

# Prospects and applications of quantum programming

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# Outline

Goals of the talk

Quantum computing


Quantum platforms and software

Applications of quantum computing

What next?



# About IITiS PAN



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### LANGUAGES

English ▾

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# About IITiS PAN





## Goals of the talk

- ▶ Provide basic facts about quantum computing.
- ▶ Present available quantum hardware and software platforms.
- ▶ Describe possible applications of quantum computing.

# Quantum computing



## Quantum computing

Quantum computing is a model of computation based on the rules of **quantum mechanics**.

Quantum mechanics can be described on the level of **vectors and unitary matrices** or using **energy levels of Hamiltonian**.

### Digital vs. analog

The first approach leads to **digital quantum computing**, while the second can be seen as **analog quantum computing**.

# ✚ Quantum computing

## Digital quantum computing

### Advantage

**Parallel execution** enabling the speed-up for solving hard problems.

How to use this model?

- ▶ Input data have to be encoded into **quantum registers**.
- ▶ Sequence of quantum gates (ie. quantum circuit) has to be prepared – **constructed and implemented**.
- ▶ **Quantum error correction** is needed to maintain the quantum state during the execution.



# ❖ Quantum computing

## Digital quantum computing – One bit

For one bit we have two possible states.

- ▶ We **encode them into vectors**  $\vec{0}$  and  $\vec{1}$  (or  $|0\rangle$  and  $|1\rangle$  as it is more commonly used).
- ▶ Vectors can be added, so  $\vec{0} + \vec{1}$  (or  $|0\rangle + |1\rangle$ ) is also a state.
- ▶ We need to fix the length if the length of each component can be **interpreted as a probability**.
- ▶ Any operation on these vectors should preserve the length – such operations are represented by **unitary matrices**.

That's it – we have **one qubit** and we can process data in **superposition**.



## Quantum computing

### Digital quantum computing – Two bits

Two bits can be represented using one qubit twice – or rather wiring two qubits together.

- ▶ States are  $|0\rangle \otimes |0\rangle$ ,  $|0\rangle \otimes |1\rangle$ ,  $|1\rangle \otimes |0\rangle$  and  $|1\rangle \otimes |1\rangle$ .
- ▶ Tensor product  $\otimes$  is needed to **preserve linearity**.
- ▶ So  $|0\rangle \otimes |1\rangle + |1\rangle \otimes |0\rangle$  is also a state.

And in this way we get **quantum registers** and **entangled states**.

## ➤ Quantum computing

### Analog quantum computing – Evolution of quantum systems

#### Advantage

Fast solution of optimization problems based on **specialized hardware**

A state of the quantum system tends to the minimum energy.

The state is described by time-independent Schrödinger equation

$$\hat{H}|\psi\rangle = E|\psi\rangle.$$

The logic of our problem has to be encoded into the Hamiltonian operator  $\hat{H}$  representing the energy of the system.

## Quantum computing

### Analog quantum computing – QUBO

#### Quadratic unconstrained binary optimization (QUBO) problem

Minimize the value of the quadratic form

$$E_{\text{QUBO}} = \sum_i Q_{ii}x_i + \sum Q_{ij}x_i x_j$$

on the space of binary vectors.

Using matrix notation this is equivalent to

$$\min_{\vec{x} \in \{0,1\}^n} \vec{x}^T Q \vec{x}.$$

## ✦ Quantum computing

### Analog quantum computing – Ising model

Simple and powerful model for describing quantum systems, successfully used in statistical mechanics.

The energy of the system is described by the function

$$H = \sum_{i=1} h_i s_i + \sum_{i \sim j} J_{ij} s_i s_j,$$

with  $s_i \in \{-1, +1\}$ .



## Quantum computing

### Analog quantum computing – Ising model

In the quantum realm this function is represented by an operator  $\hat{H}$ , where values  $s_i$  are replaced by operators with two eigenvalues.

