## (A Not So Technical) Introduction to Quantum Computation

What does it take to successfully use quantum computers?
Harold Ollivier

## ■ Quantum Computing

© Current impacts
3 Looking into the future

## Quantum Computing

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## Definition

Set of axioms used to describe reality (at the microscopic scale)

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UNIVGRSALITY OF TOFFOLI GATE

The Hadamard gate

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One $H$ gate behaves like a random number generator:

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Two successive $H$ gates behave like identity

$$
\vec{u}_{0} \xrightarrow{H} \frac{1}{\sqrt{2}}\left(\vec{u}_{0}+\vec{u}_{1}\right) \xrightarrow{H} \frac{1}{2}\left(\vec{u}_{0}+\vec{u}_{1}+\vec{u}_{0}-\vec{u}_{1}\right)=\vec{u}_{0} .
$$

## A different view of the Hadamard gate



We can compactly represent the computation of amplitudes

$$
\begin{array}{lll} 
& \mathbf{a}=0 & \mathbf{a}=1 \\
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## And its power



Because contributions (amplitudes) can be negative,

- Some paths add-up (constructive interference)
- Some paths cancel each other (destructive interference)


## Using superpositions

## Toffoli gate



The amplitudes can also be computed in a very compact way:

$$
\delta_{x_{1}, a_{1}} \times \delta_{x_{2}, a_{2}} \times \delta_{x_{3}, a_{3} \oplus\left(a_{1} \cdot a_{2}\right)}
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i.e. is 1 when the input-output relation is satisfied, and 0 otherwise

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## $Z$ gate



The amplitudes are written:

$$
\delta_{x, a} \times(-1)^{a}
$$

```
z. GATE
```


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$C Z$ gate


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CCZ gate


For CCZ it is $(-1)^{a_{1} \cdot a_{2} \cdot a_{3}} \delta_{a_{1}, x_{1}} \delta_{a_{2}, x_{2}} \delta_{a_{3}, x_{3}}$

CLZ GATE

Computing amplitudes for small circuits (recursively applying the formulas)


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The transition amplitude from $a=\vec{u}_{0}^{\otimes n}$ to $y=\vec{u}_{0}^{\otimes n}$ corresponds to:

$$
\left(\vec{u}_{0}^{\otimes n}, C_{P} \vec{u}_{0}^{\otimes n}\right)=\frac{1}{2^{n}} \sum_{x=\left(x_{i}\right)_{i} \in\{0,1\}^{n}}(-1)^{P(x)}=\frac{1}{2^{n}}(\#\{x: P(x)=0\}-\#\{x: P(x)=1\})
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## Quantum computers "compute" transition amplitudes

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Defining gap $(P)$ for $P$ degree-3 polynomial

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\operatorname{gap}(P)=\#\{x: P(x)=0\}-\#\{x: P(x)=1\}
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where $P=\sum \alpha_{i, j, k} x_{i} \cdot x_{j} \cdot x_{k}+\sum \beta_{i, j} x_{i} \cdot x_{j}+\sum \gamma_{i} x_{i}$, and $\alpha_{i, j, k}, \beta_{i, j}, \gamma_{i} \in\{0,1\}$.

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## Hardness

- Classically computing gap $(P)$ is hard (in $P P \supset N P$ )
- Computing $\operatorname{ngap}(P)=\operatorname{gap}(P) / 2^{n}$ is also hard
- Quantum computers seem to do it with few gates: $\operatorname{ngap}(P)=\left(\vec{u}_{0}^{\otimes n}, C_{P} \vec{u}_{0}^{\otimes n}\right)$


## Exact computation of $\operatorname{ngap}(P)$ is hard

## But

Quantum computers do not give access to these values with perfect accuracy, but only to samples and, additionnally, they can be noisy

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- It can become easy for additive approximation for classes of functions that remain hard multiplicatively
- It can be easy when there is noise

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## Take home messages

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4 Useful QC algorithms need to be designed (or checked) on a case-by-case basis: no easy black-box approach

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2 But retrieving the information out of this exponentially many superposed states is tricky
3 QC will not help in all situations
4 Useful QC algorithms need to be designed (or checked) on a case-by-case basis: no easy black-box approach
${ }_{5}$ Keep in mind that we assumed perfect machines (without noise)

## Current Impacts

Examples of algorithms using coherent QC (large machines, error free)

- Discrete log (exponential)
- Linear algebra with quantum encoded data (possibly exponential, mostly polynomial)
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## Quantum cryptography (QKD)

- Protecting information with statistical security (ie. without hardness asumptions)


## Impacts

## On cryptography

- 2016 NIST has started the process of changing the way public key crypto is done to become post-quantum (ie. quantum resistant)
- Calls issued, some protocols are being standardized
- Major impact on all industries (with increased operational risks)


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## On computing

- A lot of work is being done to pinpoint possible use-cases
- Assessment of the current power of quantum machines
$>$ Well chosen problem (hard for classical / easy for quantum): supremacy experiment
$>$ Useful problem (but brute force classical simulation): latest IBM Nature paper
> Small scale proof of concept: hard to apprehend the scaling
- Trying to develop a GPU-like approach with HPC coupling


## Looking into the future

## Expected imapcts

## Impact your client's businesses

- Need to account for crypto uncertainty
$>$ People store have long-term valuable documents
$>$ Need to properly upgrade security of systems before it's too late
- Ensuring that some computations are correct / trusting computations


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## Impact on your own business

- Dependent on applications
- Algebra + optim: Quite general


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- In a zone where there is some battle with classical computing (for well chosen problems)
- Many different architectures where some could potentially arrive faster than expected


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## Bottlenecks

- Assessment of usefulness of QC requires reanalysing the full computational software stack
- Takes time and knowledge to know what you are trying to improve
- Improving over state of the art means you know what it is for your problem


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- Look where quantum can help
- Work with private companies (when getting inspiration from others / adapting something described elsewhere)
- Work with academic labs when you want to tackle something that (really) nobody has looked at before


## 04

## Thank you! (time for questions)

