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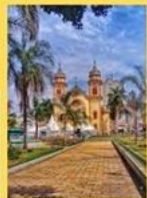


VI Workshop Escola de Computação e
Informação Quântica

10 a 13

Agosto 2022

Alfenas-MG

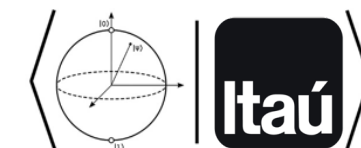


IMPACTO DAS TECNOLOGIAS QUÂNTICAS | NA INDÚSTRIA FINANCEIRA

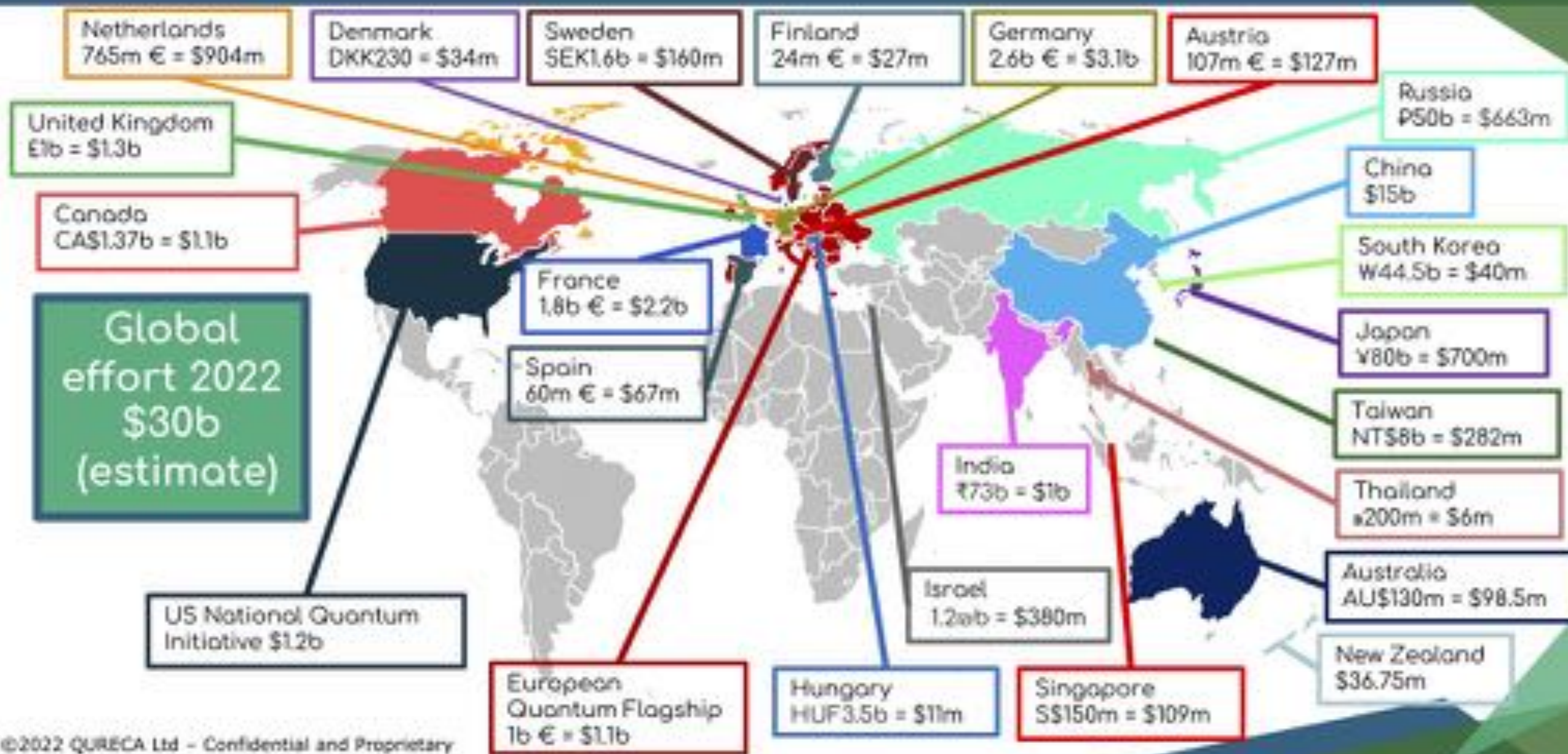


Samurái Brito, PhD Física
Head of Quantum
Itaú Unibanco

samurai.brito@itau-Unibanco.com.br
<https://www.linkedin.com/in/samurai-brito/>



Quantum effort worldwide



Quantum computing hardware



Random number generator



Quantum communication



Quantum computing software



Post-quantum cryptography

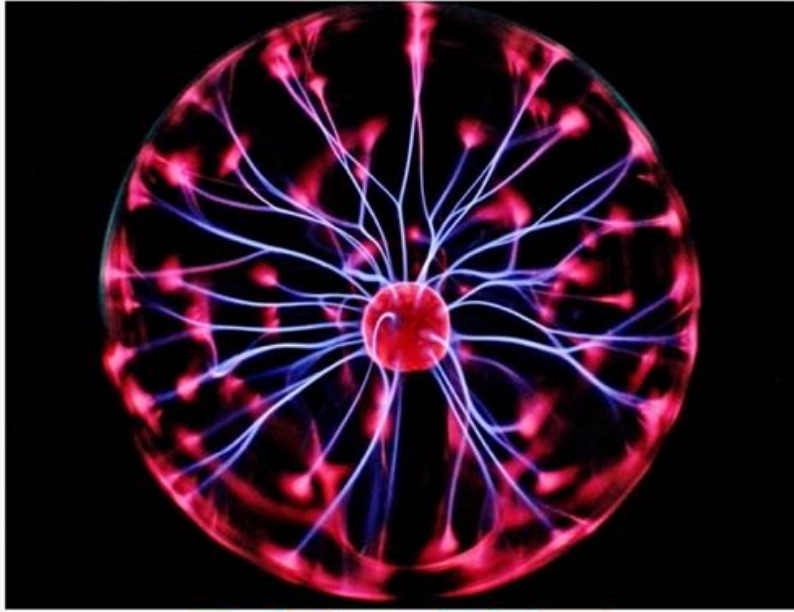


Quantum sensors

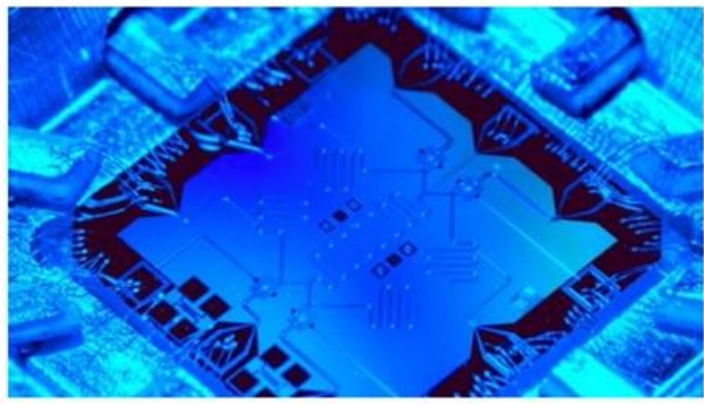


JPMorgan's guide to quantum machine learning in finance

by Sarah Butcher 3 days ago



Marco Pistoia, head de quantum technologies e head de pesquisa no [JPMorgan](#), junto com alguns membros de seu time, publicaram um artigo enfatizando que a computação quântica irá impactar os serviços financeiros mais cedo que o esperado.



Goldman Sachs makes quantum breakthrough

30 April 2021 22 27 8

Goldman Sachs is claiming a quantum computing breakthrough, designing algorithms it says could be used on hardware that may be available in as little as five years.

[Goldman Sachs](#) e JPMorgan têm construído um forte time de pesquisadores em quantum e Goldman Sachs já tem utilizado alguns métodos para acelerar a precificação de derivativos em cerca de 1000 vezes.

Top 11 Bancos que estão investindo alto em tecnologias quânticas



10+ Artigos Publicados

Optimizing Quantum Search with a Binomial Version of Grover's Algorithm

Austin Gilliam, Marco Pistoia, and Constantin Gonciulea
JPMorgan Chase
(Dated: July 22, 2020)

The Efficient Preparation of Normal Distributions in Quantum Registers

Arthur G. Rattew, Yue Sun, Pierre Minssen, and Marco Pistoia

On the Exponential Sample Complexity of the Quantum State Sign Estimation Problem

A Domain-agnostic, Noise-resistant, Hardware-efficient Evolutionary Variational Quantum Eigensolver

Arthur G. Rattew,^{1,3} Shaohan Hu,¹ Marco Pistoia,² Richard Chen¹ and Steve Wood¹
¹IBM T. J. Watson Research Center, Yorktown Heights, NY USA
²JPMorgan Chase & Co.

Quantum Machine Learning for Finance

Marco Pistoia, Syed Farhan Ahmad, Akshay Ajagekar, Alexander Buts, Shouvanik Chakrabarti, Dylan Herman, Shaohan Hu, Andrew Jena, Pierre Minssen, Pradeep Niroula, Arthur Rattew, Yue Sun, Romina Yalovetzky
Future Lab for Applied Research and Engineering, JPMorgan Chase Bank, N.A.

CHASE J.P.Morgan

Lab de Pesquisa Aplicada: 31 membros

TECHNOLOGY

Future Lab For Applied Research And Engineering

Conducting applied research focused on frontier technologies to transform scientific findings into business value

Academic Engagements

Offering grants to renowned professors in the academia allows JPMC to be on the forefront of research.