Calculating ground state of the Ising Hamiltonian is equivalent to solving QUBO with mapping

$$s \mapsto 2q - 1.$$

## ➤ Quantum computing

### Analog quantum computing – QUBO and Ising model

QUBO to Ising mapping provides logic for embedding optimization problems in quantum systems.

Problem formulation	Term			
	linear	quadratic	variable	states
QUBO	$Q_{ii}$	$Q_{ij}$	$x_i$	$\{0, 1\}$
Ising model	$h_i$	$J_{ij}$	$s_i$	$\{-1, +1\}$
QPU (physical device)	qubit bias	coupling strength	qubit state	$\{\uparrow, \downarrow\}$

Quantum system undergoes the evolution leading to the optimal solution of the problem given in the form of the total energy of the system.

## Quantum computing

### Analog quantum computing – XNOR gate

Simple example – find a configuration of  $x_1$  and  $x_2$ , fulfilling the condition of XNOR gate – output 1 if inputs are identical.

The energy function is given by

$$f(\vec{x}) = a_1x_1 + a_2x_2 + b_{12}x_1x_2.$$

Using biases  $a_1 = \alpha$ ,  $a_2 = \alpha$  we introduce penalty for states  $(x_1, x_2) = (0, 1)$  and  $(x_1, x_2) = (1, 0)$ . To promote state  $(1, 1)$  we introduce coupling  $b_{12} = -\frac{1}{2}\alpha$ .



# ✦ Quantum computing

## Advantages of quantum computers

- ▶ **Parallel execution** enabling the speed-up for solving hard problems.
- ▶ Fast solution of optimization problems based on **specialized hardware**.

# Quantum platforms and software



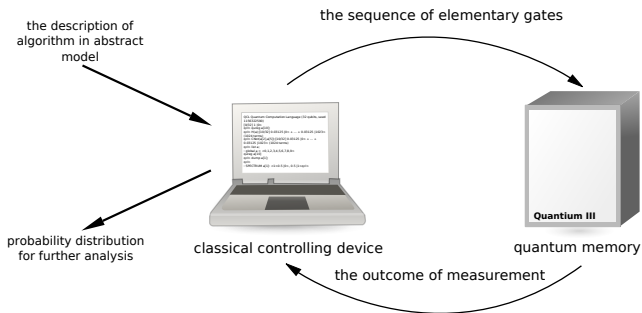
## Quantum platforms and software

Quantum programming is a process that leads from an **original formulation** of a computing problem to **executable** quantum computer programs.

# Quantum platforms and software

## Quantum co-processor

QRAM  $\equiv$  Quantum Random Access Machine



(E. Knill. Conventions for quantum pseudocode. Technical report, LANL, 1996.)

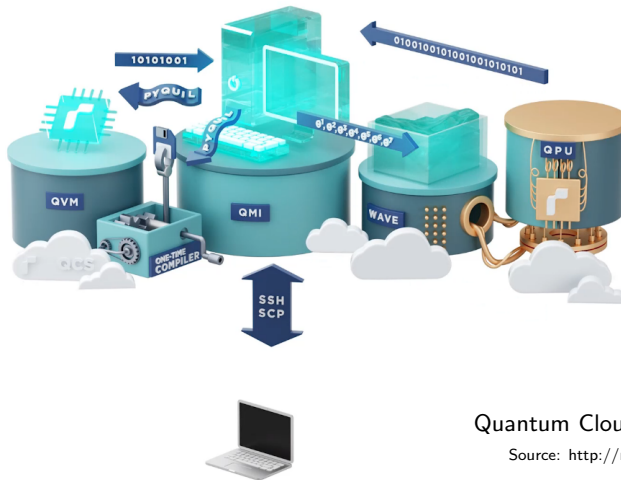
## ❖ Quantum platforms and software

### Quantum co-processor

- ▶ Developed for describing gate model of quantum computing – digital quantum computing with classical controlling device.
- ▶ Crucial assumption: **quantum and classical parts are suitable for different types of computation.**
- ▶ Nowadays quantum computing is delivered as service, not as machine available for the user – quantum computing as a service (QCaaS) approach.

