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**SÉMINAIRE
DEEP TECH**

**9-10
AVRIL
2024**

**CHÂTEAU LOUISE DE LA VALLIÈRE
REUGNY, INDRE-ET-LOIRE**

**LES TECHNOLOGIES QUANTIQUES
AU SERVICE DE LA SANTÉ**

Olivier Ezratty

CONSTRUIRE L'AVENIR AVEC LA DEEP TECH





DA VINCI LABS

les technologies quantiques au service de la santé

olivier ezratty

⟨ auteur | ... ⟩

Tours, 10 avril 2024

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quantum sensors

- less invasive imaging (MRI, MEG) and better precision biological sensors (NV centers).

drugs discovery

- DNA sequence alignment.
- de novo DNA sequence.
- protein folding and interactions with ligands.
- force field and electronic structure computation.
- screening and generation of molecular entities as drug candidates.
- drug retargeting.

diagnostics

- medical images classification and reconstruction.
- disease assesement based on genomic samples.
- clinical data classification and analysis.
- disease risk prediction.
- clustering of similar individuals.

treatments

- persistence and health-related behavior prediction.
- treatment and intervention effectiveness forecasting.
- disease outbreak prediction and spread modeling.
- precision oncology.
- tailored radiotherapy.
- hospital capacities optimization.

simulating nature

- chemical simulations.

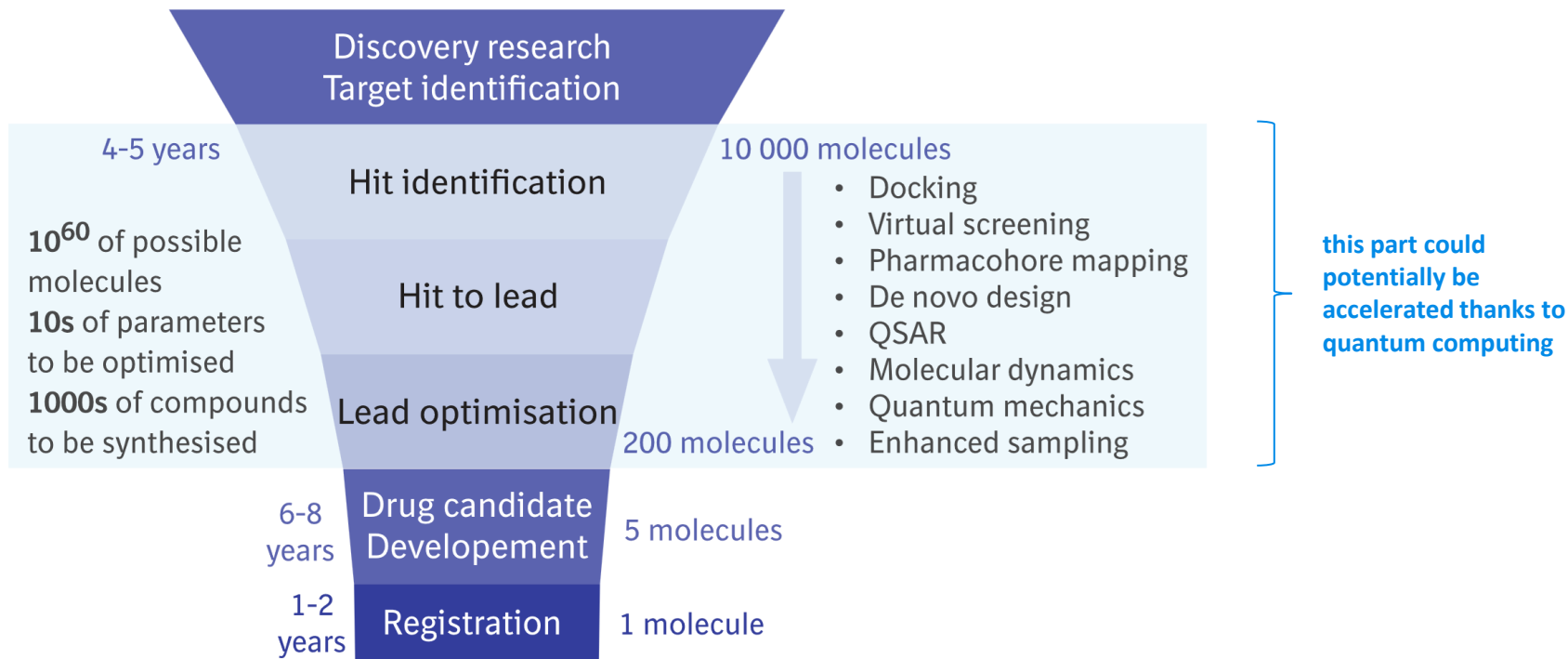
data processing

- images and structured data.
- quantum machine learning.