University/Consortium	Professor	Research Area of Focus
Tel Aviv University, Israel	Yaron Oz	Quantum Computing for AI

Parceria com pesquisadores renomados de Universidades

Chicago Quantum Exchange	David Awschalom	Quantum Algorithms Quantum Key Distribution
University of Waterloo	Michele Mosca	Quantum Key Distribution and Quantum Algorithms

[Quantum Machine Learning for Finance](#)

Marco Pistoia, Syed Farhan Ahmad, Akshay Ajagekar, Alexander Bubs, Shouvanik Chakrabarti, Dylan Herman, Shaohan Hu, Andrew Jena, Pierre Minssen, Pradeep Nikola, Arthur Rattew, Yue Sun, Romina Yalovetzky

Proceedings of the 40th IEEE/ACM International Conference on Computer Aided Design (ICCAD), Munich, Germany, Invited Special Session Paper, November 2021

[Clifford Circuit Optimization with Templates and Symbolic Pauli Gates](#)

Sergey Bravyi (IBM), Ruslan Shaydulin (Argonne National Laboratory), Shaohan Hu, Dmitri Maslov (IBM)

Quantum 5, 580 (2021)

[Computational Investigations of the Lithium Superoxide Dimer Rearrangement on Noisy Quantum Devices](#)

Qi Gao (Mitsubishi Chemical), Hajime Nakamura (Keio University), Tanvi P. Gujarati (IBM), Gavin D. Jones (IBM), Julia E. Rice (IBM), Stephen P. Wood (IBM), Marco Pistoia, Jeannette M. Garcia (IBM), Naoki Yamamoto (Keio University)

Journal of Physical Chemistry A, 125, 9, 1827-1836, February 2021

[Driver Behavior-aware Parking Availability Crowdsensing System Using Truth Discovery](#)

Yi Zhu (SUNY Buffalo), Abhishek Gupta (SUNY Buffalo), Shaohan Hu, Weida Zhong (SUNY Buffalo), Lu Su (Purdue University), Chunming Qiao (SUNY Buffalo)

ACM Transactions on Sensor Networks, Volume 17, Issue 4, Article No. 41, November 2021

[Grover Adaptive Search for Constrained Polynomial Binary Optimization](#)

Austin Gilliam, Stefan Woerner (IBM), Constantin Gonciulea

Quantum 5, 428 (2021)

[Portfolio Optimization for Near-Term Quantum Hardware](#)

Romina Yalovetzky, Pierre Minssen, Dylan Herman, Marco Pistoia

arXiv:2110.15958, October 2021

[The Efficient Preparation of Normal Distributions in Quantum Registers](#)

Arthur Rattew, Yue Sun, Pierre Minssen, Marco Pistoia

arXiv:2009.06601, July 2021

[On the Exponential Sample Complexity of the Quantum State Sign Estimation Problem](#)

Arthur Rattew, Marco Pistoia

arXiv:2108.03193, August 2021

[Foundational Patterns for Efficient Quantum Computing](#)

Austin Gilliam, Charlene Venci, Sreeram Muralidharan, Vitaliy Dorum, Eric May, Rajesh Narasimhan, Constantin Gonciulea

arXiv:1907.11513, January 2021

2021

Itaú e QC Ware usam algoritmos de computação quântica para fortalecer retenção de clientes

Por Redação - 4 de maio de 2022

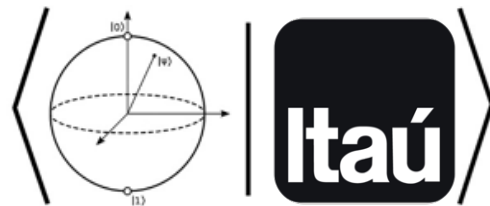
0

Like 1



O Itaú Unibanco e a QC Ware, líder em software e serviços quânticos, anunciam os primeiros resultados de uma colaboração que explora o uso de algoritmos de computação quântica no setor bancário. O objetivo do projeto conjunto, que durou quatro meses, é investigar se a computação quântica pode ajudar na retenção de clientes. O algoritmo de quantum machine learning

proposto pela QC Ware melhora o desempenho dos modelos usados atualmente para prever a perda de clientes.



Itaú Quantum Technologies



QC WARE
TECHY INSIGHT

QC Ware Applies Quantum Computing Ideas to Improve Buyer Retention at Itaú Unibanco

May 5, 2022 by [techyinsight_e6herc](#)

*Monetary Quantum Algorithm Identifies Extra At-Danger Banking Clients
Quantum algorithm defines future accuracy and efficiency benefits and evokes enhancements immediately*



Managing a Quantum Computing Team—Insights and Challenges at Itaú Unibanco

Publisher: IEEE [Cite This](#) [PDF](#)

Rafael Sotelo; Terril L. Frantz; Samurá Brito; Vanessa Fernandes da Silva; André Juan Ferreira Martins [All Authors](#)

51 Full Text Views

Abstract

Abstract: Quantum computing technology is developing rapidly. Technology managers are now faced with pressure to bring the emerging technology in-house, albeit perhaps stealthily. This article presents the story of a large Brazilian financial services firm that is facing the quantum “opportunity” head-on. We provide insights into the challenge of introducing nonproven technology to this one particular organization. In addition to team-level management, other aspects in the realm of organization-level

Quantum Latino Building a connected Quantum Community in Latin-America

QURECA Quantum Resources & Careers

Quantum-South

Women in Quantum Panel @Quantum Latino 2022

IV ECMCE

IV ENCONTRO CEARENSE DE MULHERES NAS CIÊNCIAS EXATAS

MULHER ONDE É O SEU LUGAR?

Samurá Brito, PhD Física, Head of Quantum at Itaú Unibanco
samuraibrito@itaunibanco.com.br
<https://www.itaunibanco.com.br/samurabrito>

17/02 19h

Como fazer ciência na indústria financeira?

CONECTA live

MUSEU CIÊNCIA E VIDA

Samurá Brito

1:05:18

Como fazer ciência na indústria financeira?

1,8 mil visualizações • Transmitido há 5 meses

Museu Ciência e Vida

Em comemoração ao Dia das Meninas e Mulheres na Ciência, vamos receber Samurá Brito no espaço virtual do...

PODCAST

THE SHIFT

COM CRISTINA DE LUCA E SILVIA BARBI

EPISÓDIO #129 Prática Quântica

CONVIDADOS

ROBERTO FIGUEIRA (ITAÚ)

SAMURÁ BRITO (ITAÚ)

THE SHIFT #129 PRÁTICA QUÂNTICA

10/06/2022

Samurá Gomes de Aguiar Brito

Natal, Brazil

@samuraigab

IBM Quantum

Qiskit Advocate Advanced

South America

- Palestra: "Computação quântica no Itaú: como a tecnologia pode ser aplicada à indústria financeira"

Palestrante: Samurá Brito

Especialista em Tecnologias Quânticas no Itaú Unibanco desde janeiro de 2021, atua no estudo e desenvolvimento de novas aplicações com a tecnologia na indústria financeira. A especialista possui licenciatura, mestrado e doutorado em física pela Universidade Federal do Rio Grande do Norte, além de pós-doutorado em teoria da informação quântica pelo Instituto Internacional de Física.

Universidade Presbiteriana Mackenzie

Rede Nacional de Tecnologias Quânticas Computacionais abre os trabalhos na Bahia

Especialistas se reuniram em Salvador para discutir projetos de desenvolvimento da tecnologia disruptiva

Nos dias 11 e 12 de abril, o SENAI CIMATEC sediou o 1º Fórum da Rede MCTI Softex de Tecnologias Quânticas Computacionais. O evento marcou a criação da Rede nacional e o início das atividades do grupo, formado pelo Ministério de Ciência e Tecnologia e Inovações, universidades, startups, empresas, associações, institutos de pesquisa em tecnologias quânticas e pelo SENAI CIMATEC, coordenador da iniciativa.

As empresas que participaram do evento e das primeiras iniciativas: Banco BV, Atos, Pitec, Petrobrás, Idea e Itaú. As startups que integram o grupo são: Brazil Quantum, Dobsit, Quantum Loop, KET, DualD e QuBE.



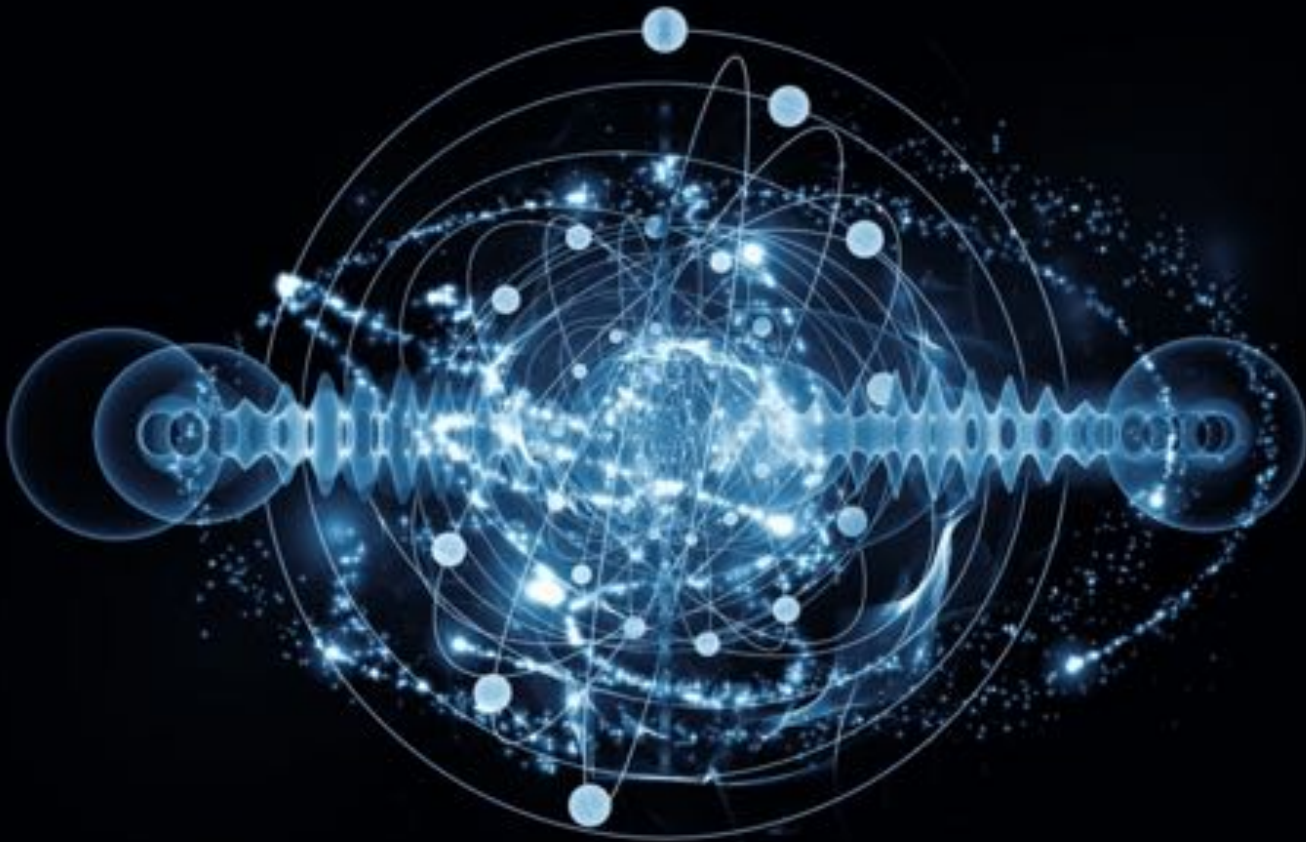
As tecnologias quânticas, suas aplicações e tendências foram o assunto do Inovação em Foco virtual realizado pelo CPQD nesta segunda-feira, 11 de julho. A live contou com a participação de dois convidados especiais, que apresentaram o tema aos colaboradores da organização: Samurá Brito, responsável pela área de Tecnologias Quânticas do Itaú-Unibanco, e Gustavo Wiederhecker, físico e professor da Unicamp (Universidade Estadual de Campinas).