# Quantum platforms and software

## QRAM/QPU in the cloud

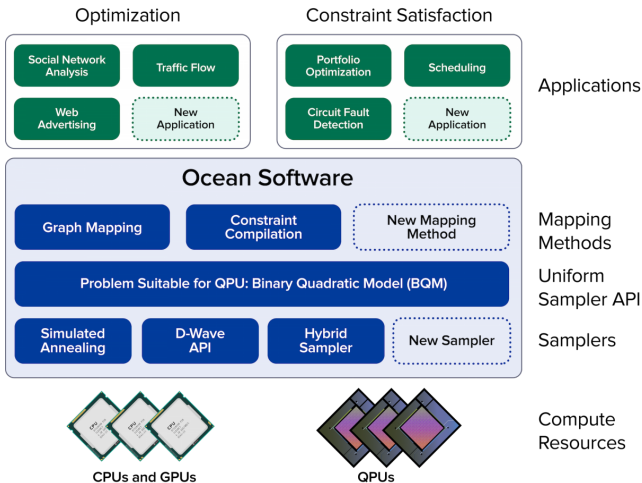


Quantum Cloud Services

Source: <http://rigetti.com/qcs>

# Quantum platforms and software

## QRAM/QPU in the cloud (mixed model)



D-Wave software environment

Source: <https://www.dwavesys.com/software>

## ❖ Quantum platforms and software

### Quantum middleware

Quantum computers are expensive → utilize a layer of intermediary software to provide access to your machine.

Usually this is

- ▶ embedded domain specific language → Python with library of functions
- ▶ data abstraction → allocation of classical and quantum registers based on  $qu(b|d)its$
- ▶ classical control of quantum memory → by using host language
- ▶ quantum functions → custom gates defined by matrices or compound statements



# ❖ Quantum platforms and software

## Software for quantum hardware

In terms of software → hardware (or planned hardware)

- ▶ QISKit → IBM
- ▶ pyQuil → Rigetti
- ▶ ProjectQ → IBM (and other backends)
- ▶ Leap (cloud service) → D-Wave Systems
- ▶ Quantum Development Kit/Q# → Microsoft (???)
- ▶ Cirq → Google (???)
- ▶ QX Simulator → Intel/QuTech (???)

## ❖ Quantum platforms and software

### Software for quantum hardware

- ▶ *[[designing a language that enables a programmer to exploit quantum interference in a quantum algorithm is a unique and nontrivial challenge.<sup>1</sup>*

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<sup>1</sup>Quantum Computing. Progress and Prospects, The National Academies Press, 2019

# Applications of quantum computing

# ➤ Applications of quantum computing

## Digital vs. analog

- ▶ Digital – we are interested in the exact solutions.
- ▶ Analog – the approximate solutions are also interesting.

### Note!

In both regimes we have to deal with probabilistic answers!

## ➤ Applications of quantum computing

### Fast factorization

- ▶ Invented in 1994 by the American mathematician Peter Shor.
- ▶ Task: Given an integer  $n$ , find its prime factors,  $p_1$  and  $p_2$ , such that  $p_1 p_2 = n$ .
- ▶ Running time:  $\mathcal{O}(\text{poly}(\log n))$ .
- ▶ Can be used to **attack cryptosystems based on RSA**.

## ➤ Applications of quantum computing

### Fast factorization

- ▶ Resulted in significant efforts for delivering cryptographic solutions immune to quantum computers.
- ▶ The 7th ETSI/IQC Quantum Safe Cryptography Workshop organized by ETSI in partnership with Amazon Web Services (AWS)



## ➤ Applications of quantum computing

### Unconditionally secure cryptography and quantum internet

- ▶ Invented in 70s (Wiesner), 80s (Bennett and Brassard), and 80s (Ekert).
- ▶ Task: Send a bit without giving opportunity to read it while not being detected.
- ▶ Based on the **no-cloning theorem** – quantum state cannot be copied, you destroy it in the process of measuring.
- ▶ Provides unconditional security.

