



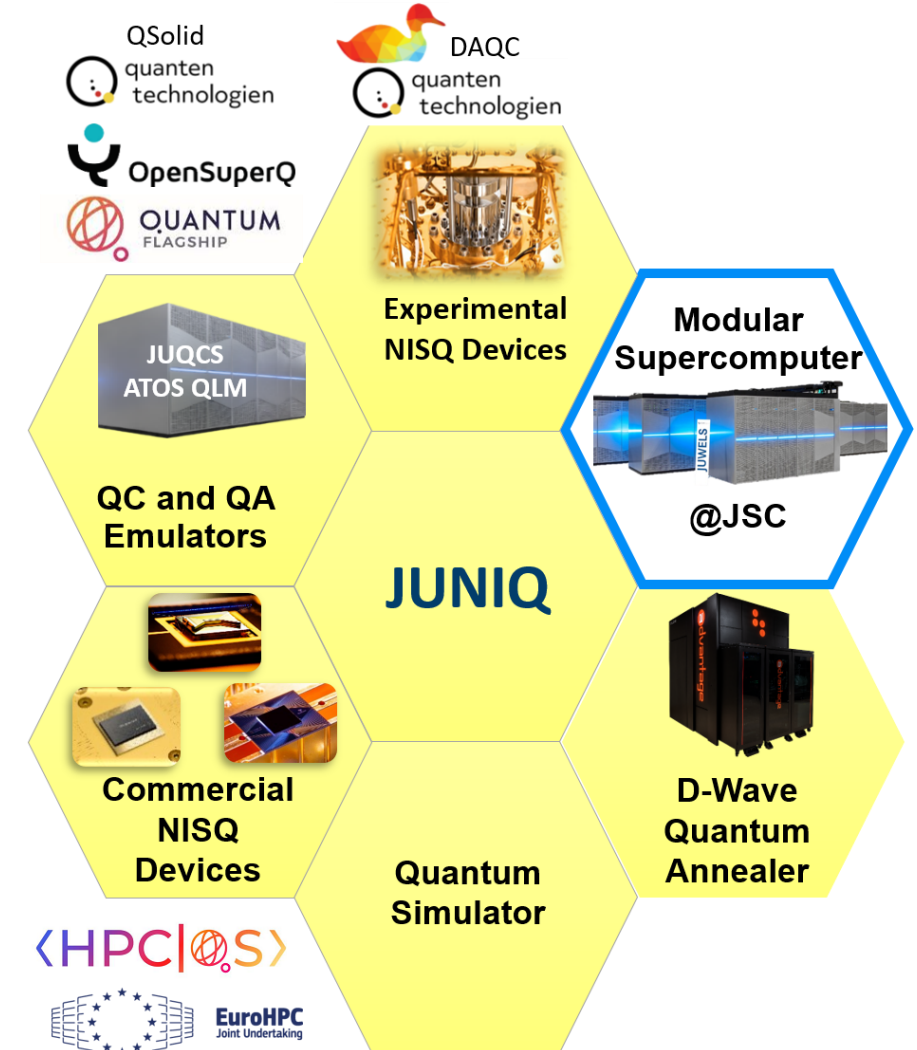
QUANTUM COMPUTING APPLICATIONS AT JSC

JÜLICH UNIFIED INFRASTRUCTURE FOR QUANTUM COMPUTING (JUNIQ)

22 MARCH 2023 | DR. DENNIS WILLSCH

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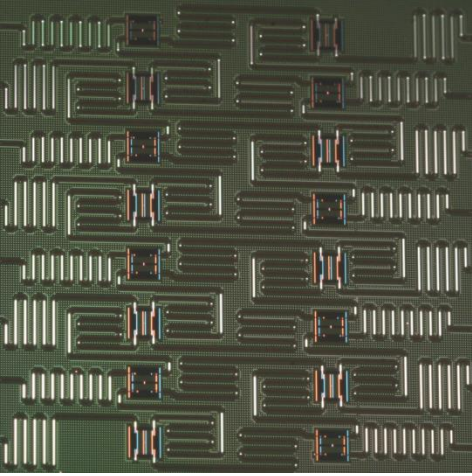
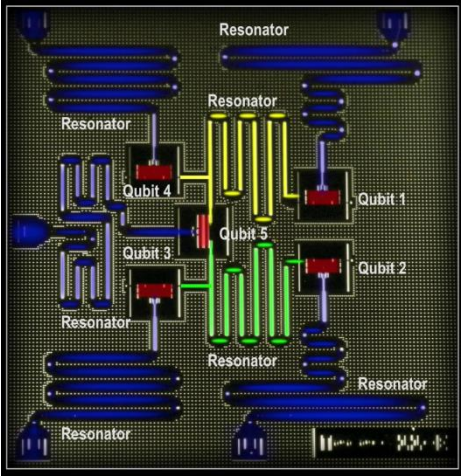
1. Overview
2. Gate-based Quantum Computing
 - Introduction
 - Applications
3. Quantum Annealing
 - Introduction
 - Applications



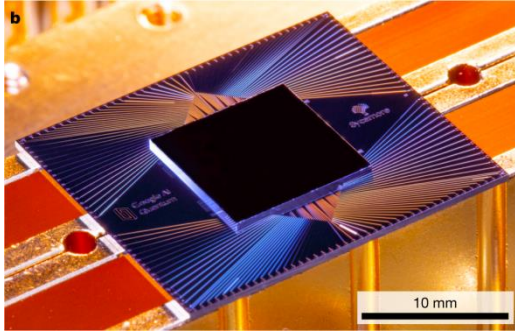
QUANTUM COMPUTERS

Two main paradigms: Gate-based QC and Quantum Annealing

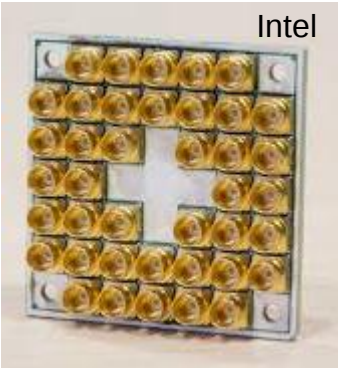
IBM: 1, 5, 7, 16, 27, 65, 127, 433 Qubits



