

ルガルフランソワ

京都大学 情報学研究科

量子情報·物性の新潮流 2018年8月2日



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- 2016年~ 京都大学大学院情報学研究科 特定准教授
 研究テーマ:量子計算、分散計算

量子計算の歴史



- quantum algorithms with amplitude amplification [Brassard+ 1999]
- quantum algorithms for element disjointness [Ambainis 2002]
- quantum algorithms for Gauss sums [van Dam + 2002]
- quantum algorithms for solving Pell's equation [Hallgren 2002]
- quantum algorithms for quantum simulations [Childs 2004]
- quantum algorithms for hidden subgroups [Kuperberg 2004]
- o quantum algorithms for finding an unit group [Hallgren 2005]
- o quantum algorithms for triangle finding [Magniez+ 2005]
- o quantum algorithms for computing knot invariants [Aharonov+ 2006]
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- o quantum algorithms for hidden nonlinear structures [Childs+ 2007]
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- o quantum algorithms for group isomorphism [Le Gall 2010]
- quantum algorithms for matrix multiplication [Le Gall 2011]
- quantum algorithms using span programs [Belovs 2011]
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- guantum algorithms for distributed computation 0
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量子アルゴリズム園

https://math.nist.gov/guantum/zoo/

This is a comprehensive catalog of quantum algorithms. If you notice any errors or omissions, please email me at stephen.jordan@nist.gov. Your help is appreciated and will be acknowledged

Algebraic and Number Theoretic Algorithms

Algorithm: Factoring

Speedup: Superpolynomial

Description: Given an n-bit integer, find the prime factorization. The quantum algorithm of Peter Shor solves this in $\widetilde{O}(n^3)$ time [82,125]. The fastest known classical algorithm for integer factorization is the general number field sieve, which is believed to run in time $2^{\widetilde{O}(n^{1/3})}$. The best rigorously proven upper bound on the classical complexity of factoring is $O(2^{n/3+o(1)})$ [252]. Shor's factoring algorithm breaks RSA public-key encryption and the closely related quantum algorithms for discrete logarithms break the DSA and ECDSA digital signature schemes and the Diffie-Hellman key-exchange protocol. A quantum algorithm even faster than Shor's for the special case of factoring "semiprimes", which are widely used in croptography is given in [271]. There are proposed classical public-key cryptosystems not believed to be broken by quantum algorithms, cf. [248]. At the core of Shor's factoring algorithm is order finding, which can be reduced to the Abelian hidden subgroup problem, which is solved using the quantum Fourier transform. A number of other problems are known to reduce to integer factorization including the membership problem for matrix groups over fields of odd order [253], and certain diophantine problems relevant to the synthesis of quantum circuits [254].

Algorithm: Discrete-log

Speedup: Superpolynomial

Description: We are given three *n*-bit numbers *a*, *b*, and *N*, with the promise that $b = a^s \mod N$ for some s. The task is to find s. As shown by Shor [82], this can be achieved on a quantum computer in poly(n) time. The fastest known classical algorithm requires time superpolynomial in n. By similar techniques to those in [82], guantum computers can solve the discrete logarithm problem on elliptic curves, thereby breaking elliptic curve cryptography [109]. The superpolynomial quantum speedup has also been extended to the discrete logarithm problem on semigroups [203, 204]. See also Abelian Hidden Subaroup.

Algorithm: Pell's Equation

Speedup: Superpolynomial

Description: Given a positive nonsquare integer *d*, Pell's equation is $x^2 - dy^2 = 1$. For any such *d* there are infinitely many pairs of integers (x, y) solving this equation. Let (x_1, y_1) be the pair that minimizes $x + y\sqrt{d}$. If d is an n-bit integer (*i.e.* $0 \le d < 2^n$), (x_1, y_1) may in general require