# ➤ Applications of quantum computing

## Unconditionally secure cryptography and quantum internet

- ▶ Available commercial solutions.
- ▶ Proposed standards and protocols.

### **A Link Layer Protocol for Quantum Networks**

Axel Dahlberg<sup>1,2</sup>, Matthew Skrzypczyk<sup>1,2</sup>, Tim Coopmans<sup>1,2</sup>, Leon Wubben<sup>1,2</sup>,  
Filip Rozpędek<sup>1,2</sup>, Matteo Pompili<sup>1,2</sup>, Arian Stolk<sup>1,2</sup>, Przemysław Pawełczak<sup>1</sup>,  
Robert Knegjens<sup>1</sup>, Julio de Oliveira Filho<sup>1</sup>, Ronald Hanson<sup>1,2</sup>, Stephanie Wehner<sup>1,2</sup>

<sup>1</sup>QuTech, Delft University of Technology and TNO

<sup>2</sup>Kavli Institute of Nanoscience, Delft University of Technology  
s.d.c.wehner@tudelft.nl



# ➤ Applications of quantum computing

## Optimization

- ▶ Task: Find the best of many possible combinations.
- ▶ Rule: Every system tends to evolve towards a minimum energy state.

## ➤ Applications of quantum computing

### Optimization

- ▶ Energy of quantum systems can be described using Ising model.
- ▶ Quantum processing unit (QPU) is used to provide solutions described by the configuration with minimum energy.
- ▶ D-Wave represents problems as a binary quadratic model (BQM).

#### Note

QUBO can be used to run optimization on many types of devices, not necessarily quantum.

# ✦ Applications of quantum computing

## Optimization



Labeling images



Extracting meaning from news stories



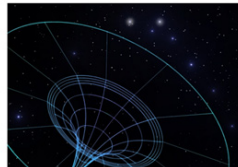
Detecting and tracking objects in images



Finding correlations in bioinformatic data



Improving natural language in machines



Creating and testing scientific hypotheses

Source: <https://www.dwavesys.com/>

## ➤ Applications of quantum computing

### Machine learning

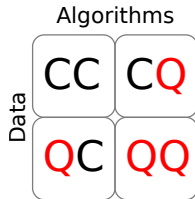
*Quantum systems produce atypical patterns that classical systems are thought not to produce efficiently, so it is reasonable to postulate that quantum computers may outperform classical computers on machine learning tasks*

(J. Biamonte *et al.*, *Quantum machine learning*, Nature, Vol. 549 (2017))

# ➤ Applications of quantum computing

## Machine learning

Quantum machine learning aims at utilizing the advantages of quantum computing in the context of data processing. This can be achieved in many scenarios...



# ➤ Applications of quantum computing

## Machine learning

Where can quantum computers help in machine learning?

- ▶ Many methods in machine learning require iterative optimization – quantum version of procedures such as PCA can be used to improve their performance.
- ▶ Analysis of quantum data using quantum computers can be achievable on small devices.

What are the limitations of quantum computers?

- ▶ Loading data in QRAM-based machines is costly (and currently impossible).
- ▶ Without good optimization, the circuit size and circuit depth overhead can outweigh the advantages.