Os convidados abordaram as divers... See more

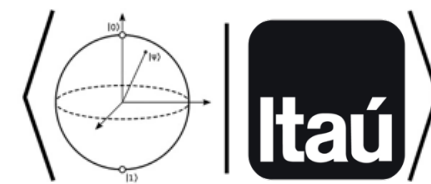


Attendees	Speakers	Streams
300+	80+	3

Speaker	Title	Affiliation
Yuval Boger	Chief Marketing Officer	Classiq
Bhushan Bonde	Head of Innovation for In-silico R&D, Drug Discovery	Evotec
Samurá Brito	Head of Quantum Technologies	Itaú Unibanco
Manjari Chadran-Ramesh	Partner	Amadeus Capital Partners




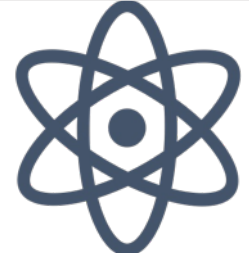

QUANTUM TECHNOLOGIES | Segurança



Itaú Quantum Technologies

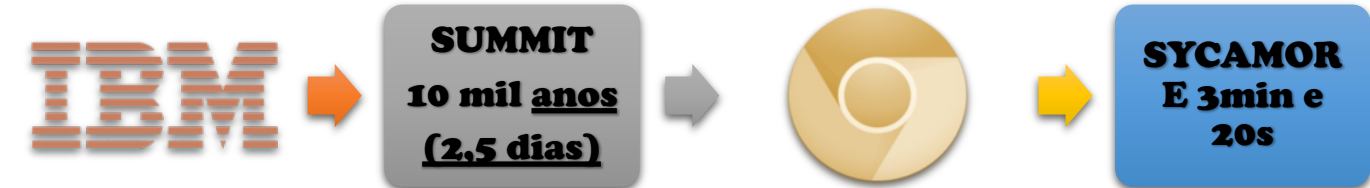


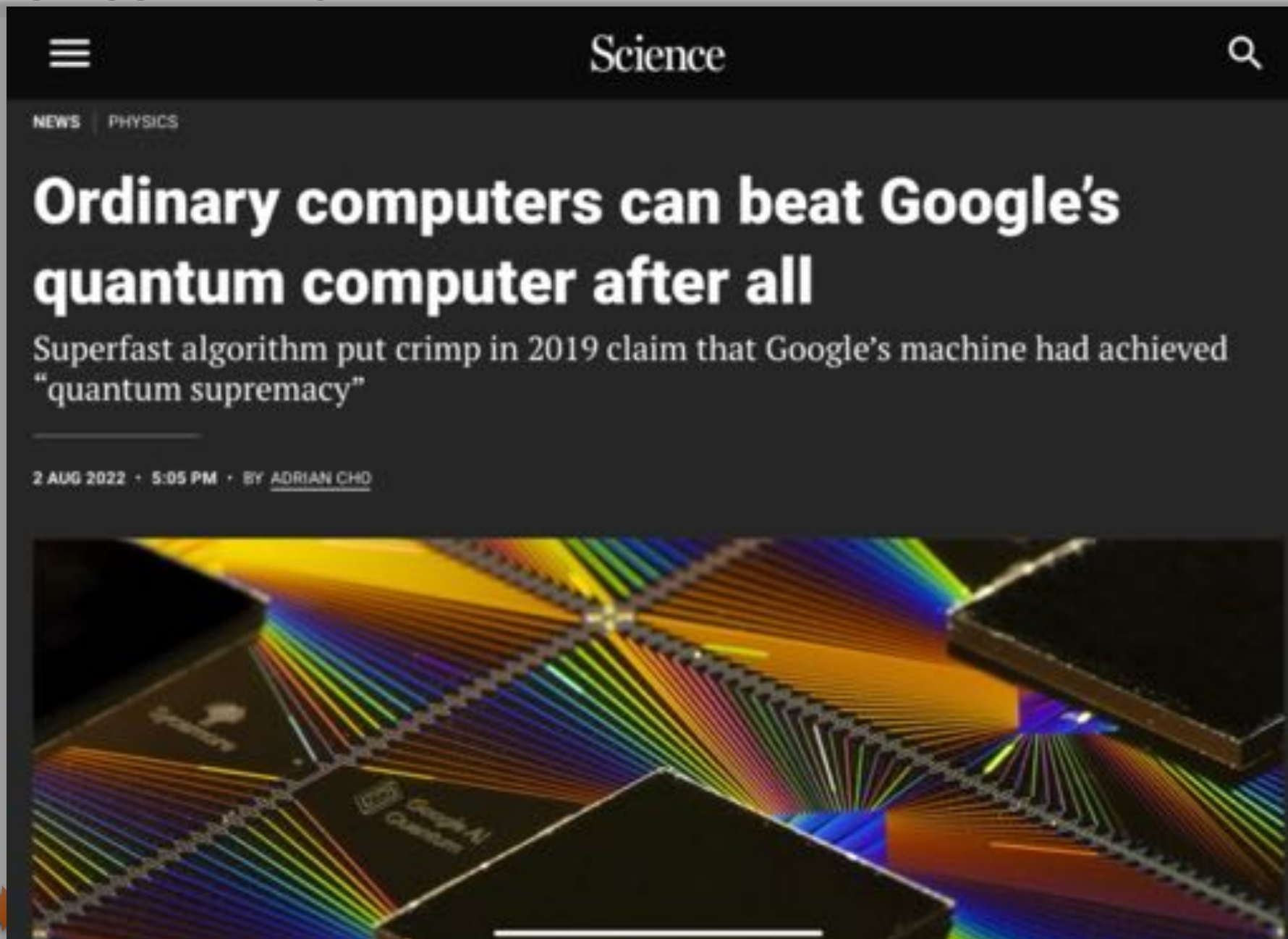
RSA-2048 (Assimétrica)

CLÁSSICO	QUÂNTICO	PERIGOS
		
300 milhões de anos	<ul style="list-style-type: none">• 10 segundos• 4099 qubits	RSA / ECC / Diffi Hellmann



Criptografia Pós-Quântica





ométrica)

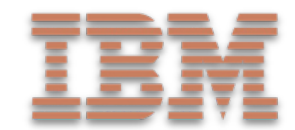
PERIGOS



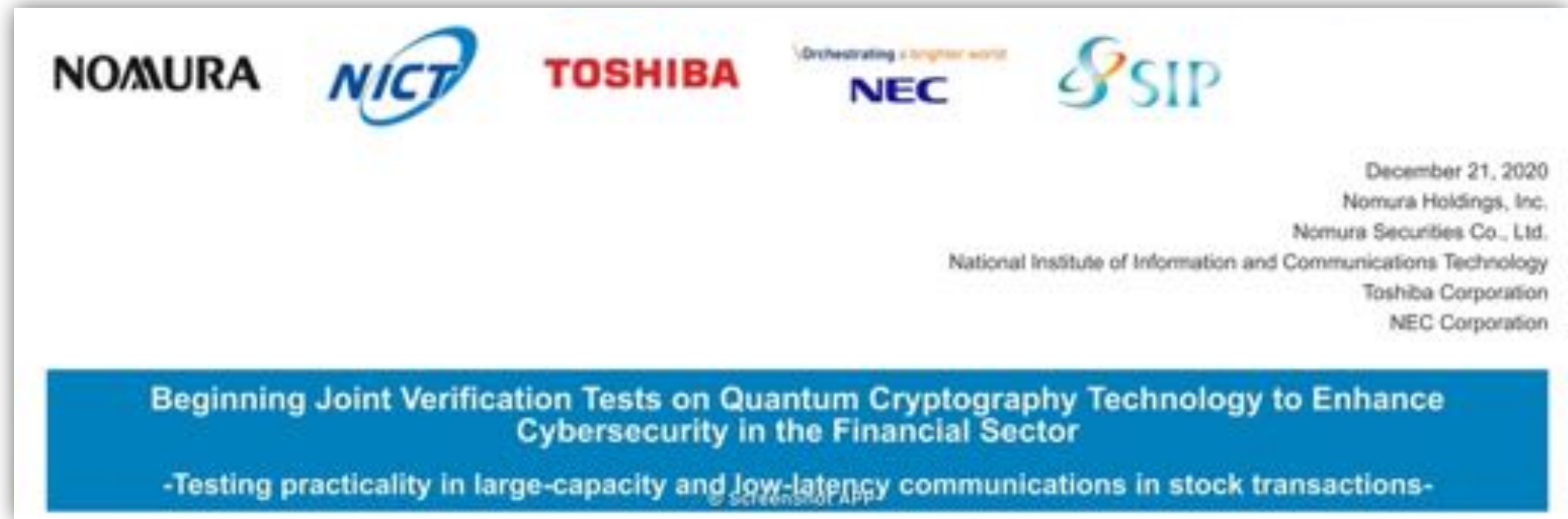
RSA / ECC /
Diffi Hellmann




DS
CS

Quântica



(2,5 dias)



NOMURA  **TOSHIBA**  **NEC** 

December 21, 2020
Nomura Holdings, Inc.
Nomura Securities Co., Ltd.
National Institute of Information and Communications Technology
Toshiba Corporation
NEC Corporation

Beginning Joint Verification Tests on Quantum Cryptography Technology to Enhance Cybersecurity in the Financial Sector

-Testing practicality in large-capacity and low-latency communications in stock transactions-

