# Adiabatic Quantum Computation at D-Wave Systems Inc.

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MA 591 Special Topics in Quantum Computation



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### Outline

### Adiabatic Quantum Computation

Adiabatic Theorem
Application of Adiabatic Theorem

D-Wave

### D-Wave

Background Chimera C4 Chip Applications

### Controversy

Is it Really a Quantum Computer? Complexity Theory



### Outline

### Adiabatic Quantum Computation

### Adiabatic Theorem

Application of Adiabatic Theorem

Chimera C4 Chip

**Applications** 



Adiabatic Theorem

### Adiabatic Theorem

Max Born and Vladimir Fock (1928)

A physical system remains in its instantaneous eigenstate if a given perturbation is acting on it slowly enough and if there is a gap between the eigenvalue and the rest of the Hamiltonian's spectrum.

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Application of Adiabatic Theorem

# Outline

### Adiabatic Quantum Computation

Adiabatic Theorem

Application of Adiabatic Theorem

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Chimera C4 Chip **Applications** 



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Adiabatic Quantum Computation

# Application

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Quantum systems evolve according to the Schrödinger equation.

$$i\frac{d}{dt}|\psi(t)\rangle = \mathcal{H}(t)|\psi(t)\rangle$$

- ▶ Start with  $|\psi(0)\rangle$  as the ground state of  $\mathcal{H}(0)$ .
- If there is a non-zero gap between  $|\psi(0)\rangle$  and the next



Application of Adiabatic Theorem

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- ▶ Start with  $|\psi(0)\rangle$  as the ground state of  $\mathcal{H}(0)$ .
- If there is a non-zero gap between  $|\psi(0)\rangle$  and the next lowest energy level as long as  $\mathcal{H}(t)$  varies slowly enough (i.e. little energy is added to the system)  $|\psi(t)\rangle$  will remain close to the instantaneous ground state of  $\mathcal{H}(t)$ .



Adiabatic Quantum Computation

# Application

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# The Magic

- ► Encode the solution in the ground state of a problem Hamiltonian  $\mathcal{H}_P$ .
  - ▶ Specifying  $\mathcal{H}_P$  is easy but finding its ground state is difficult.
- ► Choose an initial Hamiltonian  $\mathcal{H}_B$  whose ground state is easy to find.
- Construct the system:

$$\mathcal{H}(t) = (1 - t/T)\mathcal{H}_B + (t/T)\mathcal{H}_P$$

Where T is a parameter to control the rate at which  $\mathcal{H}(t)$  varies. Normalized to  $\tilde{\mathcal{H}}(s)$ ,  $0 \le s \le 1$ :

$$\mathcal{\tilde{H}}(s) = (1-s)\mathcal{H}_B + s\mathcal{H}_F$$

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Application of Adiabatic Theorem

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### Outline

Adiabatic Theorem Application of Adiabatic Theorem

D-Wave

### D-Wave

### Background

Chimera C4 Chip **Applications** 



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# History

- Founded in 1999 by:
  - Haig Farris
  - Geordie Rose (CTO)
  - Bob Wiens (former CFO)
  - Alexandre Zagoskin (Chief Scientist)
- Started as an off-shoot of the University of British Columbia funding academic research in quantum computing.
- Currently located in Burnaby, British Columbia.



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Adiabatic Quantum Computation

- Find low cost solutions to Quadratic Unconstrained Binary Optimization (QUBO) problems.
  - arXiv:quant-ph/0001106v1 3-SAT
  - NPC controversy
- Equivalent to finding low energy states of classical Ising

$$\mathcal{H} = \sum_{i} h_{i} \sigma_{zi} + \sum_{ij} J_{ij} \sigma_{zi} \sigma_{zj}$$

Find a reasonable way to do it

### Goals

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### Outline

Adiabatic Theorem Application of Adiabatic Theorem

D-Wave •0000

### D-Wave

Chimera C4 Chip

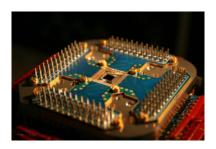
**Applications** 



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Chimera C4 Chip

### Infrastructure



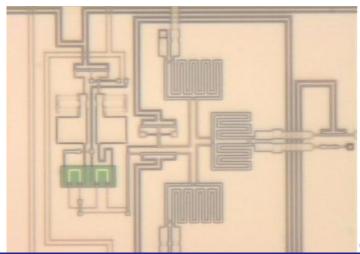
- Superconducting metals operating at ultra low temperatures
- Manufactured with existing fabrication techniques





