

# The Church-Turing thesis in a quantum world

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# Introduction

## Quantum complexity theory [Bernstein and Vazirani '97]

Just as the theory of computability has its foundations in the Church-Turing thesis, computational complexity rests on a modern **strengthening** of this thesis, which asserts that any “reasonable” model of computation can be **efficiently** simulated on a probabilistic Turing machine...

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However, the Turing Machine fails to capture all physically realizable computing devices for a fundamental reason: the Turing Machine is based on a classical physics model of the Universe, whereas current physical theory asserts that the Universe is **quantum physical**.

What does this imply for the Church-Turing thesis?

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Quantum computers **can** be simulated by classical computers (with exponential slowdown).

- In fact, in terms of complexity theory, we even have  **$BQP \subseteq PSPACE$** : quantum computers can be simulated space-efficiently by classical computers.
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However, there are certain quantum computations which we don't know how to simulate classically **without** exponential slowdown.

- The canonical example is **factoring**: Shor's quantum algorithm factorises an  $n$ -digit integer in time  $\text{poly}(n)$ , but the best known classical algorithm takes time super-polynomial in  $n$ .
- So quantum computers pose a significant challenge to the **strong** Church-Turing thesis.

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- The ability of quantum computers to simulate **physical systems** which we don't know how to simulate efficiently classically;
- Models of computation where quantum computers **provably** outperform classical computers;
- How quantum computation helps us understand **classical** complexity theory.

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- What we will take simulation to mean here is approximating the **dynamics** of a physical system.
- We are given a description of a system, and would like to determine something about its state at time  $t$ .

## Simulating physical systems

- According to the laws of quantum mechanics, time evolution of the state  $|\psi\rangle$  of a quantum system is governed by Schrödinger's equation,

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

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- Given  $H$  specifying a physical system, we would like to approximate the operator

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- However, with a quantum computer we can approximate  $U(t)$  for the physically meaningful class of  **$k$ -local** Hamiltonians.
- These are Hamiltonians which are given by a sum of terms describing interactions between at most  $k = O(1)$  particles. So  $H$  is described by a set of  **$O(1)$ -dimensional** matrices.

# The quantum simulation algorithm (sketch)

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4 Perform a measurement to extract information from  $|\widetilde{\psi}(t)\rangle$ .

# Provable separations

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- One model in which separations are **provable** is the model of **query** complexity.
- In this model, we want to compute a known function  $f(x)$  using the smallest possible **worst-case** number of queries to the unknown input  $x \in \{0, 1\}^n$ .

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- We have access to  $x$  via an oracle which, given input  $i$ , returns the bit  $x_i$ . We allow the use of randomness and some probability of failure (e.g. up to  $1/3$ ).

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- We have access to  $x$  via an oracle which, given input  $i$ , returns the bit  $x_i$ . We allow the use of randomness and some probability of failure (e.g. up to  $1/3$ ).
- For some functions  $f$ , clever strategies can allow us to compute  $f(x)$  using far fewer than  $n$  queries.

# Query complexity

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- For example, the OR function ( $f(x) = 1 \Leftrightarrow x \neq 0$ ) can be computed using  $O(\sqrt{n})$  quantum queries using **Grover's algorithm** [Grover '97].
- However, it is easy to see that any classical algorithm requires  $\Omega(n)$  queries.

# Knowns and unknowns

We know that:

- If  $f$  is a **partial** function (i.e. the algorithm is allowed to fail on certain inputs  $x$ ), quantum query complexity can be exponentially smaller than classical query complexity (e.g. [Simon '94]).