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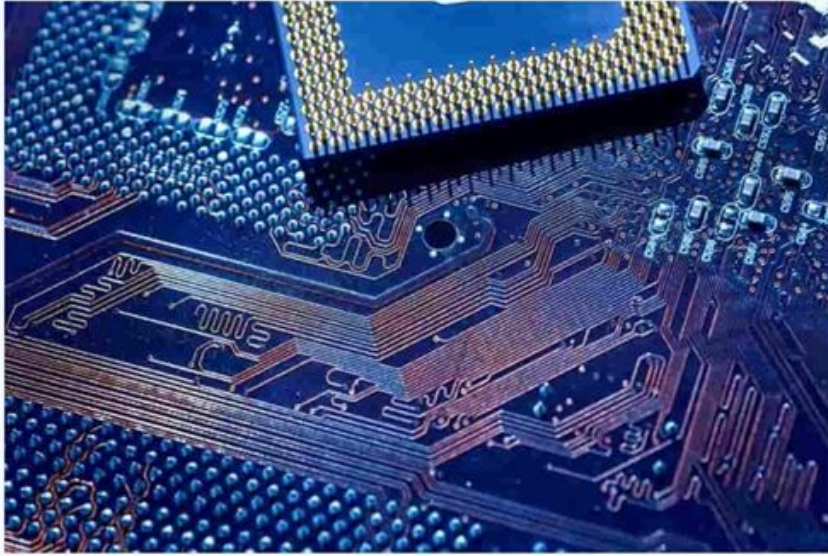
[GO JOURNAL](#)

Visa, JPMorgan Are Already Preparing for Potential Quantum Cyberattacks

A powerful quantum computer could be capable of breaking the internet's most commonly used cryptography

© screens301 APP

Quantum computers could crack Bitcoins security in the next decade, scientists estimate



1,9 bilhões de qubits – 10 min

347 milhões de qubits – 1h

13 milhões de qubits – 1 dia

[The impact of hardware specifications on reaching quantum advantage in the fault tolerant regime](#)

The Quantum Threat To Cryptography: Don't Panic, But Prepare Now



Mike Brown Forbes Councils Member

Forbes Technology Council

COUNCIL POST | Membership (Fee-Based)


Innovation

"2030 – full-scale quantum computers"

CTO and co-founder at ISARA Corporation. Focused on technology for crypto agility and quantum safety.

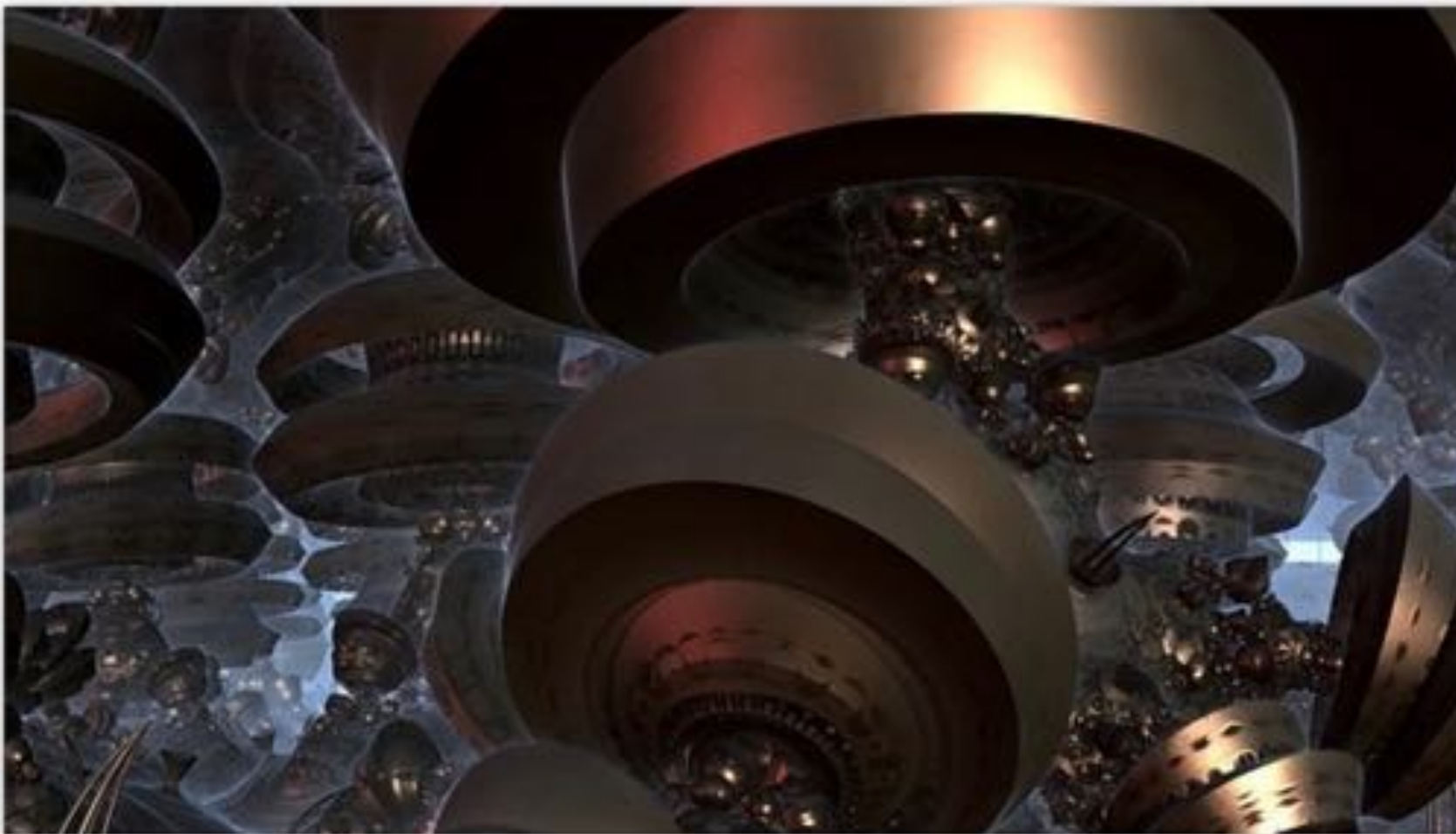
The National Institute of Standards and Technology (NIST) is a government agency that helps set standards for technology. Lily Chen, who heads NIST's cryptographic technology group, said we will probably be dealing with the practical implications of quantum computers within 10 years.

"Experts predict that, around 2030, we'll have full-scale quantum computers that can break asymmetric key cryptography," Chen said. "So that will give us some time."



National Security Agency | Frequently Asked Questions

Quantum Computing and Post-Quantum Cryptography



EUA criam roteiro para transição para criptografia pós-quântica

Governo americano desenvolveu um roteiro para ajudar as organizações a realizarem a transição para a criptografia pós-computador quântico

PRIVACY AND SECURITY

Supposedly Quantum-Proof Encryption Cracked by Basic-Ass PC

An encryption algorithm that was supposed to stand up to attacks from the future's most powerful computers was recently laid low by a much simpler machine.

By Lucas Ropek

Tuesday 5:05PM | Comments (19) | Alerts

CRIPTOGRAFIA DESTAQUES NOTÍCIAS

NIST anuncia os primeiros quatro algoritmos criptográficos resistentes ao computador quântico

Post-Quantum Safe Algorithm Candidate Cracked in an Hour on a PC

BY MATT SWAYNE

AUGUST 5, 2022

RESEARCH

CRYPTO
NIST
comp

```
function(a){try{a()}catch(g){d.log(g)}};this  
...}(.F(c,8));c=_ec();var d=_W  
...cp(COPY.PASSWORD("*****"), "DOMConten  
...x("ghar.als", function(M  
...j(a)||new _jo));(function(M  
...x(a(d))var p
```

Post-Quantum Safe Algorithm Candidate Cracked in an Hour on a PC

BY MATT SWAYNE

AUGUST 5, 2022

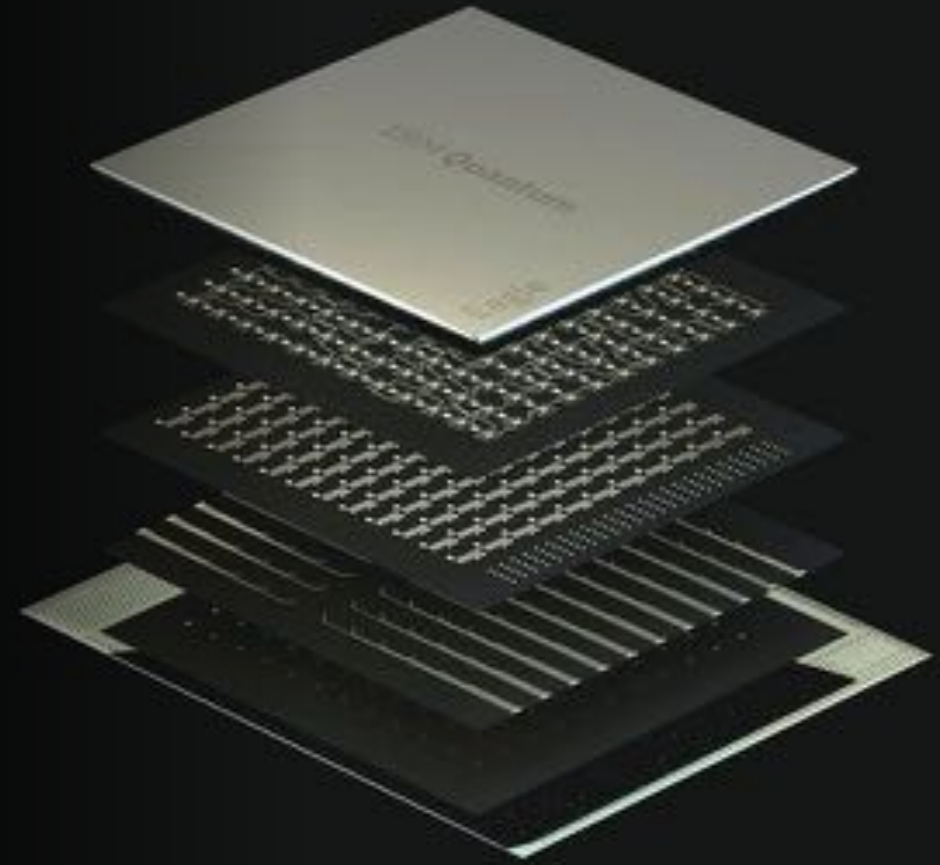
RESEARCH

CRYPTO
NIST
comp

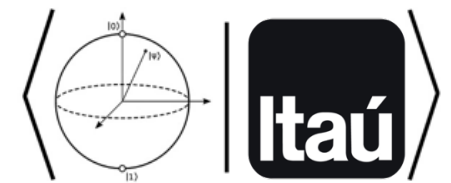
Startingly, the hack was performed on a classical computer — and took about an hour to complete.