# ➤ Applications of quantum computing

## Startups in quantum computing

1QBit

CCC  
Cambridge  
Quantum  
Computing

ENTROPICA LABS

GTN LTD

HQS  
QUANTUM  
SIMULATIONS

OTI

ProteinQure

QCWARE

QU&CO

QULAB

QunaSys

Q<sup>Y</sup>Branch

rahko

RIVERLANE

SolidStateAI

STRANGE  
WORKS

ZAPATA

(Source: <https://www.microsoft.com/en-us/quantum/quantum-network>)

# ✚ Applications of quantum computing

## Volkswagen/D-Wave collaboration



### **Quantum Computing at Volkswagen: Traffic Flow Optimization using the D-Wave Quantum Annealer**

D-Wave Users Group Meeting - National Harbour, MD

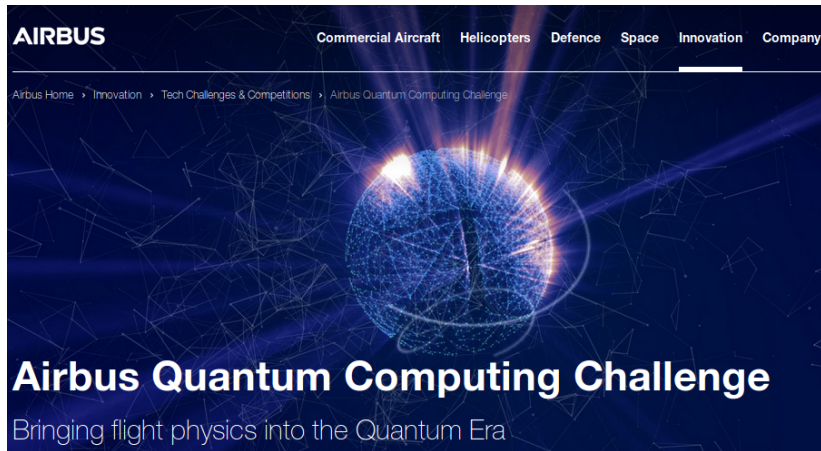
27.09.2017 – Dr. Gabriele Compostella

Report: <https://www.dwavesys.com/sites/default/files/VW.pdf>



# ✦ Applications of quantum computing

## Airbus Quantum Computing Challenge



Launch: January 2019.

# ➤ Applications of quantum computing


## Challenges

- ▶ Development of new algorithms **harnessing quantum parallelism** for real-world problems.
- ▶ Utilization of existing hardware to benefit from **small quantum computers** – noisy intermediate-scale quantum (NISQ) technology.
- ▶ Construct **optimized programs** for specific quantum hardware.



## What next?

- ▶ Quantum Computing. Progress and Prospects, The National Academies Press, 2019 (<https://www.nap.edu/read/25196/>)
- ▶ J. Miszczak, *Quantum programming tutorial: slides and code examples* (<https://github.com/jmiszczak/qprog-tutorial>)
- ▶ Quantiki – Quantum Information Portal and Wiki (<https://quantiki.org/>)

 **Quantiki**  
Quantum Information Portal and Wiki

**User login**




Username \*

Password \*

**Welcome to Quantiki**

Welcome to Quantiki, the world's leading social portal for everyone involved in quantum information science. No matter if you are a researcher, a student or a fan of quantum theory, this is the place you are going to find useful and enjoyable! While here on Quantiki you can: browse our content, including fascinating and educative [articles](#), then [create your own account and log in](#) to gain more editorial possibilities.

Add new content, such as information about [upcoming quantum events](#), [open positions](#) for quantum scientists and existing [quantum research groups](#). We also encourage to follow us using social media sites.



## ➡ What next?

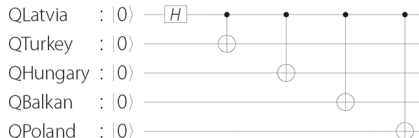
QWorld – initiative by Center for Quantum Computer Science, University of Latvia, groups from Poland, Hungary, Turkey...



We invite everyone to be part of the second quantum revolution!

We are looking for entangling with new **QCousins**.

Be part of a global network who can support and encourage each other to popularize quantum technologies and software.



more info: [ej.uz/entangling](https://ej.uz/entangling)

Thank you.

<https://iitis.pl/~mischczak>