Chimera C4 Chip

# The Qubit





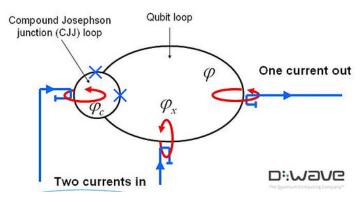
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### **Schematic**

### Device schematic: Niobium CJJ RF-SQUID flux qubit

D-Wave ○○○ ○○○

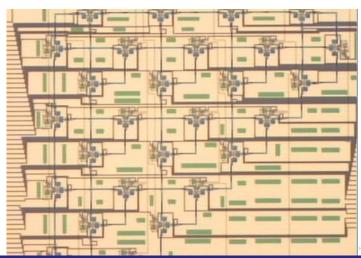






Chimera C4 Chip

# System



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### Outline

Adiabatic Theorem Application of Adiabatic Theorem

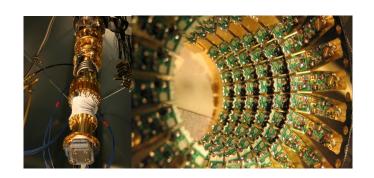
### D-Wave

Chimera C4 Chip **Applications** 



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### Orion



- 16 qubit System
  - www.apps.dwavesys.com
  - Orion web services API



D-Wave

Applications

# Google's Interest

- Image matching
  - Google Goggles
  - Face Recognition
- Machine learning
  - Recognizing cars



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Chimera C4 Chip
Applications

### Controversy

Is it Really a Quantum Computer?

Complexity Theory



- 1. A scalable physical system with well characterized qubits
- The ability to initialize state
- 3. Long relevant decoherence times
- 4. Universal set of quantum gates
- The ability to measure specific qubits



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Adiabatic Quantum Computation

### DiVincenzo

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Adiabatic Quantum Computation

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Chimera C4 Chip **Applications** 

### Controversy

Complexity Theory



$$P == NP?$$

Adiabatic Quantum Computation

- ► QUBQ ⊃ P
- ► Aharonov, van Dam, et al. adiabatic quantum computation
- Problems with simulated annealing
  - QUBO solutions are only NP-Hard



$$P == NP?$$

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- Goldstone, Gutmann, and Sipser adiabatic algorithmic solution for 3-SAT
- Aharonov, van Dam, et al. adiabatic quantum computation is equivalent to standard quantum computation (NMR)
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- Adiabatic quantum computation is feasible because of long decoherence times
- Systems can be built with existing manufacturing techniques.

D-Wave

- The Chimera C4 chip has been demonstrated successfully.
- The actual quantum nature of the system is controversial.
- Outlook
  - D-Wave has yet to produce a fully entangled system due to bus connectivity issues.
  - The backend of Orion is still a simulation but should be up and running soon.



### More Resources I



D. Aharonov, W. vanDam, J. Kempe, Z. Landau, S. Lloyd,

O. Regev

Adiabatic Quantum Computation is Equivalent to Standard Quantum Computation.

arXiv:guant-ph/0405098v2,2005.



D. DiVincenzo.

The Physical Implementation of Quantum Computation. arXiv:guant-ph/0002077v3,2000.



E. Farhi, J. Goldstone, S. Gutmann, M. Sipser Quantum Computation by Adiabatic Evolution. arXiv:guant-ph/0001106v1,2000.

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### More Resources II



R. Harris et al.

Experimental Demonstration of a Robust and Scalable Flux Qubit

arXiv:0909.4321v1 [cond-mat.supr-con],2009.



H. Neven

Machine Learning with Quantum Algorithms http://googleresearch.blogspot.com/2009/12/machine-learning-with-quantum.html,2009.



G. Rose rose.blog

http://dwave.wordpress.com/

### More Resources III



H. Neven, G. Rose
Google Tech Talks: Quantum Computing
http://www.youtube.com/watch?v=I56UugZ<sub>8</sub>DIfeature = channel, 2007.



D-Wave Systems Inc. http://www.dwavesys.com/