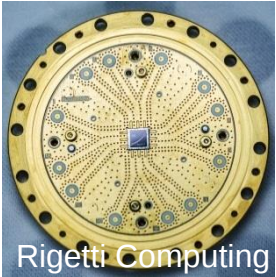
Google: 53, 72 Qubits



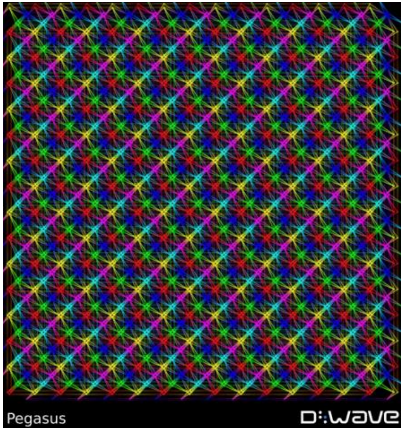
Intel: 17, 49 Qubits



Rigetti Computing:
8, 16, 19 Qubits



D-Wave: 2048, 5760 Qubits



WHAT IS A QUBIT?

Digital Computer: **Bit**



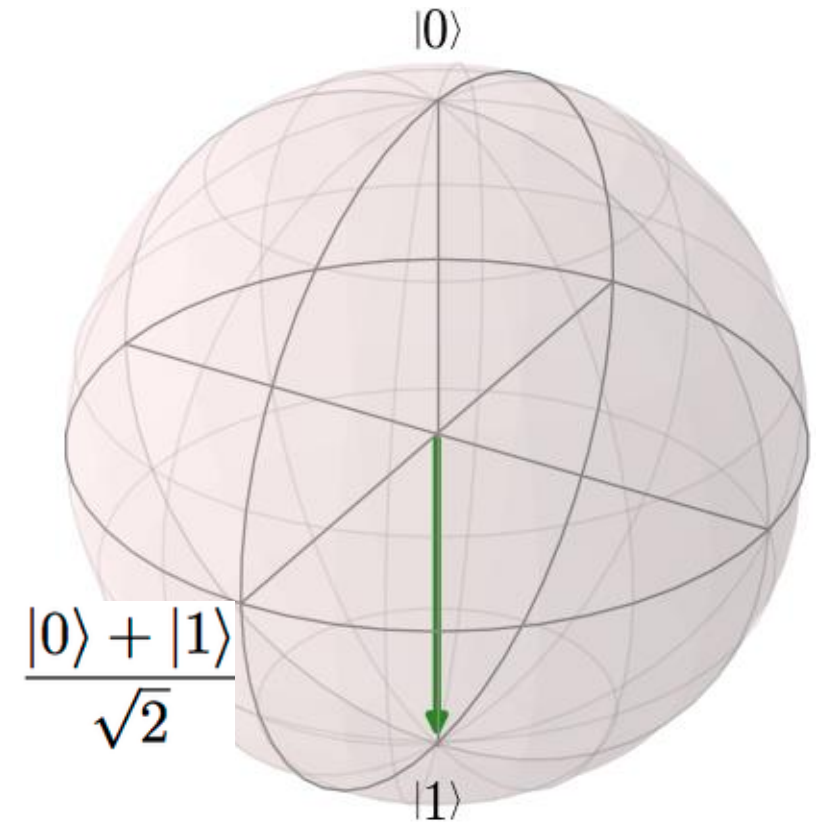
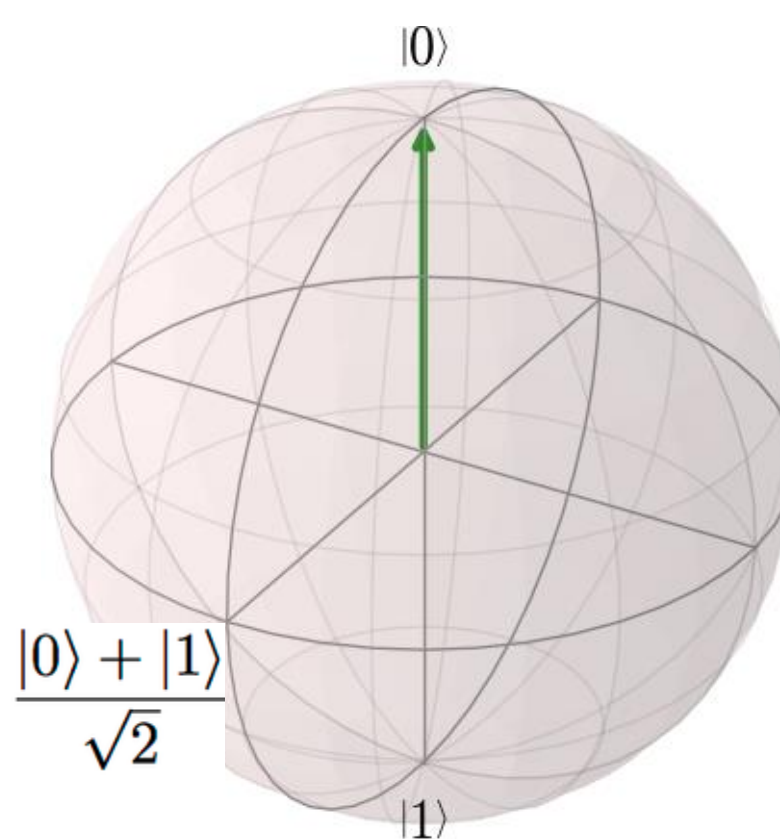
0



1

Quantum Computer: **Quantum Bit = Qubit**

$$\alpha|0\rangle + \beta|1\rangle$$

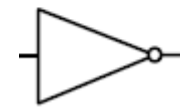
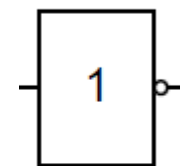


GATE-BASED QUANTUM COMPUTING

Digital Gates:

1 bit:

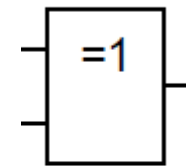
NOT



a	y
0	1
1	0

2 bits:

XOR



a	b	y
0	0	0
0	1	1
1	0	1
1	1	0

... and many more

Quantum Gates

1 qubit: $\alpha|0\rangle + \beta|1\rangle$

X-Gate (NOT): $|0\rangle \xrightarrow{X} |1\rangle$

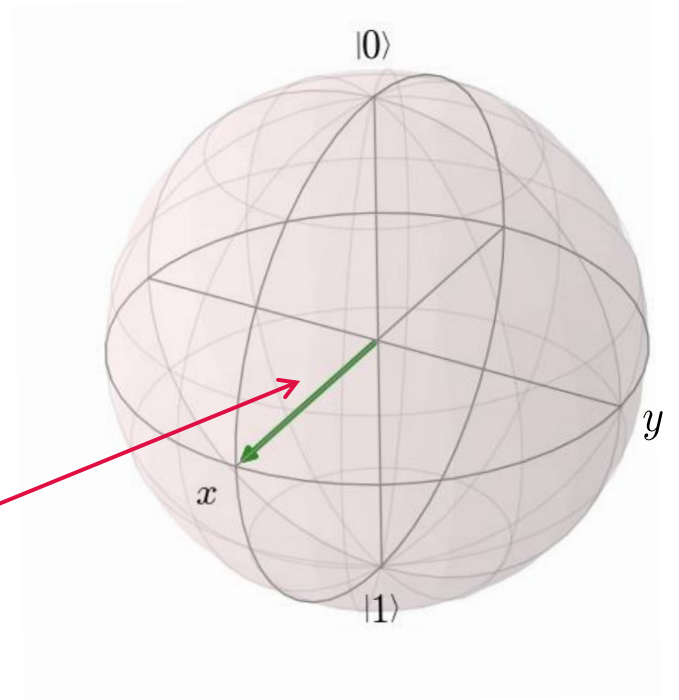
Y-Gate (i -NOT): $|0\rangle \xrightarrow{Y} i|1\rangle$

Hadamard (H): $|0\rangle \xrightarrow{H} \frac{|0\rangle + |1\rangle}{\sqrt{2}}$

... and many more

2 qubits: $\alpha|00\rangle + \beta|01\rangle + \gamma|10\rangle + \delta|11\rangle$

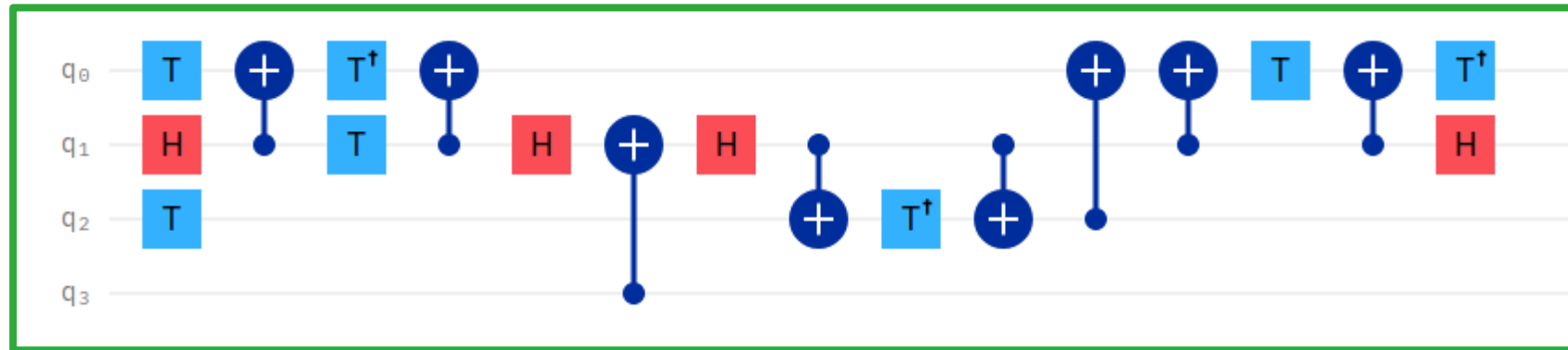
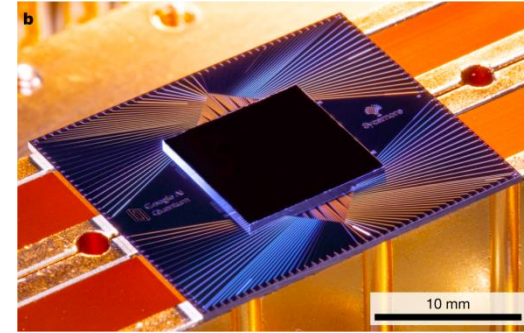
CNOT: $|00\rangle \xrightarrow{\text{CNOT}} |00\rangle$ $|10\rangle \xrightarrow{\text{CNOT}} |11\rangle$