search and optimizations

- various datasets.

fasten drug discovery

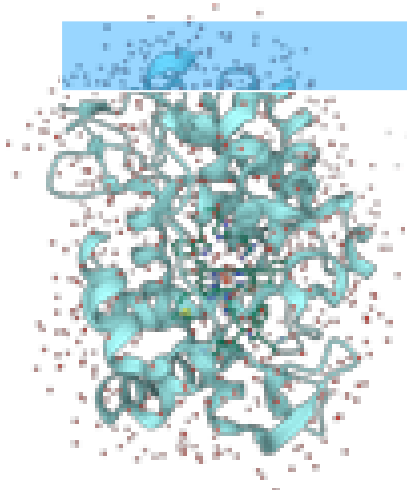


Source: Drug design on quantum computers by Raffaele Santagati, Alan Aspuru-Guzik, Nathan Wiebe et al, January 2023 (9 pages)

common electronic structure methods employed on classical computers

commonly used quantum chemistry methods to solve the electronic structure problem. In the left column, we zoom in on the Compound I intermediate of Cytochrome c Peroxidase (PDB ID: 1ZBZ [71{73}]).

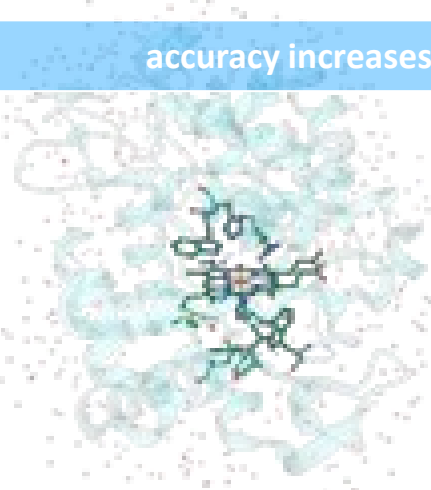
accuracy increases as molecule are smaller



Cytochrome in solution

Force Fields/ Semi-empirical Methods

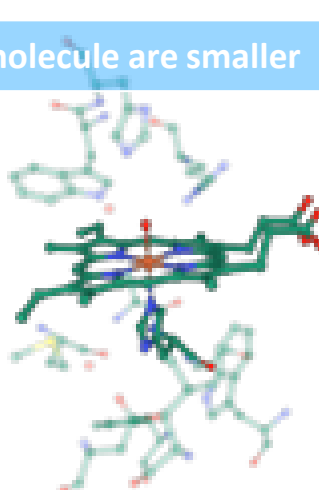
Methods that cannot fully describe quantum mechanical effects but can be tuned with information from quantum methods.



Cytochrome binding site

Hartree-Fock/Density Functional Theory (DFT)

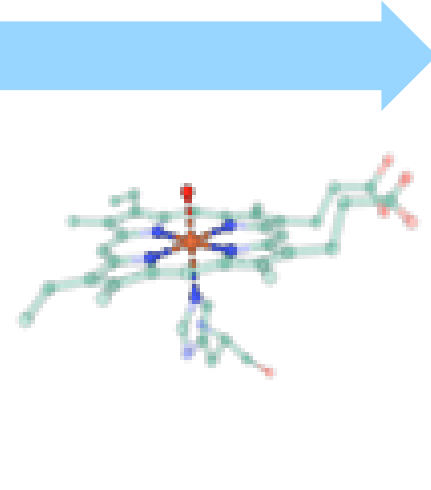
Mean-field methods treat electrons in the presence of the average potential of the other electrons. DFT includes electronic correlation, while Hartree-Fock does not.



Cytochrome heme site

Coupled-Cluster (CC)