They write: “A run on the SIKEp434 parameters, previously believed to meet NIST’s quantum security level 1, took about 62 minutes, again on a single core. We also ran the code on random instances of SIKEp503 (level 2), SIKEp610 (level 3) and SIKEp751 (level 5), which took about 2h19m, 8h15m and 20h37m, respectively.”

SIKE was among several algorithms that passed a NIST competition to identify and define standardized post-quantum algorithms. Because quantum computers represent a threat to current measures for securing information and data, the organization wanted to pinpoint algorithms that stood the best chance of withstanding attacks from quantum computers.



QUANTUM TECHNOLOGIES | Computação Quântica



Itaú Quantum Technologies

Que linguagem utilizar para programar em um computador quântico?

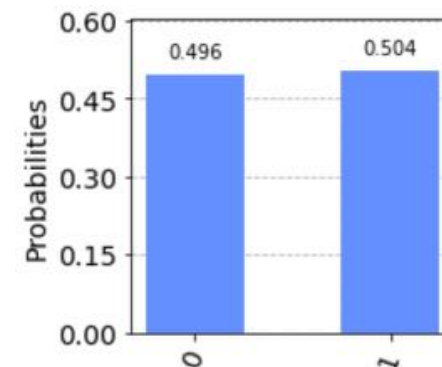
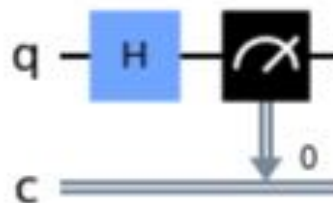


P E N N Y L A N E



```
In [15]: 1 from qiskit import *
          2 from qiskit.visualization import *
          3
          4
          5 qubit = QuantumRegister(1, 'q')
          6 bit = ClassicalRegister(1, 'c')
          7
          8 circuito = QuantumCircuit(qubit, bit)
          9 circuito.h(qubit)
         10 circuito.measure(qubit, bit)
         11 circuito.draw('mpl')
```

Out[15]:



Matrizes, vetores, Álgebra linear e noção de mecânica quântica

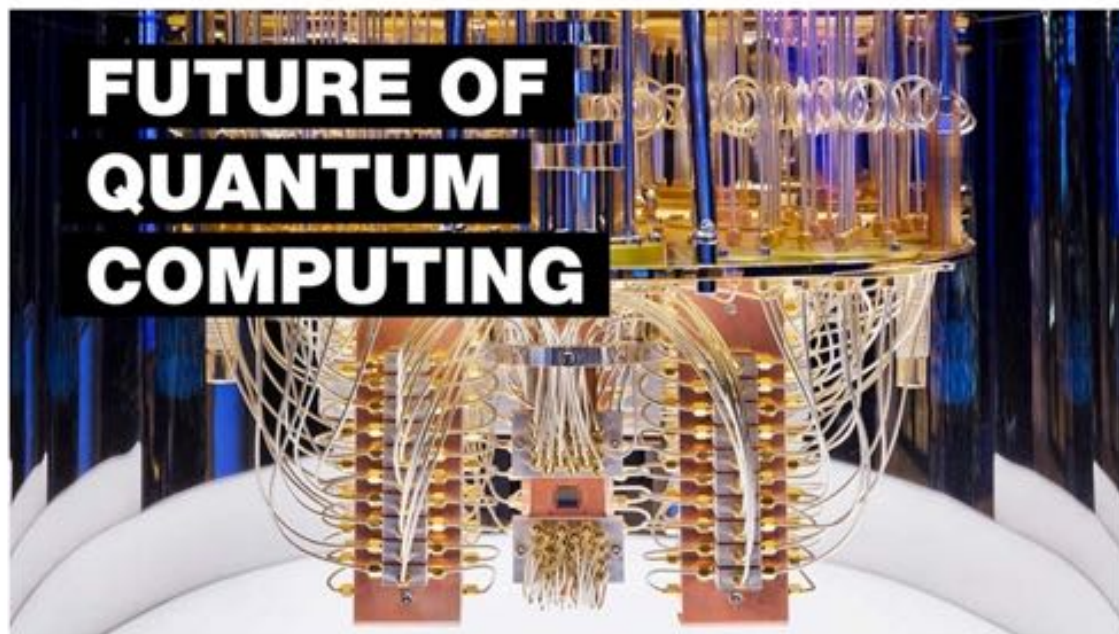
QC - Casos de Uso Potenciais



YouTube Channel Articles Business Tech R

The Future of Quantum Computing: 9 Powerful Use Cases

Jan 08, 2022



- ✓ **Inteligência artificial mais rápida e eficaz**
 - ✓ Processar grandes quantidades de dados em velocidades incomparáveis e simular redes neurais de tamanhos enormes.
- ✓ **Baterias para carros elétricos que são mais eficientes em termos de energia**
 - ✓ A computação quântica pode proporcionar melhorias nas áreas de simulação celular e no envelhecimento das células da bateria
- ✓ **Desenvolvimento de novos medicamentos**
 - ✓ Os computadores quânticos são adequados para resolver esse problema, pois a interação de átomos dentro de uma molécula é um sistema quântico. De fato, os especialistas acreditam que os computadores quânticos serão capazes de modelar até as moléculas mais complexas em nossos corpos. Usando computação quântica, as empresas farmacêuticas podem modelar moléculas maiores e mais complexas, melhores interações de mapear entre um medicamento e seu paciente -alvo e reduzir o tempo e os custos dos processos de desenvolvimento. Isso pode levar a melhores diagnósticos, medicamentos e vacinas que chegam mais cedo e com mais eficiência ao mercado.
- ✓ **Otimização de tráfego**
 - ✓ Usando computação quântica, as empresas farmacêuticas podem modelar moléculas maiores e mais complexas, melhores interações de mapear entre um medicamento e seu paciente -alvo e reduzir o tempo e os custos dos processos de desenvolvimento. Isso pode levar a melhores diagnósticos, medicamentos e vacinas que chegam mais cedo e com mais eficiência ao mercado.
- ✓ **A criação de novos materiais**
- ✓ **Modelagem problemas em finanças**
- ✓ **Cyber segurança**
- ✓ **Previsão de Mudanças Climáticas**
- ✓ **Manufacturing Processes**

J.P.Morgan

JPMorgan Chase & Co. is an American multinational investment bank and financial services holding company headquartered in New York City which is now making efforts to scale its quantum tech effort. Realizing quantum computing (QC) will be important for use cases in banking, the bank established a quantum engineering team, with Marco Pistoia head of quantum technology.

Very enthusiastic about developing quantum algorithms that the bank can use in AI, optimization and cryptography, in 2020 it began a partnership with a quantum technology hub called the Chicago Quantum Exchange, a quantum technology hub, and said that its research team is "actively working in the area of post-quantum cryptography."



Barclays plc is a British multinational universal bank, headquartered in London, England. Its journey into quantum computing began in 2017. Spending a long period of time learning about the technology until they felt confident in it, Barclays came to the conclusion that "quantum computing's potential was so great that we should commit to an initial programme of research and development."

Since then, the bank has conducted in-depth experimentation using the technology, mainly to gauge how it could be used to make improvements in the banking industry.

Currently, Barclays is leading experiments centred on some very specific challenges they come across in the banking industry, like initial tests focused on how quantum computing could potentially help them to optimize the settlement of batches of securities transactions.

WELLS
FARGO

Wells Fargo is an American multinational financial services company with corporate headquarters in San Francisco, California and operational headquarters in Manhattan. Back in 2019, Wells Fargo's technology chief, Saul Van Beurden, started the bank's venture into quantum computing by signing an agreement with IBM and MIT to collaborate on quantum computing and artificial intelligence technology. His attitude on quantum technology is clear.

"THERE ARE THREE CAMPS IN THE INDUSTRY. THERE'S THE CAMP THAT SAYS QUANTUM WILL NEVER COME TO PRODUCTION. THERE IS THE CAMP OF PEOPLE WHO BELIEVE IT WILL TAKE A LONG TIME BEFORE IT WILL GET IN PRODUCTION, A LONG TIME DEFINED AS 10 OR 15 YEARS, MAYBE LONGER. AND THERE IS A CAMP THAT SAYS, WELL, THINGS MIGHT GO FASTER. YOU'D BETTER TEST AND LEARN AND BE ON IT, BECAUSE IF THIS WAVE STARTS TO TAKE OFF, IT MIGHT HAVE GAME-CHANGING IMPACT FOR THE INDUSTRY. WE ARE IN THE THIRD CAMP. THAT'S WHY WE SIGNED UP. WE DON'T WANT TO BE THE BANK THAT HAS REGRETS IN A FEW YEARS."



HSBC Bank plc is a British multinational banking and financial services organization. Like others, it is aware how important QC will be for the financial sector in the coming years in areas such as risk analytics, ML and cybersecurity. Because of this, it has got the ball rolling with collaborations with other companies and research laboratories to investigate the potential of this state-of-the-art technology.

HSBC will work alongside The European NEASQC (Next Applications of Quantum Computing) project to develop practical use cases in fields as diverse as drug discovery, breast cancer detection, carbon capture and energy infrastructure risk assessments. The four-year project, working with a budget of EUR4.7 million (USD5.5 million) and fully funded from the European Union's Horizon 2020 research and innovation programme, harnesses the expertise of specialists in quantum computing.

Gustavo Ordonez-Sanz, Head of Economic Capital Analytics and Global Risk Innovation Lead, HSBC, said:



Citigroup Inc. or Citi is an American multinational investment bank and financial services corporation headquartered in New York City. Citigroup named quantum computing as one of the five tech trends to watch in 2019, as "quantum computing can help revolutionize financial services by improving trading algorithms, reducing fraud, optimizing portfolios, and managing risk."

The bank has also invested in quantum computing software startups like 1QBit and QC Ware, proving Citigroup is taking the quantum revolution seriously, with William Hartnett, the managing director at Citigroup, even saying the technology will transform risk assessment and trading for the financial industry and remarked that "banks need to start learning how to harness it now."