GATE-BASED QUANTUM COMPUTING

The Idea

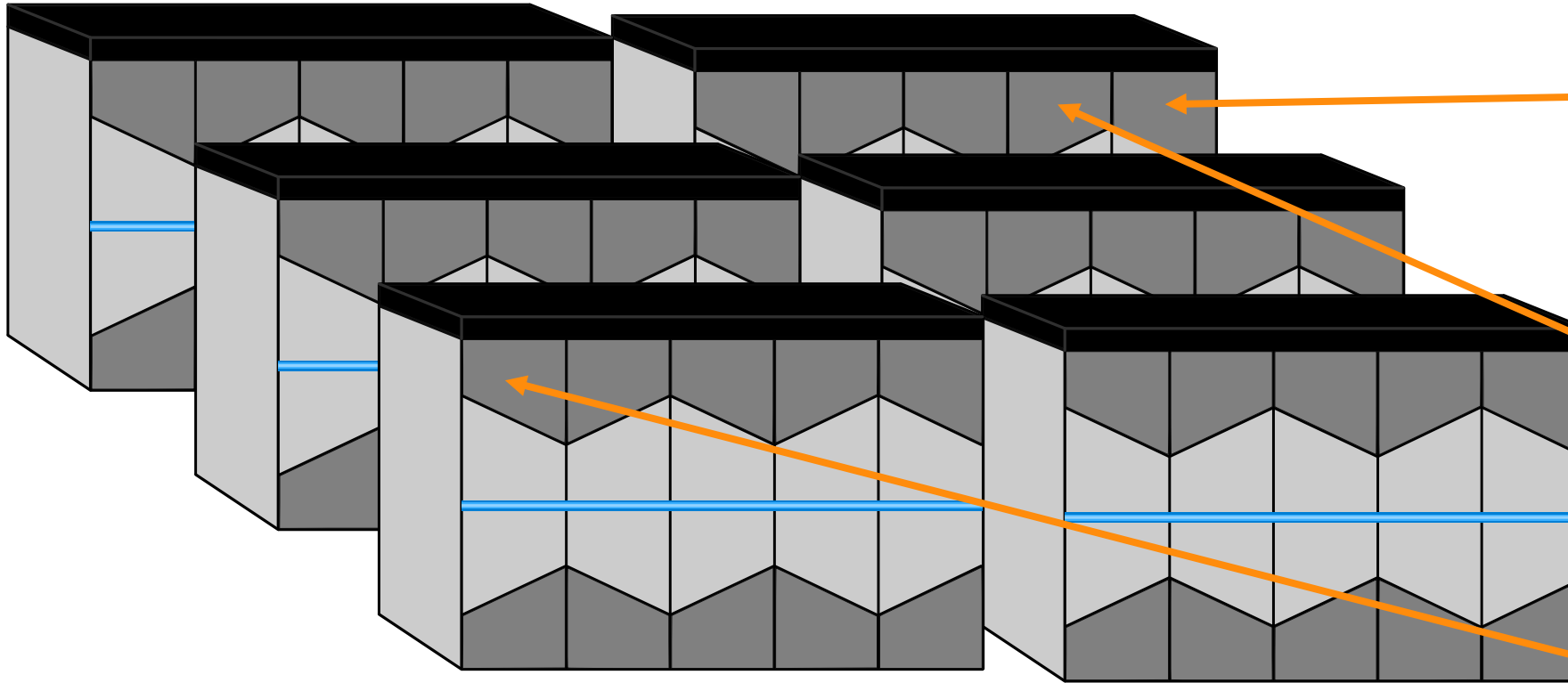
- What does a gate-based quantum computer do?
 - It runs a quantum circuit



- What does this mean, actually?
 - It performs **matrix-vector multiplications** that are
 - sparse**
 - complex**
 - unitary**
 - with **huge** vectors and **huge²** matrices

GATE-BASED QUANTUM COMPUTING

Simulating with JUQCS (Jülich Universal Quantum Computer Simulator)



GPU #0 (Node #0)

$$\begin{pmatrix} \psi_{0000000000000 \dots 0} \\ \vdots \\ \psi_{0000000000000 \dots 1} \end{pmatrix}$$

GPU #4 (Node #1)

$$\begin{pmatrix} \psi_{0000000000001 \dots 0} \\ \vdots \\ \psi_{0000000000001 \dots 1} \end{pmatrix}$$

GPU #2047

$$\begin{pmatrix} \psi_{1111111111111 \dots 0} \\ \vdots \\ \psi_{1111111111111 \dots 1} \end{pmatrix}$$

➤ **Video:** Simulation of Quantum Computers on GPUs
<https://www.youtube.com/watch?v=JUSEYCKh2ac>

➤ **JUNIQ:** Possible to simulate around 40 qubits (45 with JUQCS)
<https://juniq.fz-juelich.de>

GATE-BASED QUANTUM COMPUTING

Application: Tail Assignment (Airline Scheduling)

Find optimal flight schedule
such that each flight is covered
exactly once

In collaboration with:

Marika Svensson
Jeppesen and
Chalmers University of Technology



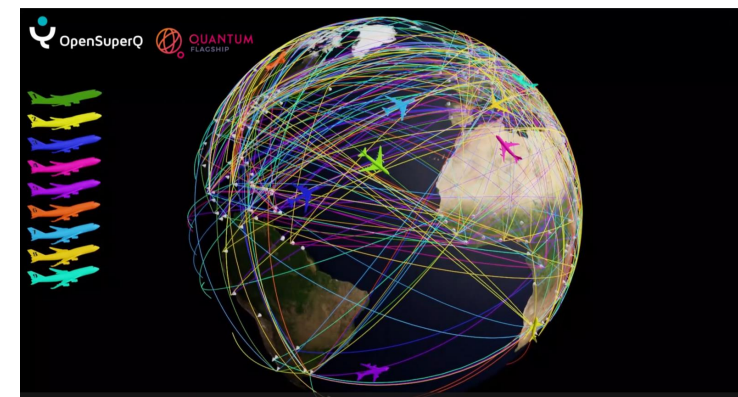
Willsch et al. (2022)
CPC 278, 108411
arXiv:2104.03293



GATE-BASED QUANTUM COMPUTING

Application: Tail Assignment (Airline Scheduling)

Find optimal flight schedule
such that each flight is covered
exactly once



	Flight 0	Flight 1	Flight 2	Flight 3	Flight 4	Flight 5	...	Flight 469	Flight 470	Flight 471
Route 0	0	1	0	0	0	0		0	0	0
Route 1	0	0	0	0	1	0		0	0	0
...										
Route 10	0	0	0	0	0	1		0	0	1
Route 11	0	0	1	0	0	0		0	0	0
Route 12	0	0	0	1	0	0		1	0	0
Route 13	0	0	1	0	0	0		0	0	0
Route 14	0	0	0	1	0	0		0	0	0
Route 15	0	0	0	0	1	0		0	0	0
Route 16	0	1	0	0	0	0		0	1	0
...										
Route 37	0	0	0	0	0	1		0	0	0
Route 38	0	0	0	1	0	0		0	0	0
Route 39	0	0	0	1	0	0		0	0	0

→ Solved using QAOA with 40 qubits (on JUQCS)

QUANTUM ANNEALERS

What do they do?