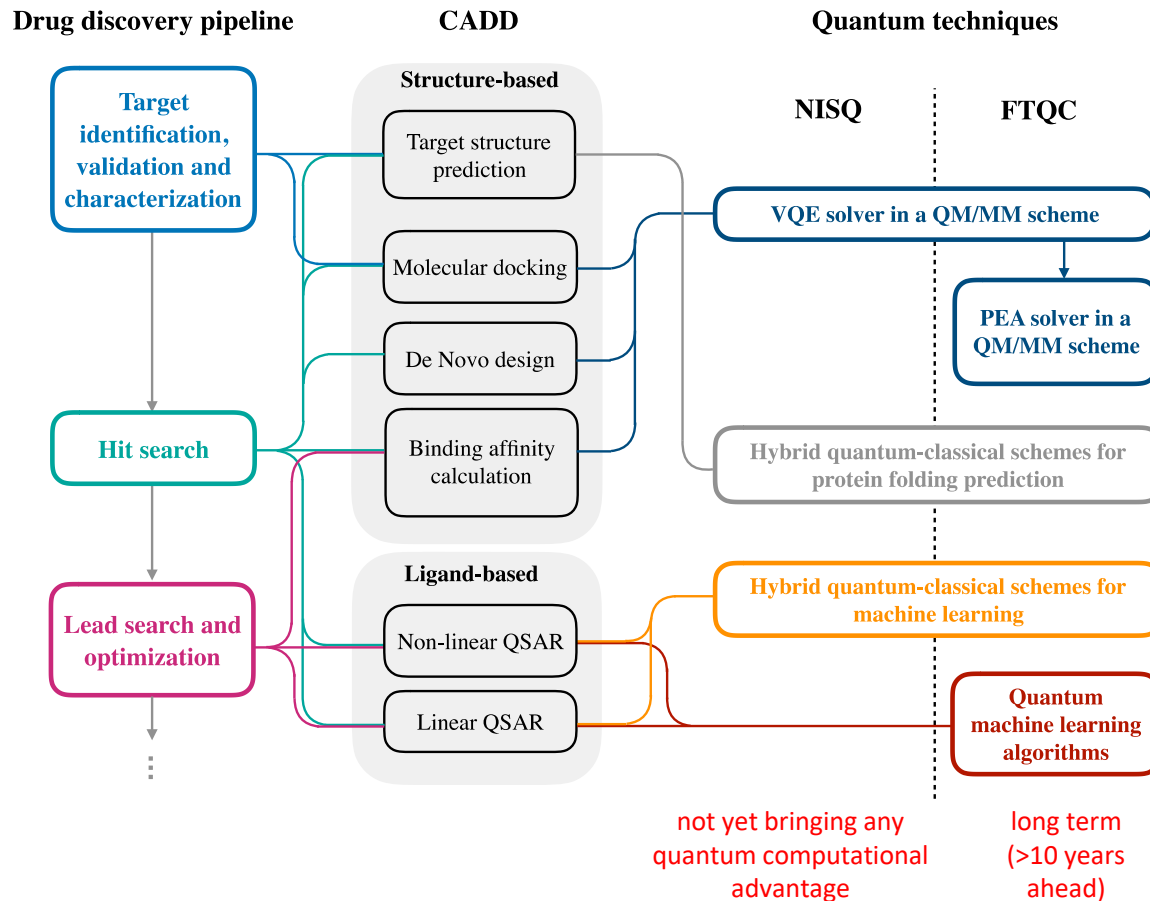
Cluster wavefunction methods that expand around a single mean-field reference.



Cytochrome iron cluster

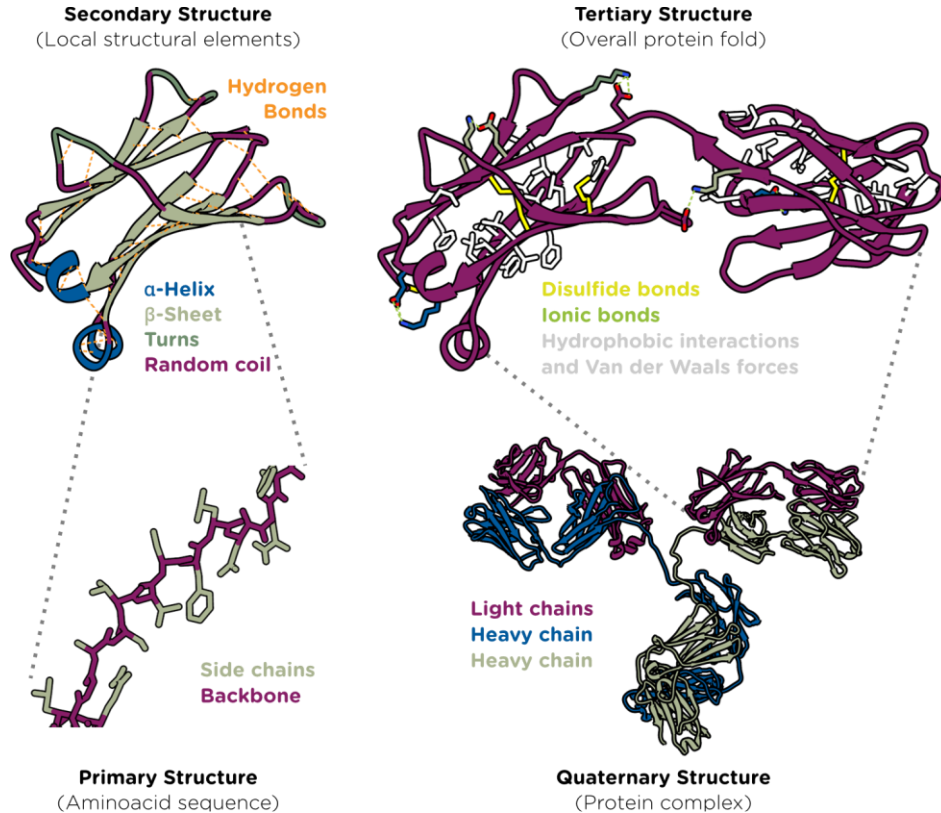
Full Configuration Interaction (FCI)