One of the more high-profile adopters of quantum technology, the Goldman Sachs Group, Inc. is an American multinational investment bank and financial services company headquartered in New York City. The bank has been working with Silicon Valley startup QC Ware for a few years now to investigate the use of quantum algorithms in finance, exploring how the technology will eventually outperform classical computers for finance applications.

William Zeng, head, quantum research, Goldman Sachs, believes:

"QUANTUM COMPUTING COULD HAVE A SIGNIFICANT IMPACT ON FINANCIAL SERVICES, AND OUR NEW WORK WITH QC WARE BRINGS THAT FUTURE CLOSER."

Quantum Computing | Exemplos de Casos de Uso em Finanças

	Cases	Experimentando
 Optimization	1 Portfolio selection alloc. & optimization	Natwest, BBVA, CBA, Standard Chartered,
	2 Optimal execution	
	3 Capital allocation	
	4 Asset liability management	
	5 Transaction settlement	Barclays
	6 Yield curve fitting	
 Machine Learning	7 Credit scoring / clustering	CaixaBank
	8 Default early warnings	
	9 Fraud detection/ AML	
 Pricing & Simulatio	10 Derivative Pricing	JP Morgan, Goldman Sachs, BMO, Scotiabank
	11 Valuation and regulatory ratios	HSBC
	12 Risk assessment & tail risk simulations	CaixaBank
	13 Multi-factor interest rate models	

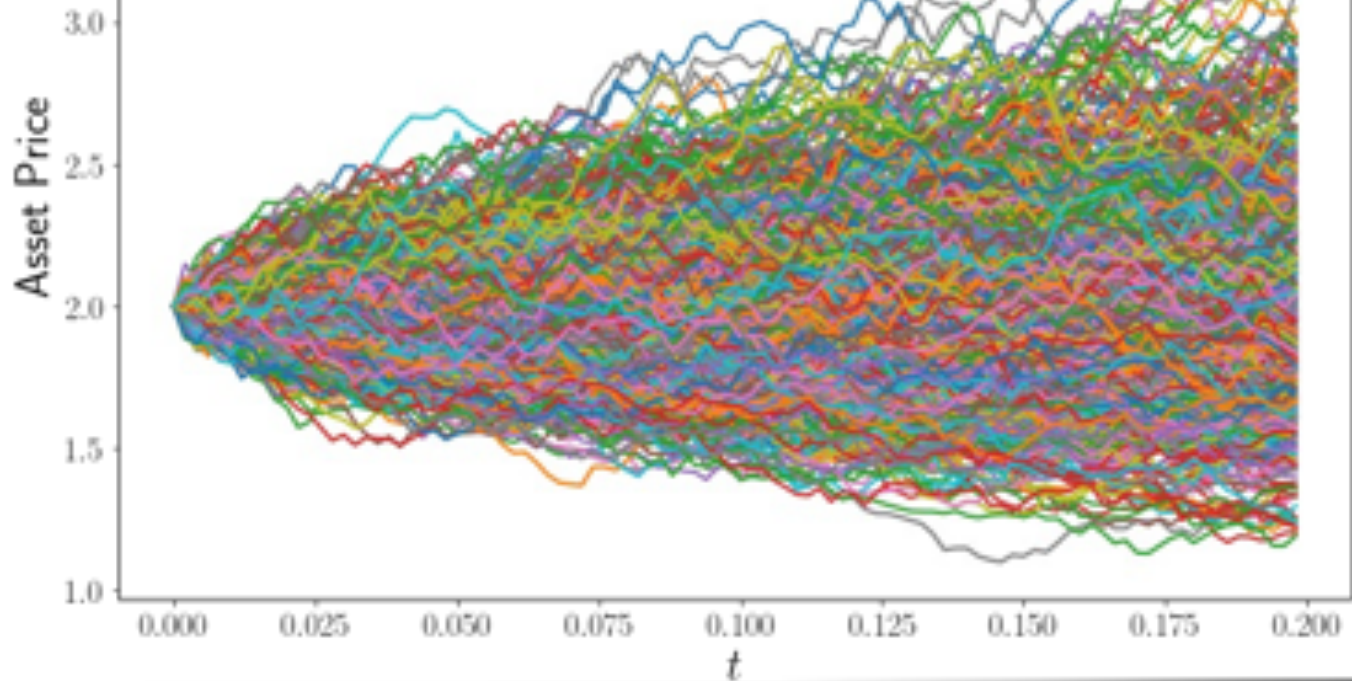
Monte Carlo

Quantum Monte Carlo

Será?

“Redução do número de simulações diárias.”

~ 1.000.000.000

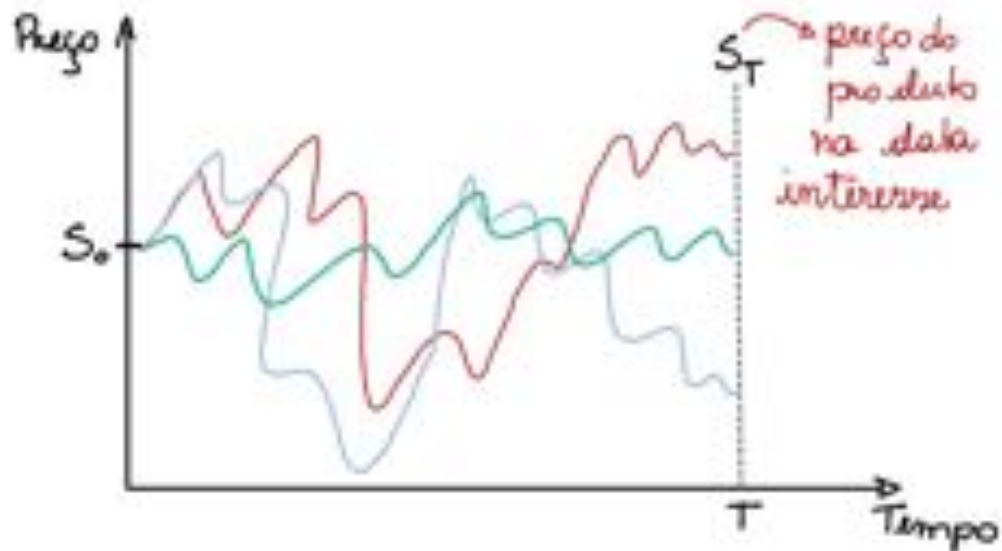


~ 35.000

Precificação De Derivativos

Precificar um produto
no futuro, dados as
informações que temos hoje

Simulamos diversos cenários



Objetivo:

Estimar o valor
da esperada da
função Payoff na
data de vencimento.

$$E[f(S)] = \frac{1}{M} \sum_{i=1}^M f(S_i)$$

onde,

$$f(S_T) = \begin{cases} \max(0, S_T - K) & \text{if } S_T > K \\ 0 & \text{otherwise} \end{cases}$$

CLÁSSICO: $E \sim O(M^{-1/2})$

QUÂNTICO: $E \sim O(M^{-1})$

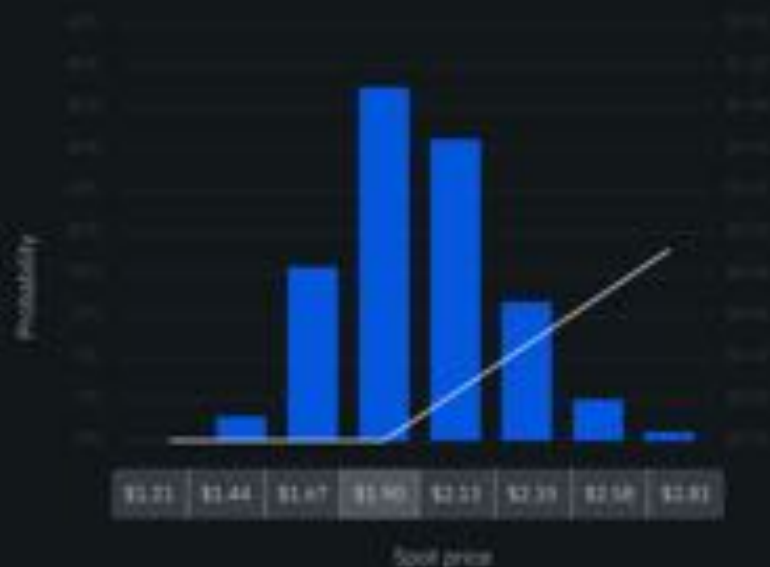
$$M_C \sim \frac{1}{\epsilon^2} \quad M_Q \sim \frac{1}{\epsilon} \quad M_Q \sim \sqrt{M_C}$$

<https://ibm-q-financial-demo.mybluemix.net/#simulator>

Try a quantum finance simulator now

1. Choose the strike price of a European call option

Click to select the strike price to calculate the potential payoff



First, select the strike price to estimate the expected payoff of a European call option, which gives its owner the right, but not the obligation, to buy the underlying security at the strike price of the option, on its expiration date.

The graph shows the random distribution that the quantum finance simulator generates of all possible spot prices of the underlying security at the expiration date of the option. It considers 40% volatility, 4% annual interest rate, and 40 days to expiration.

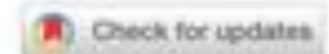
Click to see quantum algorithm estimation compared to a traditional Monte Carlo.

Reset

Test

2. Run the finance simulator for a European call option

ARTICLE OPEN



Iterative quantum amplitude estimation

Dmitry Grinko^{1,2,3}, Julien Gacon^{1,2}, Christa Zoufal^{1,2} and Stefan Woerner¹✉

We introduce a variant of *Quantum Amplitude Estimation* (QAE), called *Iterative QAE* (IQAE), which does not rely on *Quantum Phase Estimation* (QPE) but is only based on *Grover's Algorithm*, which reduces the required number of qubits and gates. We provide a rigorous analysis of IQAE and prove that it achieves a quadratic speedup up to a double-logarithmic factor compared to classical Monte Carlo simulation with provably small constant overhead. Furthermore, we show with an empirical study that our algorithm outperforms other known QAE variants without QPE, some even by orders of magnitude, i.e., our algorithm requires significantly fewer samples to achieve the same estimation accuracy and confidence level.

npj Quantum Information (2021)7:52; <https://doi.org/10.1038/s41534-021-00379-1>

form. However, the whole procedure is hard to implement with current and near-term
portional to $1/\sqrt{a}$, assuming algorithm \mathcal{A} makes no measurements.