Quadratic Unconstrained
Binary Optimization

QUBO:

$\min_{x_i=0,1}$

problem
variables
(binary)

“coupler”
(real number)

“bias”
(real number)

$$\left(\sum_i a_i x_i + \sum_{i < j} b_{ij} x_i x_j \right)$$

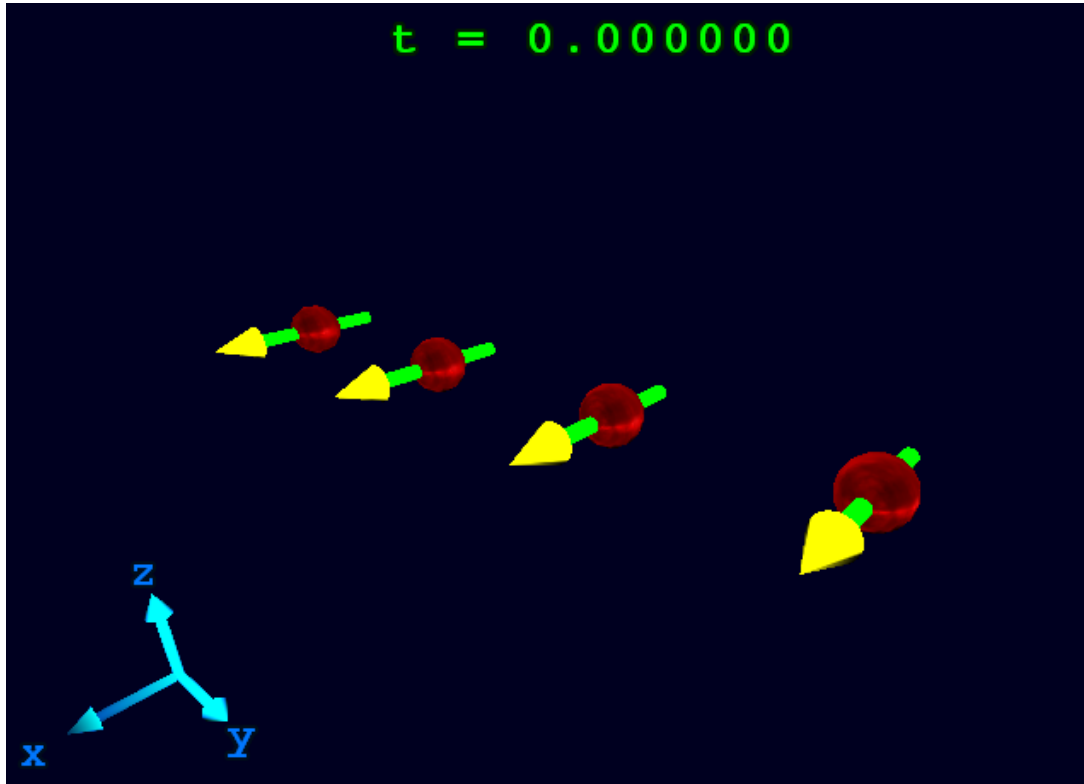
Why might this be interesting?

- discrete optimization is **hard** (NP-hard)
- produces **many solutions** simultaneously
- very **low energy** consumption

QUANTUM ANNEALERS

How do they work?

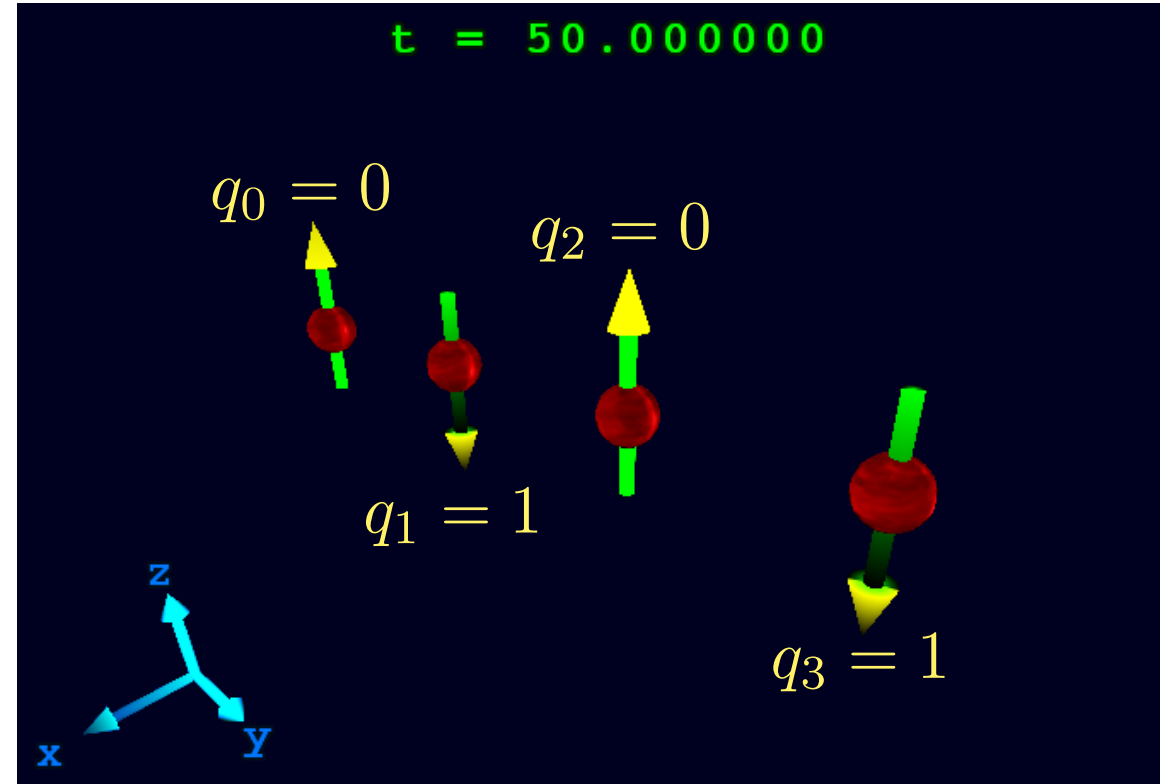
Before the annealing process



QUBO :

$$\min_{q_0 q_1 q_2 q_3} \left(\sum_i a_i q_i + \sum_{i < j} b_{ij} q_i q_j \right) = \text{????}$$