Method that delivers the exact energy of the electronic structure problem within a finite basis set.



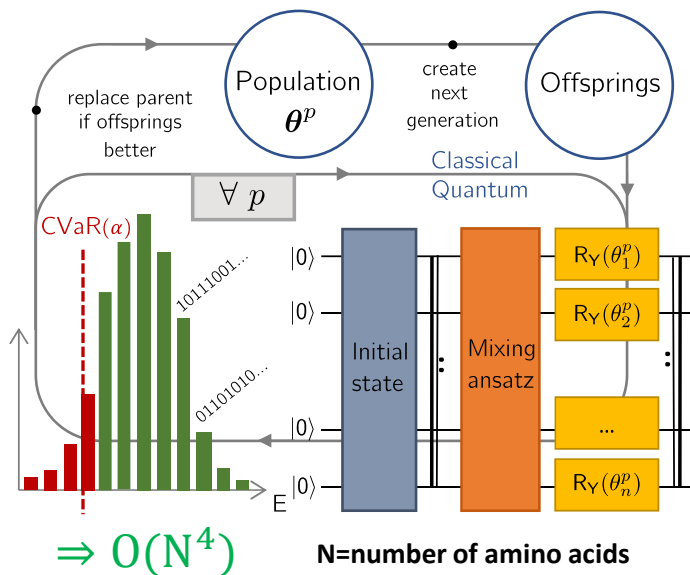
Source: Potential of quantum computing for drug discovery by Alán Aspuru-Guzik et al, 2018 (18 pages).