Option Pricing using Quantum Computers

Nikitas Stamatopoulos¹, Daniel J. Egger², Yue Sun¹, Christa Zoufal^{2,3}, Raban Iten^{2,3}, Ning Shen¹, and Stefan Woerner²

¹Quantitative Research, JPMorgan Chase & Co., New York, NY, USA

²IBM Quantum, IBM Research – Zurich

³ETH Zurich

We present a methodology to price options and portfolios of options on a gate-based quantum computer using amplitude estimation, an algorithm which provides a quadratic speedup compared to classical Monte Carlo methods.

npj | Quantum Information

ARTICLE OPEN

Quantum risk analysis

Stefan Woerner¹ and Daniel J. Egger¹

We present a quantum algorithm that analyzes risk more efficiently on quantum computers. We employ quantum amplitude estimation to price Conditional Value at Risk on a gate-based quantum computer. Additionally, we trade-off the convergence rate of the algorithm and the circuit depth by the number of qubits representing the uncertainty—leads to a circuit that is already faster than classical Monte Carlo simulations which grow faster, but still polynomially, the convergence rate quickly as circuit depths increase. Our algorithm provides a near quadratic speed-up compared to Monte Carlo simulation using two toy models. In the first model we use real life (T-bill) faced by a possible interest rate increase. In the second model, we simulate our algorithm to illustrate how a quantum computer can determine financial risk for a two-asset portfolio made up of government debt with different maturity dates. Both models confirm the improved convergence rate over Monte Carlo methods. Using simulations, we also evaluate the impact of cross-talk and energy relaxation errors.

npj Quantum Information (2019)5:15; <https://doi.org/10.1038/s41534-019-0130-6>

A Threshold for Quantum Advantage in Derivative Pricing

Shouvanik Chakrabarti^{1,2}, Rajiv Krishnakumar¹, Guglielmo Mazzola³, and William J. Zeng¹

PHYSICAL REVIEW A **103**, 032414 (2021)

Editors' Suggestion

Quantum unary approach to option pricing

Sergi Ramos-Calderer^{1,2,*}, Adrián Pérez-Salinas^{1,3}, Diego García-Martín^{1,3,4}, Carlos Bravo-Prieto^{1,3}, Jorge Cortada⁵, Jordi Planagumà⁵, and José I. Latorre^{1,2,6}

¹Departament de Física Quàntica i Astrofísica and Institut de Ciències del Cosmos (ICCUB), Universitat de Barcelona, Martí i Franquès 1, 08028 Barcelona, Spain

²Quantum Research Centre, Technology Innovation Institute, Abu Dhabi, United Arab Emirates

³Barcelona Supercomputing Center (BSC), 08034 Barcelona, Spain

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⁵Caixabank, Barcelona, Spain

⁶Center for Quantum Technologies, National University of Singapore, Singapore

(Received 24 September 2020; accepted 18 February 2021; published 15 March 2021)

We present a quantum algorithm for European option pricing in finance, where the key idea is to work in the unary representation of the asset value. The algorithm needs novel circuitry and is divided in three parts: first, the amplitude distribution corresponding to the asset value at maturity is generated using a low-depth circuit; second, the computation of the expected return is computed with simple controlled gates; and third, standard amplitude estimation is used to gain quantum advantage. On the positive side, unary representation remarkably simplifies the structure and depth of the quantum circuit. Amplitude distributions use quantum superposition to bypass the role of classical Monte Carlo simulation. The unary representation also provides a postselection consistency check that allows for a substantial mitigation in the error of the computation. On the negative side, unary representation requires linearly many qubits to represent a target probability distribution, as compared to the logarithmic scaling of binary algorithms. We compare the performance of both unary vs binary option pricing algorithms using error maps, and find that unary representation may bring a relevant advantage in practice for near-term devices.

DOI: 10.1103/PhysRevA.103.032414

This work presents a quantum algorithm for the Monte Carlo pricing of financial derivatives. We show how the relevant probability distributions can be prepared in quantum superposition, the payoff functions can be implemented via quantum circuits, and the price of financial derivatives can be extracted via quantum measurements. We show how the amplitude estimation algorithm can be applied to achieve a quadratic quantum speedup in the number of steps required to obtain an estimate for the price with high confidence. This work provides a starting point for further research at the interface of quantum computing and finance.

DOI: 10.1103/PhysRevA.98.022321

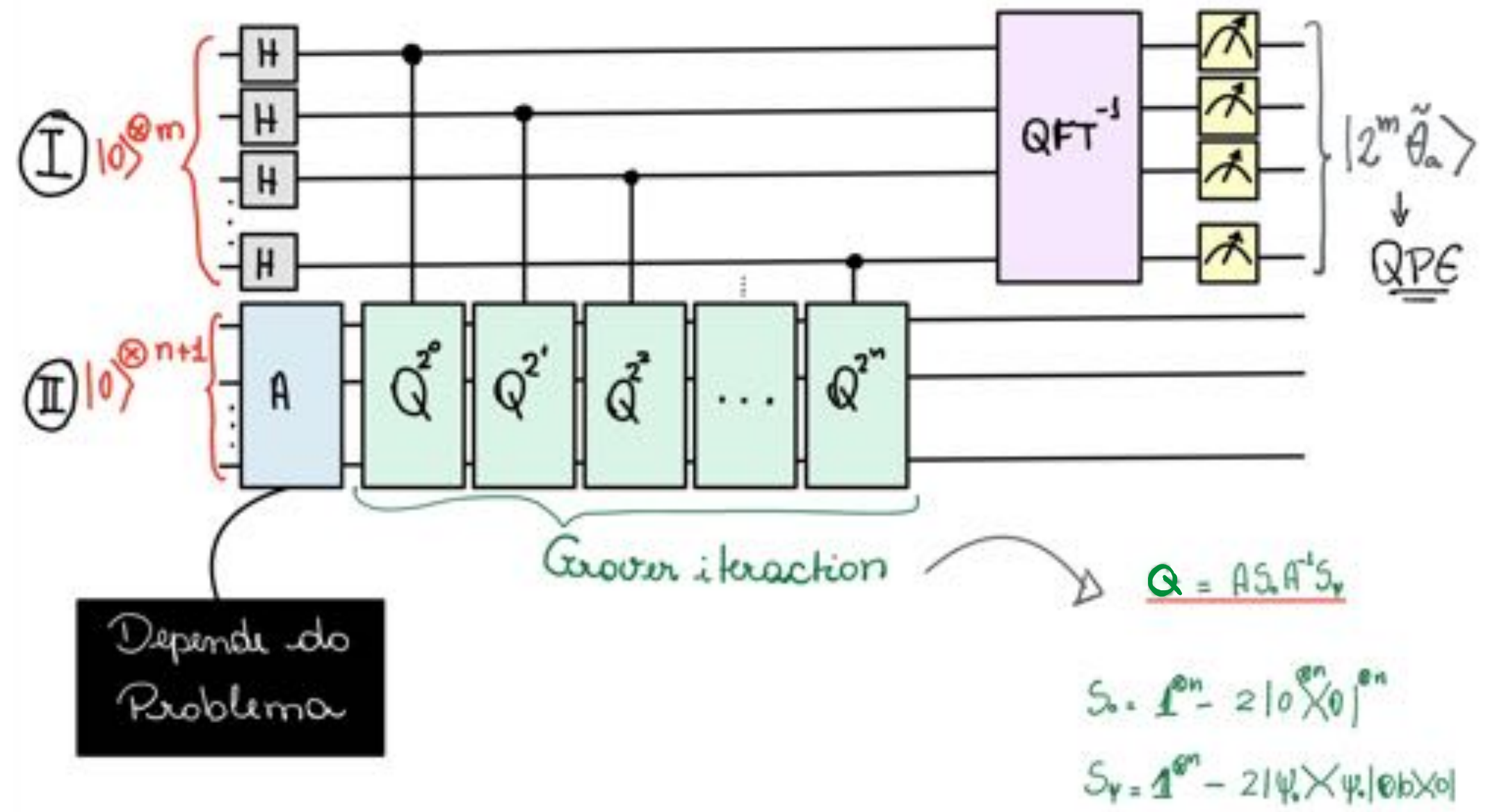
PHYSICAL REVIEW A **98**, 022321 (2018)

Monte Carlo pricing of financial derivatives

Shouvanik Chakrabarti¹ and Thomas R. Bromley¹
¹Quantum Computing Center, University of Toronto, Toronto, Canada M5S 2L7

Published 20 August 2018

Estrutura do Circuito – Quantum Amplitude Estimation with Quantum Phase Estimation



- Atuação do operador A

$$A|0\rangle^{\otimes n+1} = \sqrt{1-a} |\psi_0\rangle_n |0\rangle + \sqrt{a} \underbrace{|\psi_1\rangle_n}_{\text{Good State}} |1\rangle$$

$$a = \sum_{i=1}^{2^n} f(s_i) p_i = \underbrace{E[f(s)]}_{\text{Valor Esperado do payoff}}$$

- Recriando Estado

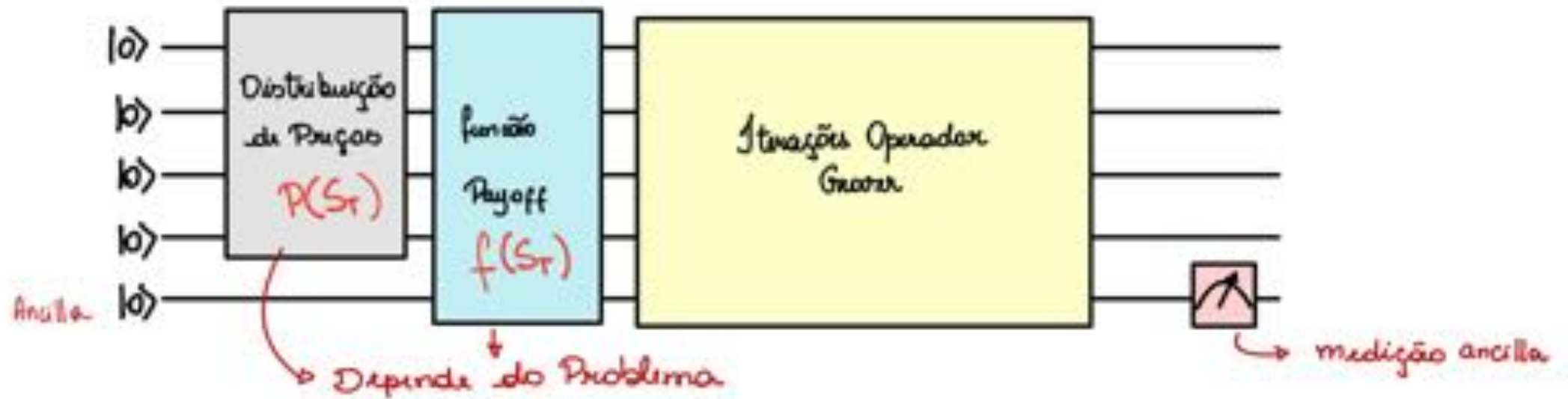
$$|\psi\rangle \equiv A|0\rangle^{\otimes n+1} = \cos(\theta_a) |\psi_{\text{bad}}\rangle + \sin(\theta_a) |\psi_{\text{Good}}\rangle$$

onde $\sin(\theta_a) = \sqrt{a}$ $\theta_a = \arcsin(\sqrt{a})$

- Operador Grover

$$Q^k |\psi\rangle = \cos[(2k+1)\theta_a] |\psi_{\text{bad}}\rangle + \sin[(2k+1)\theta_a] |\psi_{\text{Good}}\rangle$$

Algoritmo Maximum Likelihood Amplitude Estimation



Para problema payoff:

Distribuição

$$P(S_T) = \frac{1}{S_T \sigma \sqrt{2\pi T}} \exp\left[-\frac{(\ln S_T - \mu)^2}{2\sigma^2 T}\right]$$

$$A \equiv f(S_T) P(S_T)$$

$$Q = A S_0 A^{-1} S_{y_0}$$



Every investment entails some measure of risk—the fundamental question is whether the reward justifies the gamble.