After the annealing process



Quantum Annealing

QUANTUM ANNEALERS: APPLICATIONS

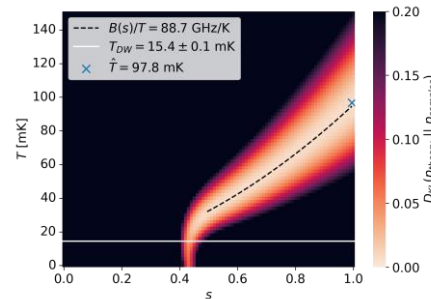
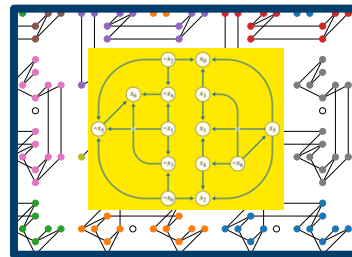
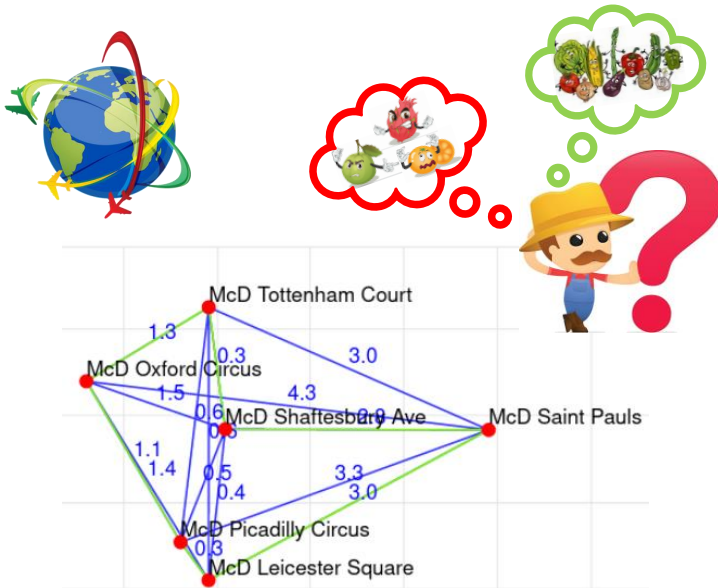
1. Airline Scheduling
2. Traveling Salesman
3. Garden Optimization
4. 2-Satisfiability
5. QSVM
6. QBM

optimization problem
with constraints
[increasing complexity]

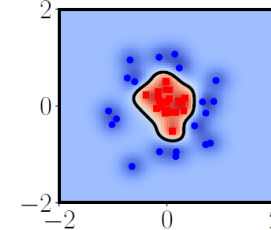
constraints only

optimization only [basically]

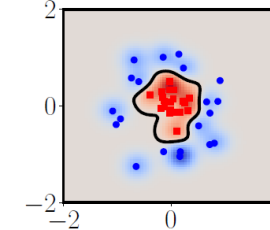
sampling problem



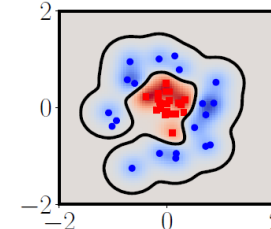
(a) cSVM



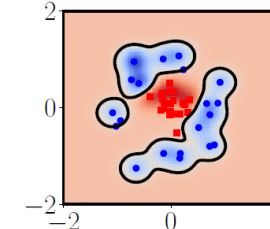
(b) qSVM#1



(c) qSVM#6



(d) qSVM#16



Video:
<https://youtu.be/ieEXs9gbioY>

JUNIQ Rolling Call:



or search for
“FZJ JUNIQ ACCESS”



QUANTUM ANNEALERS: APPLICATIONS

Traveling Salesman Problem



$$\min_{x_i=0,1} \left(\sum_i a_i x_i + \sum_{i<j} b_{ij} x_i x_j \right)$$

Cost to
travel from
city i to city j

time steps
cities

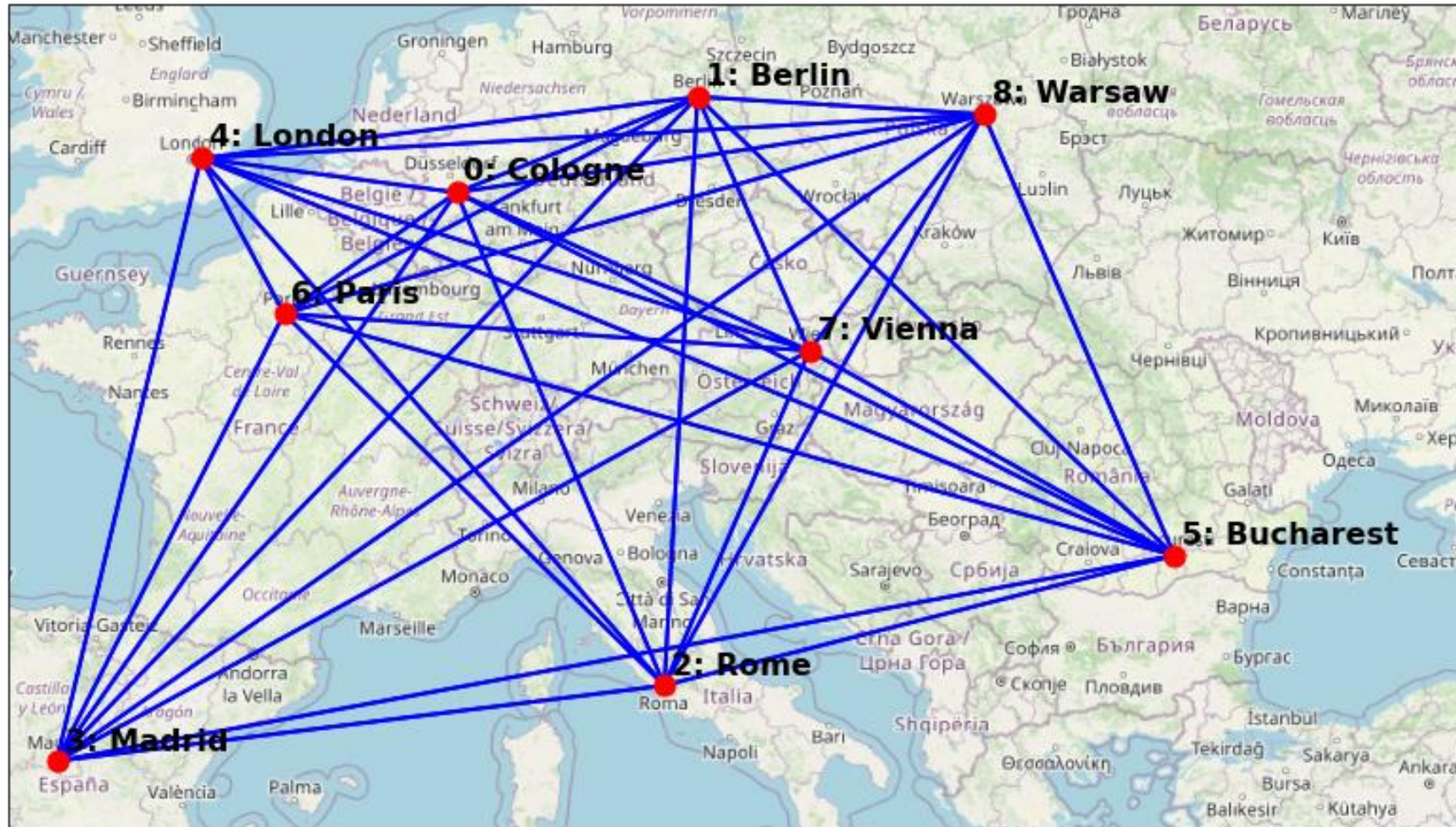
	0	1	2	3
A	1	0	0	0
B	0	0	0	1
C	0	1	0	0
D	0	0	1	0