protein folding requirements

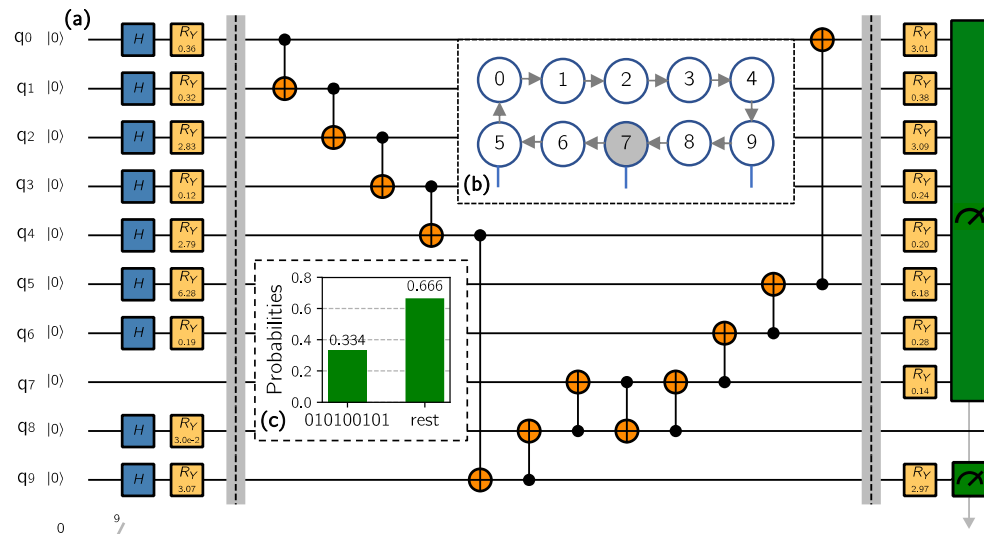


quantum-based protein folding simulation

quantum variational algorithm
+ genetic algorithm optimize



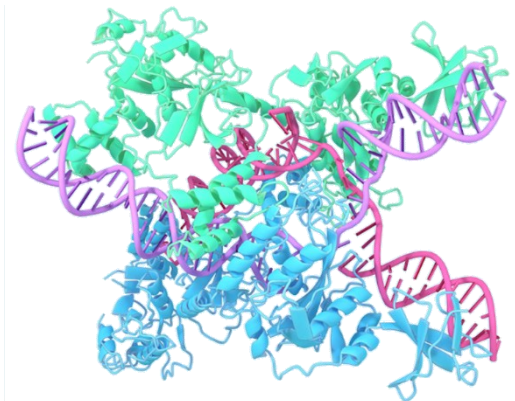
10 amino acid Angiotensin on 22 qubits



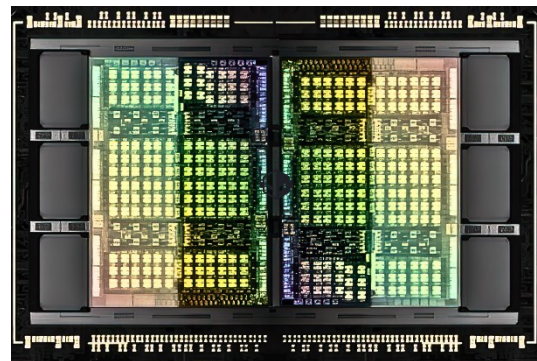
current AlphaFold record is with 450 amino acids.

source: Resource-efficient quantum algorithm for protein folding, Anton Robert et al, 2020.

challenges



AlphaFold 3 can now generate predictions for nearly all molecules in the Protein Data Bank (PDB), frequently reaching atomic accuracy



Blackwell GPU with 200 billion transistors and DGX B200 with 8 B200, 144 petaFLOPS inference workloads.

Source: A glimpse of the next generation of AlphaFold, Google DeepMind AlphaFold team and Isomorphic Labs team, October 2023.

tensor network techniques

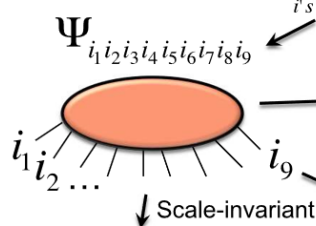
Tensor Networks

e.g. RO, *Annals of Physics* **349** (2014) 117–158

$$A \cdot B \rightarrow \begin{array}{c} A \quad B \\ \text{---} \circ \text{---} \circ \text{---} \end{array}$$

$$|\Psi\rangle = \sum_{i^s} \Psi_{i_1 i_2 \dots i_N} |i_1\rangle \otimes |i_2\rangle \otimes \dots \otimes |i_N\rangle$$

p-level systems

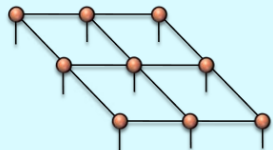


1d



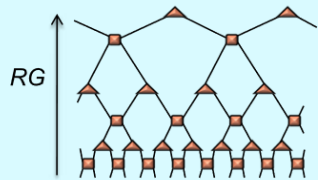
2d, 3d...

**Projected Entangled Pair States (PEPS),
Tensor Product States (TPS)**



Tensor Product Variational Approach, PEPS & iPEPS algorithms, Tensor-Entanglement Renormalization, TRG/SRG/HOTRG/HOSRG...

Multiscale Entanglement Renormalization Ansatz (MERA)



AdS/CFT, Entanglement Renormalization

Efficient $O(\text{poly}(N))$, satisfy area-law, low-energy eigenstates of local Hamiltonians

vector \vec{v}



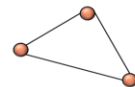
matrix A



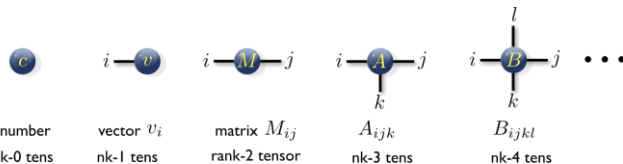
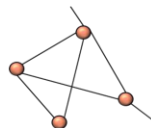
matrix product AB