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行列積に対する量子アルゴリズム

疎行列に対して古典計算より速い

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行列積に対する量子アルゴリズム

疎行列に対して古典計算より速い

行列の固有値を高速に 求める量子アルゴリズム

量子機械学習へ応用の可能性も

0	quantum algorithms with amplitude amplification [Brassard+ 1999]		
0	quantum algorithms for element disjointness [Ambainis 2002]		
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0	quantum algorithms for quantum simulations [Childs 2004]		
0	quantum algorithms for hidden subgroups [Kuperberg 2004]		 晶子化学 創薬へ応用?
0	quantum algorithms for finding an unit group [Hallgren 2005]		
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行列積に対する量子アルゴリズム

ほとんどは大規模量子コンピュータ向けのアルゴリズム

小規模量子コンピュータのできるもの

✔ 量子アニーリング

✔ 量子系のシミュレーション

➡子化学、創薬への応用を目指す… 高い精度が求まれて、まだ難しい…

✓ とりあえず小規模量子コンピュータの優位性を示そう:

小規模量子コンピュータで簡単に解けて、 古典計算では解けない人工的な問題を作ろう

現在のコンピュータより

凍く



量子アルゴリズムの理論研究の潮流

引き続き、大規模量子コンピュータ向けの量子アルゴリズムの開発

量子分散計算の枠組みで研究

✓ 重要な計算問題を対象とする

✔ 実装のし易さを特に求めない

QUANTUM SUPREMACY

(小~中規模量子コンピュータの優位性の確立)

_____ 量子分散計算を用いて研究

✓ 人工的な計算問題でも良い

✔ 実装のしやすさを重視

進行中のプロジェクト:量子分散計算 (クラウド量子計算)

[Izumi and <u>Le Gall</u> 2017] [<u>Le Gall</u> and Magniez 2018] [<u>Le Gall</u>, Nishimura and Rosmanis 2018]



引き続き、大規模量子コンピュータ向けの量子アルゴリズムの開発

量子分散計算の枠組みで研究

F. Le Gall and F. Magniez. **Sublinear-Time Quantum Computation of the Diameter in Distributed Networks**. Proceedings of the 37th ACM Symposium on Principles of Distributed Computing (PODC 2018). Also arXiv: 1804.02917.

分散計算の重要な問題に対して、 古典分散アルゴリズムより高速な量子分散アルゴリズムを初めて与えた

Outline: Quantum Distributed Computing

- From the perspective of <u>computability and computational complexity</u>, quantum distributed computing has mostly been studied in the framework of 2-party communication complexity
- ✓ Relatively few results focusing on more than two parties:
 - exact quantum protocols for leader election on anonymous networks [Tani, Kobayashi, Matsumoto 2007]
 - study of quantum distributed algorithms on non-anonymous networks

[Gavoille, Kosowski, Markiewicz 2009] [Elkin, Klauck, Nanongkai, Pandurangan 2014]

<u>negative results</u>: show impossibility of quantum distributed computing faster than classical distributed computing for many important problems (shortest paths, minimum spanning tree,...)

Question: can quantum distributed computing be useful? (on non-anonymous networks)

Our result: Yes, we can compute the diameter of the network faster!

Eccentricity and Diameter

Consider an undirected and unweighted graph G = (V,E) with n nodes

The diameter of the graph is the maximum distance between two nodes

 $D = \max_{u,v \in V} \{d(u,v)\}$ -d(u,v) = distance between u and v



(直径)

Eccentricity and Diameter

Consider an undirected and unweighted graph G = (V,E) with n nodes

The <u>diameter</u> of the graph is the maximum distance between two nodes (直径)

$$D = \max_{u,v \in V} \{d(u,v)\}$$

= max {ecc (u)}
 $u \in V$ $d(u,v) = distance between u and v$

The eccentricity of a node u is defined as



Classical Distributed Computation of the Eccentricity

Let's write n = number of nodes

- ✓ Each node represents a processor (with a unique ID)
- ✓ Each edge represents a classical channel
- \checkmark At each round only one short (i.e., $O(\log n)$ bits) message sent to each neighbor