$$\min_{x_{it}=0,1} \left\{ \lambda \sum_{i=0}^{n-1} \sum_{\substack{j=0 \\ j \neq i}}^{n-1} \sum_{t=0}^{n-1} c_{ij} x_{it} x_{j(t+1)} \right. \\ \left. + \sum_{i=0}^{n-1} \left(\sum_{t=0}^{n-1} x_{it} - 1 \right)^2 \right. \\ \left. + \sum_{t=0}^{n-1} \left(\sum_{i=0}^{n-1} x_{it} - 1 \right)^2 \right\}$$

- Assign cities & times to qubits:
 - Qubit $x_{it} = 1$ means the traveler is at city i at time t
 - Count the cost c_{ij} if the traveler goes from i to j at some time step
 - Traveler must pass city i only once
 - Traveler can only be at one city at each time step
- Not the DFJ formulation: linear but exp. many inequality constraints
- Could simplify by fixing starting point
→ Number of qubits $(n-1)^2$

QUANTUM ANNEALERS

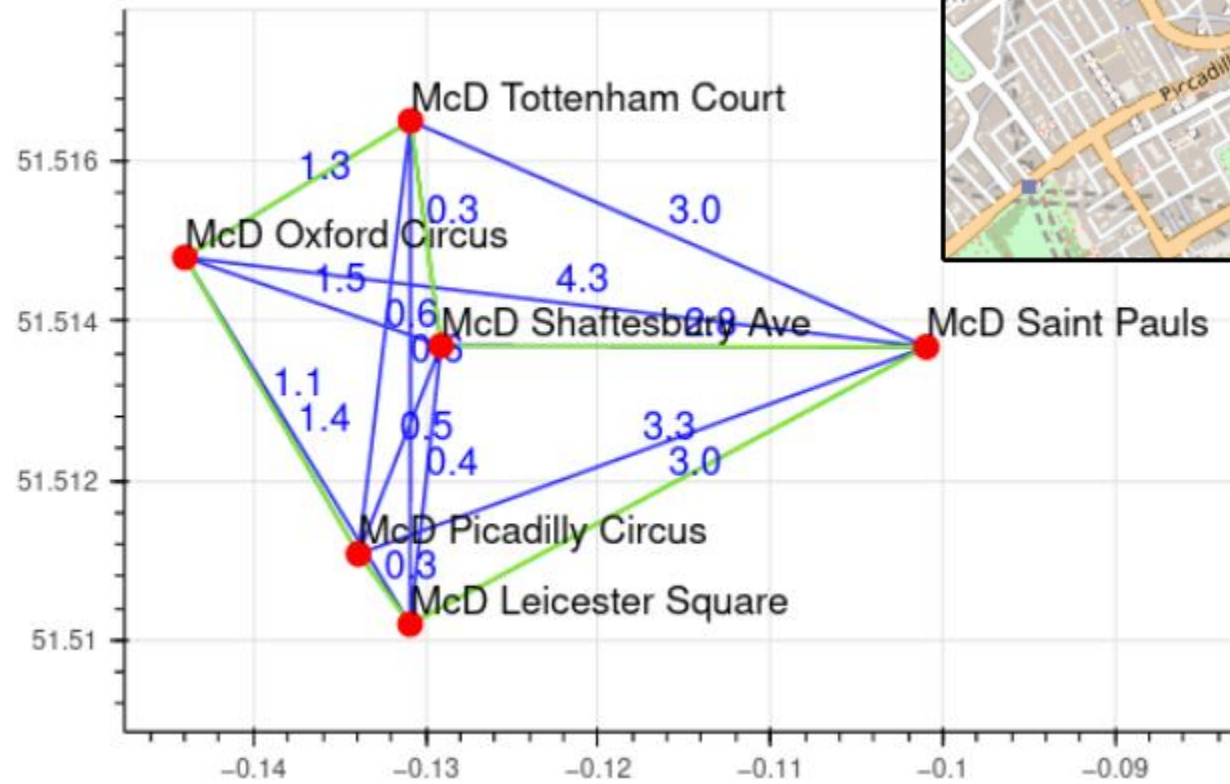