trace of matrix product $\text{tr}(ABC)$



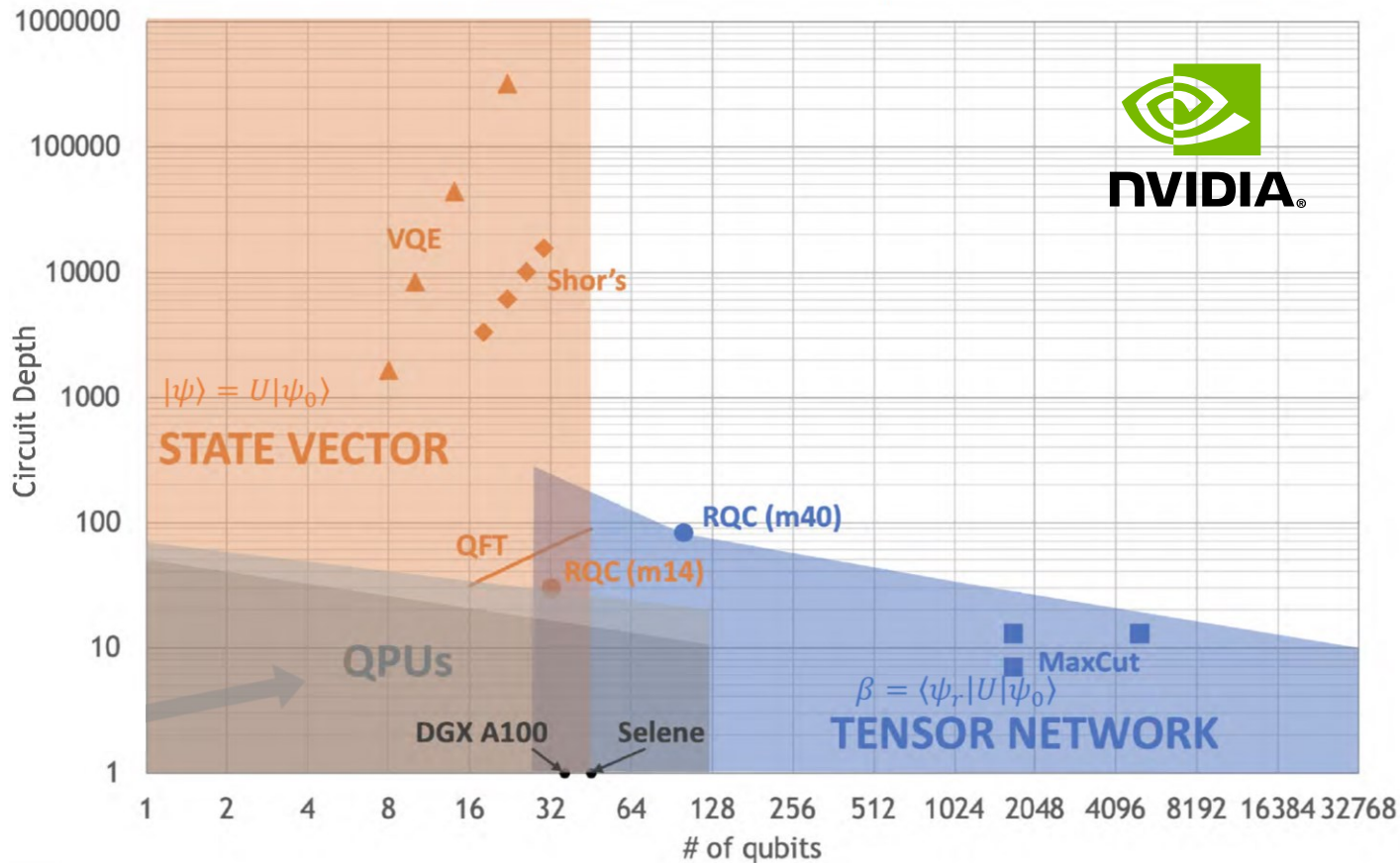
tensor contraction $f(A, B, C, D)$



$$\begin{array}{c} i \quad j \\ \text{---} \circ \text{---} \end{array} = \begin{array}{c} i \\ \text{---} \circ \end{array} \sum_j M_{ij} v_j = u_i$$

sources: Introduction to Tensor Network States and Methods by Román Orús, DIPC & Multiverse Computing, 2020 (229 slides) and Lecture 1: tensor network states by Philippe Corboz, Institute for Theoretical Physics, University of Amsterdam (56 slides).

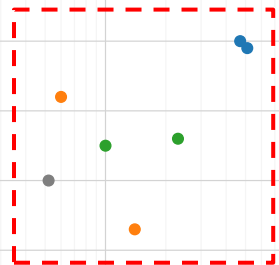
Researching & Developing the Computers of Tomorrow Requires Powerful Simulations Today