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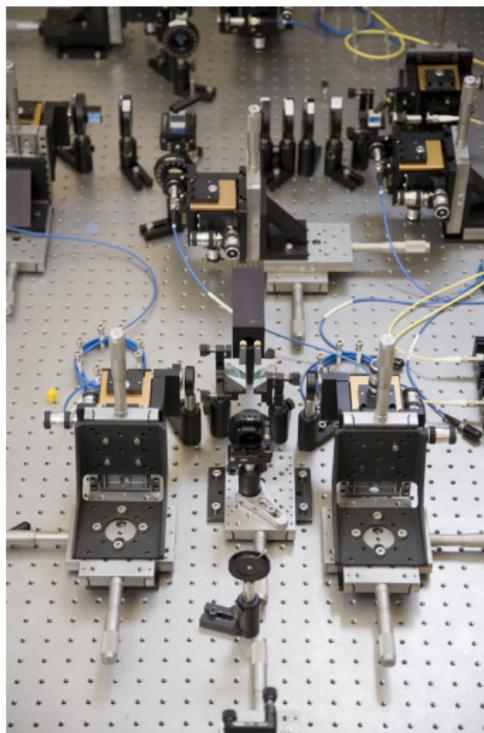
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But there are still many open questions, such as:

- Can we achieve better than a **quadratic** separation for total functions?
- If the algorithm must succeed with certainty on all inputs, can we achieve better than a **constant factor** separation? (see [AM, Jozsa and Mitchison '11] for some examples of such separations).

# A world without quantum computers?

- Small-scale quantum computers already exist in the lab.
- But what if we never manage to build **large-scale** quantum computers?
- Or what if quantum computers turn out to be easy to simulate classically?
- Studying quantum computing nevertheless has implications for the rest of computer science.



# A computational hardness result

- Let  $T$  be a 3-index tensor, i.e. a  $d \times d \times d$  array of complex numbers, such that  $\sum_{i,j,k} |T_{ijk}|^2 = 1$ .
- The **injective tensor norm** of  $T$  is defined as

$$\|T\|_{\text{inj}} := \max_{\substack{x,y,z, \\ \|x\|=\|y\|=\|z\|=1}} \left| \sum_{i,j,k=1}^d T_{ijk} x_i y_j z_k \right|.$$

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## Theorem [Harrow & AM '11]

Assume that the (NP-complete) problem 3-SAT on  $n$  clauses can't be solved in time subexponential in  $n$ . Then there are universal constants  $0 < s < c < 1$  such that distinguishing between  $\|T\|_{\text{inj}} \leq s$  and  $\|T\|_{\text{inj}} \geq c$  can't be done in time  $\text{poly}(d)$ .

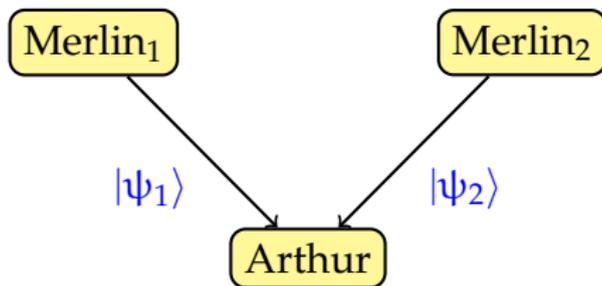
Many other problems in tensor optimisation reduce to computing injective tensor norms.

## The proof strategy

Surprisingly, the proof is based on quantum computing – specifically, the framework of **quantum Merlin-Arthur games**.

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- Arthur has a hard decision problem to solve and has access to two separate provers (“Merlins”), who are all-powerful but **cannot be trusted**.
- The Merlins want to convince Arthur that the answer to the problem is “yes”. Each of them sends Arthur a quantum state (“proof”). He then runs a quantum algorithm to **check** the proofs.

## The proof strategy

- Unlike the situation classically, two Merlins may be more powerful than one: the lack of entanglement helps Arthur tell when the Merlins are cheating.

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- And it turns out that the maximal probability with which the Merlins can convince Arthur to output “yes” is given by the injective tensor norm of a tensor  $T$ .
- So, if we could compute  $\|T\|_{\text{inj}}$  up to an additive constant in time  $\text{poly}(d)$ , we would have a subexponential-time algorithm for 3-SAT!

## Other classical results with quantum proofs

Some other purely classical problems have quantum solutions.

- Classical communication complexity of the inner product function
- Lower bounds on locally decodable codes
- Rigidity of Hadamard matrices
- Finding low-degree approximating polynomials
- Closure properties of complexity classes
- ...

For many more, see the survey “Quantum proofs for classical theorems” [[Drucker and de Wolf '09](#)].

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Thanks!