy

### Article



# Quantum information

### Quantum information **Basic concepts**

- Qubit
- Superposition
- Measurement
- Quantum operations
- Entanglement

### The Quantum Era of Accelerated Discovery

Dario Gil, Ph.D. Director of IBM Research



### Bit vs Qubit

### Classical bit



Dür, W., & Heusler, S. (2013). What we can learn about quantum physics from a single qubit. arXiv preprint arXiv:1312.1463.

### Qubit



### Superposition



$$|0\rangle = \begin{pmatrix} 1\\0 \end{pmatrix}, |1\rangle = \begin{pmatrix} 0\\1 \end{pmatrix}$$

Dür, W., & Heusler, S. (2013). What we can learn about quantum physics from a single qubit. arXiv preprint arXiv:1312.1463.

$$|\psi\rangle = \alpha|0\rangle + \beta|1\rangle = \left( \begin{array}{c} \alpha\\ \beta \end{array} 
ight)$$

### Neasurement



Dür, W., & Heusler, S. (2013). What we can learn about quantum physics from a single qubit. arXiv preprint arXiv:1312.1463.

$$|\psi\rangle = \alpha|0\rangle + \beta|1\rangle = \left(\begin{array}{c} \alpha\\ \beta\end{array}\right)$$

### $p_0 = \langle \psi | 0 \rangle \langle 0 | \psi \rangle = |\langle 0 | \psi \rangle|^2 = |\alpha|^2,$ $p_1 = \langle \psi | 1 \rangle \langle 1 | \psi \rangle = |\langle 1 | \psi \rangle|^2 = |\beta|^2.$



### Unitary operation



Dür, W., & Heusler, S. (2013). What we can learn about quantum physics from a single qubit. arXiv preprint arXiv:1312.1463.

### $U^{\dagger}U = UU^{\dagger} = 1$

### Pauli matrices

$$\sigma_x = \begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix}, \sigma_y = \begin{pmatrix} 0 & -i \\ i & 0 \end{pmatrix}, \sigma_z = \begin{pmatrix} 1 & 0 \\ 0 & -1 \end{pmatrix}$$

### **Entanglement** Multiple qubits



Dür, W., & Heusler, S. (2013). What we can learn about quantum physics from a single qubit. arXiv preprint arXiv:1312.1463.

superposition of 2<sup>n</sup> basis states



### Entanglement Measurement











# How to program a quantum computer?

### QISKit: Basic workflow

At the highest level, quantum programming in QISKit is broken up into three parts:

- **Building** quantum circuits 1.
- **Compiling** quantum circuits to run on a specific 2. backend
- **Executing** quantum circuits on a backend and 3. analyzing results

**Important:** Step 2 (compiling) can be done automatically so that a basic user only needs to deal with steps 1 and 3.

Panagiotis Barkoutsos - bpa@zurich.ibm.com





### QISKit: Basic workflow

At the highest level, quantum programming in QISKit is broken up into three parts:

```
[python3] $ pip install qiskit
from qiskit import QuantumRegister, ClassicalRegister
from qiskit import QuantumCircuit, Aer, execute
q = QuantumRegister(2)
c = ClassicalRegister(2)
qc = QuantumCircuit(q, c)
qc.h(q[0])
qc.cx(q[0], q[1])
qc.measure(q, c)
backend = Aer.get_backend('qasm_simulator')
job_sim = execute(qc, backend)
sim_result = job_sim.result()
print(sim_result.get_counts(qc))
```

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Source: https://indico.cern.ch/event/719844/contributions/3019718/attachments/1749768/2835637/CERN\_Tavernelli4\_I.pdf





### Quantum circuit



Source: https://qiskit.org/textbook/ch-algorithms/defining-quantum-circuits.html

### Quantum circuit



Source: https://algassert.com/post/1716

### The Quantum Era of Accelerated Discovery

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# Quantum machine learning

# The Quantum Era of Accelerated Discovery

Dario Gil, Ph.D. Director of IBM Research



### **Quantum machine learning** Number of papers per year

Documents by year								
	1000							
	800							
nents	600							
Docum	400							
	200							
	0							
	Ŭ	1991	1994	1997	2000			



# **Quantum Machine Learning**

- AI/ML already uses special-purpose processors: GPUs, TPUs, ASICs
- Quantum computers (QPUs) could be used as special-purpose Al accelerators
- May enable training of previously intractable models





Source: https://cs269q.stanford.edu/lectures/lecture14.pdf



# New Al models

- Quantum computing can also lead to new machine learning models
- Examples currently being studied are:
- Kernel methods
- Boltzmann machines
- Tensor Networks
- Variational circuits
- Quantum Neural Networks



Layer  $\mathcal{L}$ 





### QML at MindLab

Journal of the Physical Society of Japan 90, 044002 (2021)

https://doi.org/10.7566/JPSJ.90.044002

### **Classification with Quantum Measurements**

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### Training

### Prediction









### QML at MindLab Implementation in Qiskit



### Prediction



### Training state preparation

### **Execution results**





### QML at MindLab Implementation in Qiskit



Exact circuit simulator







Noisy circuit simulator

IBM Bogotá Quantum device

## Gracias! fagonzalezo@unal.edu.co http://mindlaboratory.org

machine learning perception and discovery