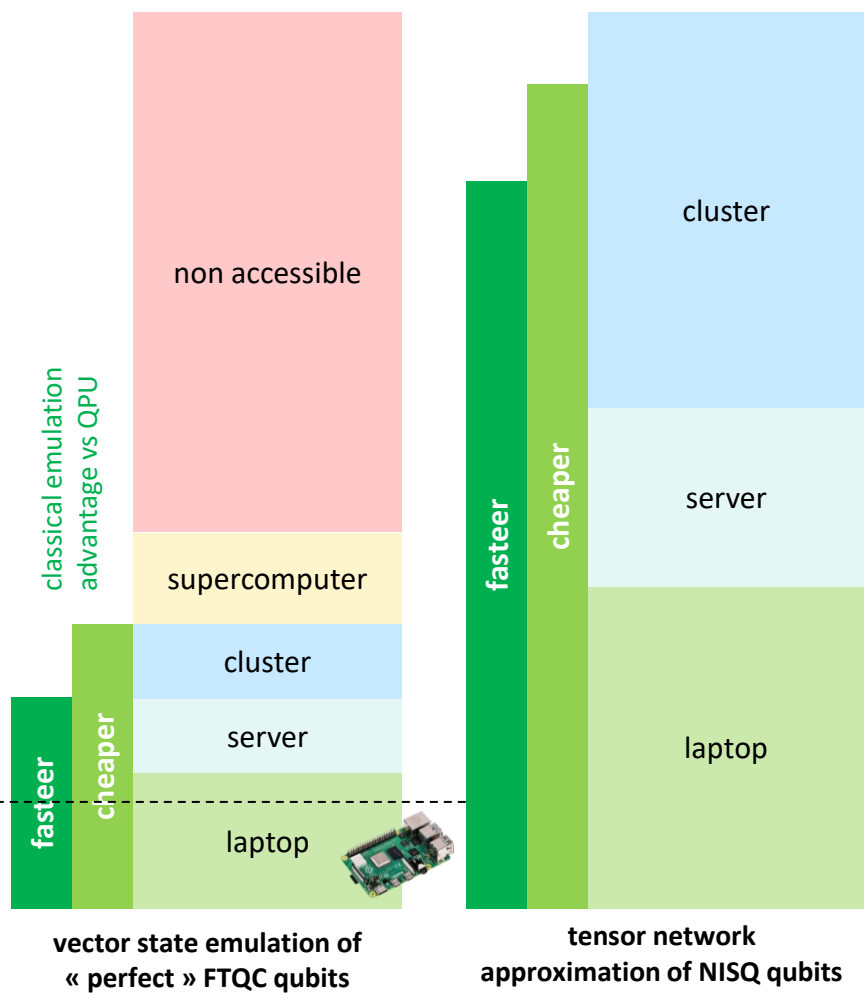
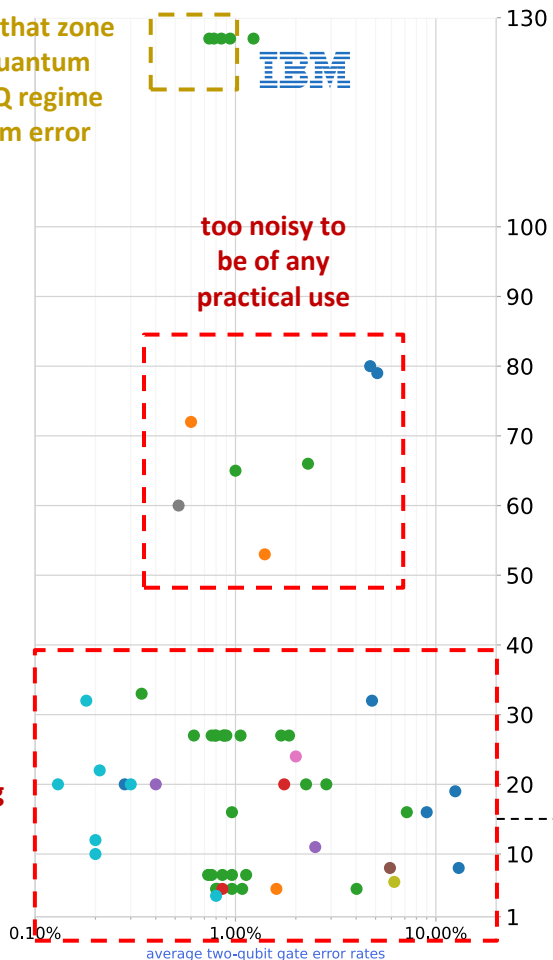
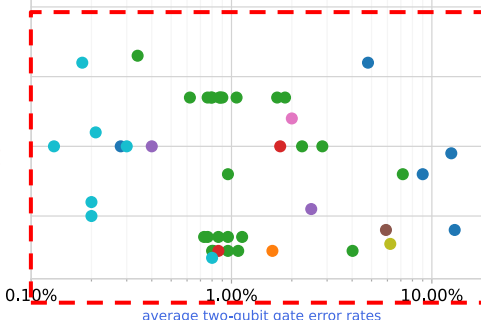
a QPU case study in that zone may bring some quantum advantage in a NISQ regime with using quantum error mitigation