CONGEST model (most standard model of synchronous distributed computation) Complexity: the <u>number of rounds</u> needed for the computation Computing eccentricities and the diameter are among the most fundamental tasks

example: at each round, a can send one message to c

b can send one message to c

c can send one message to a, one to b, one to d and one to e

ecc(a) = 3

ecc(b) = 3

ecc(c) = 2

ecc (d) = 3

ecc(e) = 3

ecc(f) = 4

ecc(g) = 4

D = 4



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CONGEST model (most standard model of synchronous distributed computation) Complexity: the <u>number of rounds</u> needed for the computation Computing eccentricities and the diameter are among the most fundamental tasks

example: computation of ecc (a)

the state of the s



Computation of ecc (u):

Starting with u, each node broadcasts its distance to u to its neighbors. (Each node knows its distance to u the first time it receives a message.)

complexity: ecc (u) rounds

The nodes then compute the maximum of their distance (easy)

Classical Distributed Computation of the Diameter

Let's write n = number of nodes

- ✓ Each node represents a processor (with a unique ID)
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CONGEST model (most standard model of synchronous distributed computation) Complexity: the <u>number of rounds</u> needed for the computation Computing eccentricities and the diameter are among the most fundamental tasks



Computation of the diameter D:

All the nodes compute simultaneously their eccentricity <u>using standard</u> <u>techniques to handle congestions</u>

complexity: Θ(n) rounds (even if D is constant) [Holzer+12, Peleg+12]

Output the maximum eccentricity

Computation of the Diameter

main result: sublinear-round quantum computation of the diameter whenever D=o(n) (our algorithm uses O((log n)²) qubits of quantum memory per node)

first gap between classical and quantum for an important problem in the CONGEST model of distributed computing

	Classical	Quantum (our results)				
Exact computation (upper bounds)	O(n) [Holzer+12, Peleg+12]	$O(\sqrt{nD})$				
number of rounds needed to compu Exact computation (lower bounds)	te the diameter (n: numbe $\Omega(n)$ [Frischknecht+12]	$\widetilde{\Omega}(\sqrt{n}^{+}D)^{iameter)}$ [unconditional] $\widetilde{\Omega}(\sqrt{n}D)$ [conditional]				
number of rounds needed to compute the diameter (n: number of nodes, D: diameter) condition: holds for algorithms using only polylog(n) the tilde notation removes polylog(n) factors qubits of memory per node						
3/2-approximation (upper bounds)	$O(\sqrt{n} + D)$ [Lenzen+13,Holzer+14]	$O(\sqrt[3]{nD} + D)$				
$(3/2-\varepsilon)$ -approximation (lower bounds)	$\widetilde{\Omega}(n)$ [Holzer+12,Abboud+16]	$\widetilde{\Omega}(\sqrt{n} + D)$ [unconditional]				

Our Upper Bound

main result: sublinear-round quantum computation of the diameter whenever D=o(n) (our algorithm uses O((log n)²) qubits of quantum memory per node)

first gap between classical and quantum for an important problem in the CONGEST model of distributed computing

	Classical	Quantum (our results)
Exact computation (upper bounds)	O(n) [Holzer+12, Peleg+12]	$O(\sqrt{nD})$

number of rounds needed to compute the diameter (n: number of nodes, D: diameter)

Quantum Distributed Computation of the Diameter

Let's write n = number of nodes

- ✓ Each node represents a quantum processor (with a unique ID)
- ✓ Each edge represents a quantum channel
- \checkmark At each round only one short ($O(\log n)$ qubits) message sent to each neighbor

quantum CONGEST model Complexity: the <u>number of rounds</u> needed for the computation



Quantum Distributed Computation of the Diameter

Let's write n = number of nodes

- ✓ Each node represents a quantum processor (with a unique ID)
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quantum CONGEST model Complexity: the <u>number of rounds</u> needed for the computation

Computation of the diameter (decision version)

Given an integer d, decide if diameter \geq d

there is a vertex u such that ecc $(u) \ge d$

This is a search problem, so we can try to use Grover search:

Find an element $u \in V$ such that f(u) = 1 with $f(u) = \begin{cases} 1 & \text{if ecc } (u) \ge d \\ 0 & \text{otherwise} \end{cases}$

Usual Grover Algorithm (from Nielsen-Chuang, page 251)