Traveling Salesman Problem



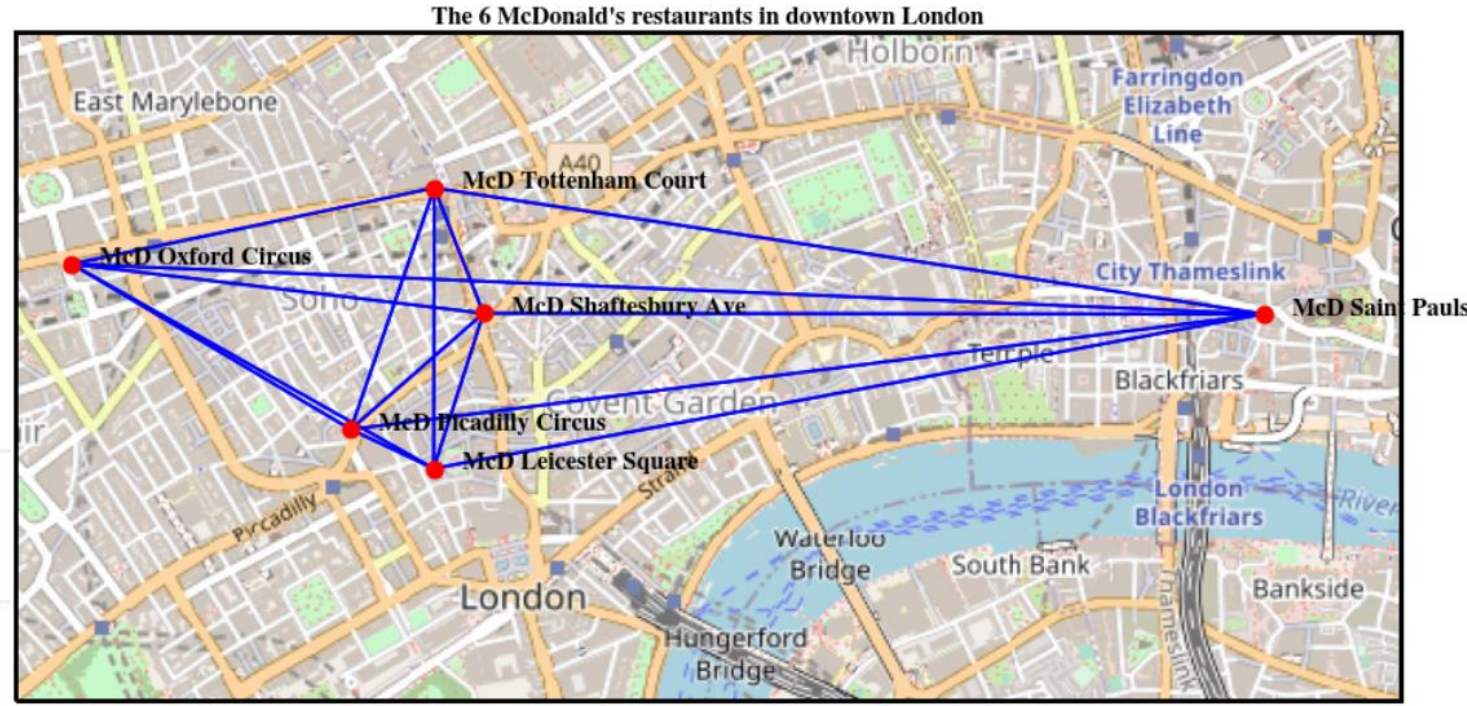
QUANTUM ANNEALERS

Traveling Salesman Problem

Latitude



Longitude



QUANTUM ANNEALERS: APPLICATIONS

Willsch et al., CPC 248, 107006 (2020)
Cavallaro et al., IGARSS 2020, 1973 (2020)
Delilbasic et al., IGARSS 2021, 2608 (2021)

Quantum Support Vector Machines: Application to Remote Sensing



QUANTUM ANNEALERS: APPLICATIONS

Quantum Support Vector Machines: Application to Remote Sensing

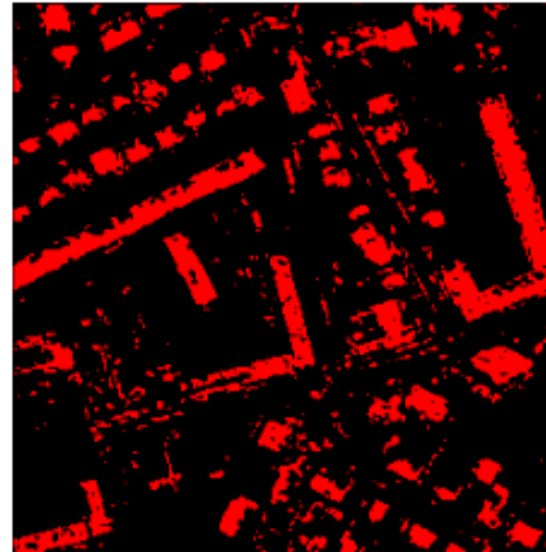
False color



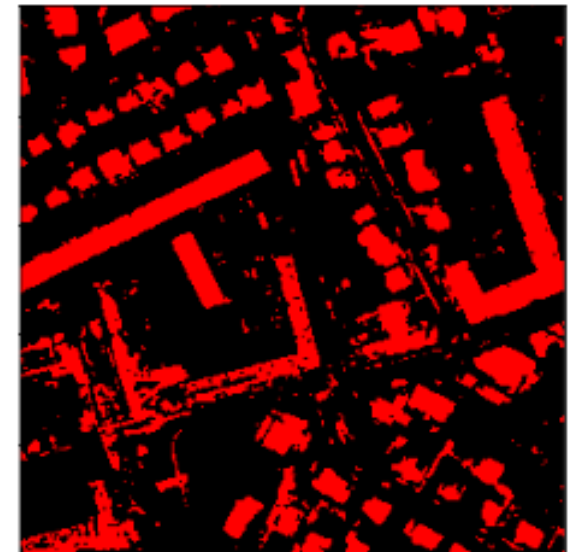
Ground truth



Classical SVM



Quantum SVM



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Forschungszentrum

JUNIQ
QUANTUM USER FACILITY

THANK YOU FOR YOUR ATTENTION



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