Seeking Maximum Reward at Lowest Risk

Every investment entails some measure of risk—the fundamental question is whether the reward justifies the gamble. Accordingly, managing a diverse portfolio of financial assets entails a challenging balancing act in order to achieve the maximum reward with the lowest possible risk. This can be a feat of staggering complexity. For example, the number of possible configurations for a portfolio of eight assets in which transactions are performed every month for four years is far greater than the number of atoms in the known universe.

“I’ve seen a real transition in published papers from ‘toy’, model-type problems, to real commercial products...I think we’re really reaching that breakine point

Multiverse ↔ BBVA Study

Problem
Maximize the portfolio's return for a given risk.

Solution
Solutions are given by Modern Portfolio Theory

$$H_0 = \sum_i -\mu_i^T \omega_i + \frac{\gamma}{2} \omega_i^T \Sigma_i \omega_i + \lambda (\Delta \omega_i)^2.$$

Constraints

1. Diversification constraint.
2. Invest all available resources.

A Speedy Solution for Predicting Profitability

Method	10 ¹³⁹ solutions			10 ³⁸² solutions		
	XS	S	M	L	XL	XXL
VQE	3.59					
Exhaustive	6.31	8.90				
VQE Constrained	6.31	6.04	4.81			
Gekko	5.98	8.90	8.39	15.83	20.76	
D-Wave Hybrid	5.98	8.90	8.39	7.47	9.70	12.16
Tensor Networks	5.98	8.90	9.54	16.36	15.77	15.83

Sharpe ratios computed by the different methods for the different datasets and time periods.

Method	XS	S	M	L	XL	XXL
VQE	278					
Exhaustive	0.005	34				
VQE Constrained	123	412	490			
Gekko	24	27	21	221	261	
D-Wave Hybrid	8	39	19	52	74	171
Tensor Networks	0.838	51	120	26649	82698	116833

Run-times (in seconds) estimated for the different methods for the different datasets.

PayPal & D-Wave Collaboration

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Innovative Approach

"Correlation method" (Milne et al., 2017)

$$f(x) = - \left[\alpha \sum_{i=1}^n a_i(x_i) - (\beta + \alpha) \sum_{i=1}^n \sum_{j=1}^n a_i(x_i) a_j(x_j) \right]$$

Mutual and conditional mutual information (Nguyen et al.)

$$MI(X; Y) = \sum_{x,y} p(x,y) \log \frac{p(x,y)}{p(x)p(y)}$$

QBoost (Neven et al., 2008, 2012 and others)

$$w^{opt} = \arg \min_w \left(\sum_{i=1}^n \left(\sum_{j=1}^n w_j A_j(x_i) - \beta \right)^2 + \lambda \|w\|_1 \right)$$

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Technical Details

Models



- **Select / Develop models**
 - 3 QUBO-based Quantum models
 - 2 Classic models
- **Benchmark metrics:**
 - log-loss (threshold agnostic)
 - Accuracy (threshold sensitive)

Data Set



- **Start with a small dataset**
 - 80 features and 1,000 examples
- **Move to larger dataset in 2nd phase**
 - 500 - 1,000 features and million examples

Assessments



- **Compare and benchmark**
 - QC vs. Classical models - one by one
- **Performance & quality of selection**
- **Evaluate using different metrics**

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Development Roadmap | Executed by IBM On target

IBM Quantum

2019 

Run quantum circuits on the IBM Q cloud

2020 

Demonstrate and analyze quantum algorithms and applications

2021 

Run quantum programs 100x faster with Qiskit Runtime

2022

Bring dynamic circuits to Qiskit Runtime to unlock more computations

2023

Enhancing applications with elastic computing and parallelization of Qiskit Runtime

2024

Improve accuracy of Qiskit Runtime with adaptive error mitigation

2025

Scale quantum applications with circuit knitting, hybrid computing, Qiskit Runtime

Beyond 2026

Increase accuracy and speed of quantum workflows with integration of error correction into Qiskit Runtime

Model Development

Prototype quantum software applications

Quantum software applications

Machine learning | Natural science | Optimization

Algorithm Development

Quantum algorithm and application modules

Machine learning | Natural science | Optimization

Quantum Services

Intelligent compilation

Circuit knitting Runtime

Circuit reversal

Kernel Development

Qiskit

Qiskit Runtime

Dynamic circuits

Threaded primitives

Error suppression and mitigation

Error correction

System Modularity

Falcon 27 qubits

Hummingbird 46 qubits

Eagle 127 qubits

Osprey 432 qubits

Condor 1,121 qubits

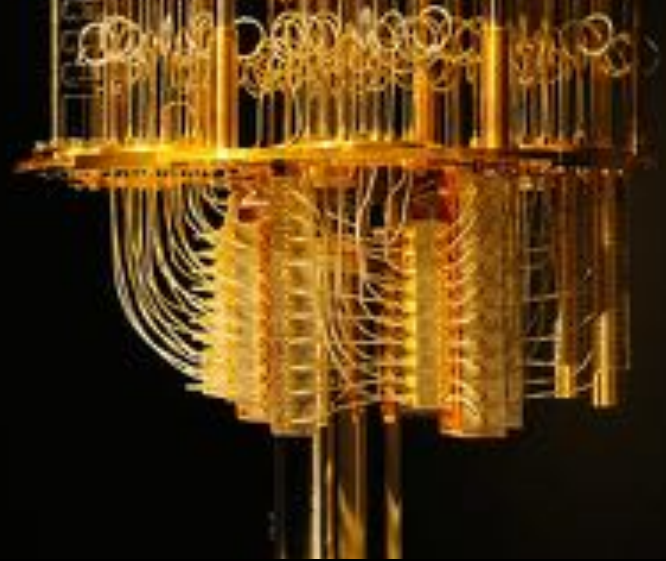
Flamingo 1,584+ qubits

Kookaburra 4,114+ qubits

Scaling to 10M-100M qubits with classical and quantum communication

Heron 132 qubits + p

Crossbill 408 qubits



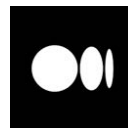
Keep in touch!



Samurái Brito, PhD Física
Head of Quantum
Itaú Unibanco



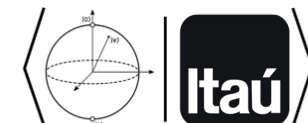
<https://www.linkedin.com/in/samurai-brito>



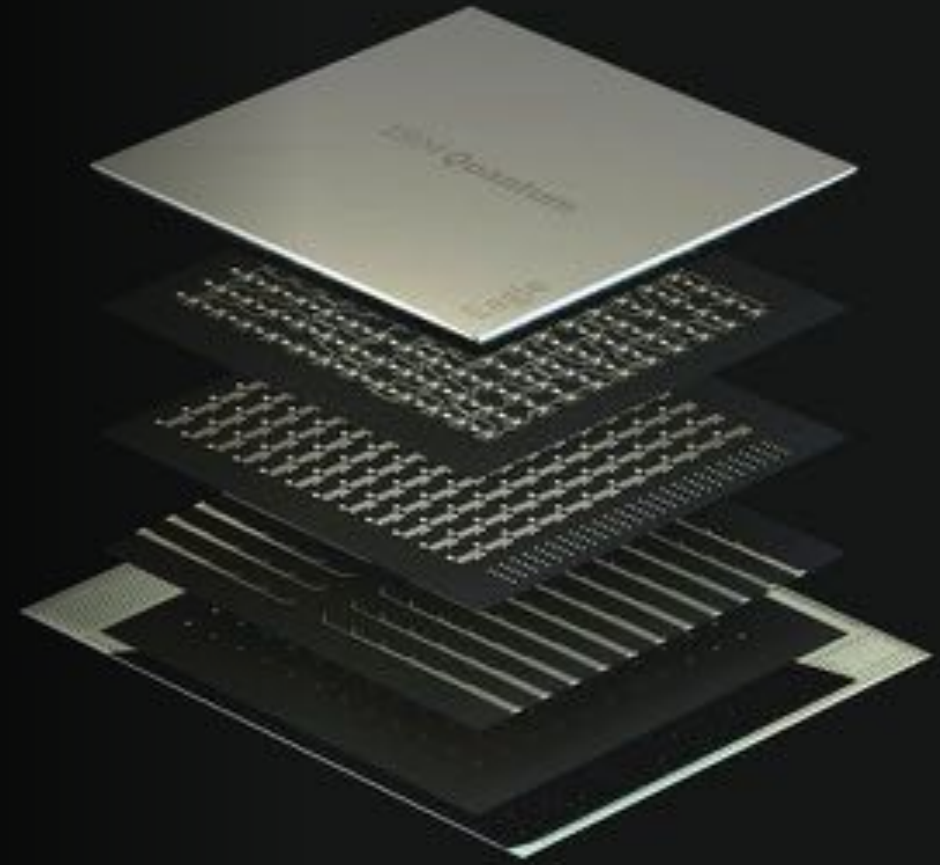
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