Usual Grover Algorithm (from Nielsen-Chuang, page 251)





Implementation of the Oracle in O(D) rounds

$$\sum_{u \in V} \alpha_u |u\rangle_a |0\rangle_a \left\{ \boxed{=} \text{oracle} \\ \boxed{=} \right\} \sum_{u \in V} \alpha_u |u\rangle_a |ecc(u)\rangle_a$$



Initially node a owns $\sum_{u \in V} \alpha_u |u\rangle_a$

1. "Broadcast" this state, which gives $[ecc(a) \le D rounds]$

$$\sum_{u \in V} \alpha_u |u\rangle_a |u\rangle_b |u\rangle_c |u\rangle_d |u\rangle_e |u\rangle_f |u\rangle_g$$

 The nodes implements the classical protocol [≤ D rounds] for computing the eccentricity, which gives

 $\sum_{u \in V} \alpha_u |u\rangle_{\mathbf{a}} |u\rangle_{\mathbf{b}} |u\rangle_{\mathbf{c}} |u\rangle_{\mathbf{d}} |u\rangle_{\mathbf{e}} |u\rangle_{\mathbf{f}} |u\rangle_{\mathbf{g}} |ecc(u)\rangle_{\mathbf{a}}$

3. The nodes revert Step 1

 $[ecc(a) \le D rounds]$

Usual Grover Algorithm (from Nielsen-Chuang, page 251)



The Upper Bound

- ✓ We have just described a O(\sqrt{n} x D)-round quantum distributed algorithm for computing (with high probability) the diameter
- \checkmark With further work, the complexity can be reduced to $O(\sqrt{nD})$ rounds



The Lower Bounds



- node, then the computation of DISJOINTNESS can be done using few messages
- ✓ the (two-party) r-message communication complexity of DISJOINTNESS is $\Omega(r + n/r)$ qubits [Braverman+15]

Quantum Computation of the Diameter: Summary

main result: sublinear-round quantum computation of the diameter

first gap between classical and quantum for an important problem in the CONGEST model of distributed computing

	Classical	Quantum (our results)
Exact computation (upper bounds)	O(n) [Holzer+12, Peleg+12]	$O(\sqrt{nD})$
Exact computation (lower bounds)	$\widetilde{\Omega}(n)$ [Frischknecht+12]	$\widetilde{\Omega}(\sqrt{n}+D)$ [unconditional] $\widetilde{\Omega}(\sqrt{nD})$ [conditional]

number of rounds needed to compute the diameter (n: number of nodes, D: diameter)

Our upper bounds are obtained by showing how to implement quantum
3/2-approximation (upper bounds)
search in a distributed setting
(Jenzen+13,Holzer+14]how to implement quantum
 $\Omega(\sqrt{nD} + D)$ Interesting research direction: find other applications of this technique
 $\widetilde{\Omega}(n)$ $\widehat{\Omega}(\sqrt{n} + D)$ [unconditional](3/2- ε)-approximation (lower bounds) $\widehat{\Omega}(n)$
(Holzer+12,Abboud+16] $\widehat{\Omega}(\sqrt{n} + D)$ [unconditional]



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量子分散計算の枠組みで研究

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分散計算の重要な問題に対して、 古典分散アルゴリズムより高速な量子分散アルゴリズムを初めて与えた

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量子分散計算の枠組みで研究



S. Bravyi, D. Gosset and R. König. **Quantum Advantage with Shallow Circuits.** ArXiv: 1704.00690. Plenary talk at QIP 2018.



n量子ビットのリング状のグラフ状態を考えよう













リング状のグラフ状態



[Bravyi et al. 17]: 定数深さ量子回路の優位性の無条件証明 (今までの証明は P≠NP のような条件を仮定)



まとめ:量子計算と分散計算

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[Le Gall and Magniez 2018]

 QUANTUM SUPREMACY

 (小~中規模量子コンピュータの優位性の確立)

 量子分散計算を用いて研究

 定数深さ量子回路の優位性の無条件証明

 [Bravyi, Gosset and König 2017]

未解決:より計算能力の高い量子回路のクラスの優位性の無条件証明