too noisy to be of any practical use



any QPU case study in that zone cannot bring any business value



(cc) Olivier Ezratty, 2023

assessing QC case studies

criteria	case 1	case 2	case 3	case 4
problem sizing	small scale	larger scale	large scale	very large scale
resource estimates	tested with <30 qubits		>1,000 logical qubits	>10K logical qubits
quantum advantage	results quality		speedup	
QPU type	NISQ or emulator	analog	FTQC	large FTQC
	equivalent to a classical computing case	approaching quantum advantage	long term applicability	very long term applicability

understanding « case studies »

Quantum algorithm for bioinformatics to compute the similarity between proteins

February 2024

Anthony Chagneau¹, Yousra Massaoudi², Imene Derbali², and Linda Yahiaoui²

¹Expleo Group, Agence Méditerranée, 2 Impasse de Chasles, Z.A Cap Horizon, Vitrolles, 13127, France

²Expleo Group, 21 Rue André Lwoff, Saint-Priest, 69800, France

- **QAOA algorithm on a 5 noisy IBM QPU qubits.**
- **50 amino acid string generation.**
- *“Quantum Needleman-Wunsch does **not** give good results for a random protein provided with the quantum generator contrary to Quantum Smith-Waterman algorithm. Moreover, the structure of the scoring matrix constructed with the Needleman-Wunsch algorithm is less adapted for QAOA. **QAOA has difficulty finding the fundamental state of the quantum system** due the spectrum of the scoring matrix is globally symmetrical, resulting in a **very slow resolution time**, which is not the case for the Smith-Waterman or the Conflict graph algorithms”.*

Quantum Support Vector Machine for Prostate Cancer Detection: A Performance Analysis

W. El Maouaki*¹, T. SAID¹, and M. BENNAI^{1,2}

¹Quantum Physics and Magnetism Team, LPMC, Faculty of Sciences Ben M'Sik, Hassan II University of Casablanca, Morocco

²Lab of High Energy Physics, Modeling and Simulations, Faculty of Sciences, University Mohammed V-Agdal, Rabat, Morocco

- **tested on 8 qubits on a Qiskit emulator.**
- **no “quantum” advantage.**

March 2024

other cases studies

Brain Tumor Diagnosis Using Quantum Convolutional Neural Networks

Muhammad Al-Zafar Khan^{¶||}, Nouhaila Innan^{‡*}, Abdullah Al Omar Galib^{§†}, Mohamed Bennai^{‡**}

[¶]Quantum United Arab Emirates (QUAE), UAE

[‡]Quantum Physics and Magnetism Team, LPMC, Faculty of Sciences Ben M'sick,
Hassan II University of Casablanca, Morocco

[§]Independent Researcher

^{||}m.khan@quae.ac, ^{*}nouhaila.innan-etu@etu.univh2c.ma, [†]abdullahalomargalib@gmail.com, ^{**}mohamed.bennai@univh2c.ma

January 2024

- **good results.**
- **tested on a 5-qubit emulator.**
- **no “quantum” speedup advantage.**
- **this is classical computing.**

Peptide Binding Classification on Quantum Computers

Charles London^{1†} Douglas Brown^{1†} Wenduan Xu¹ Sezen Vatansever²

Christopher James Langmead² Dimitri Kartsaklis¹ Stephen Clark¹

Konstantinos Meichanetzidis¹

{charles.london; douglas.brown; wenduan.xu; dimitri.kartsaklis; steve.clark; k.mei}@quantinuum.com

{svatanse; clangmea}@amgen.com

¹Quantinuum, 17 Beaumont St., Oxford, OX1 2NA, UK

²Amgen, 1 Amgen Center Dr., Thousand Oaks, 91320, CA, USA

November 2023

- **good results.**
- **tested on a 8-qubit Quantinuum QPU.**
- **no “quantum” speedup advantage.**

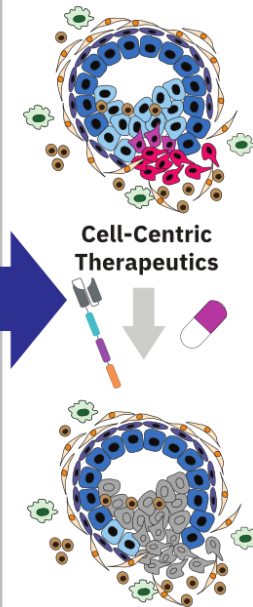
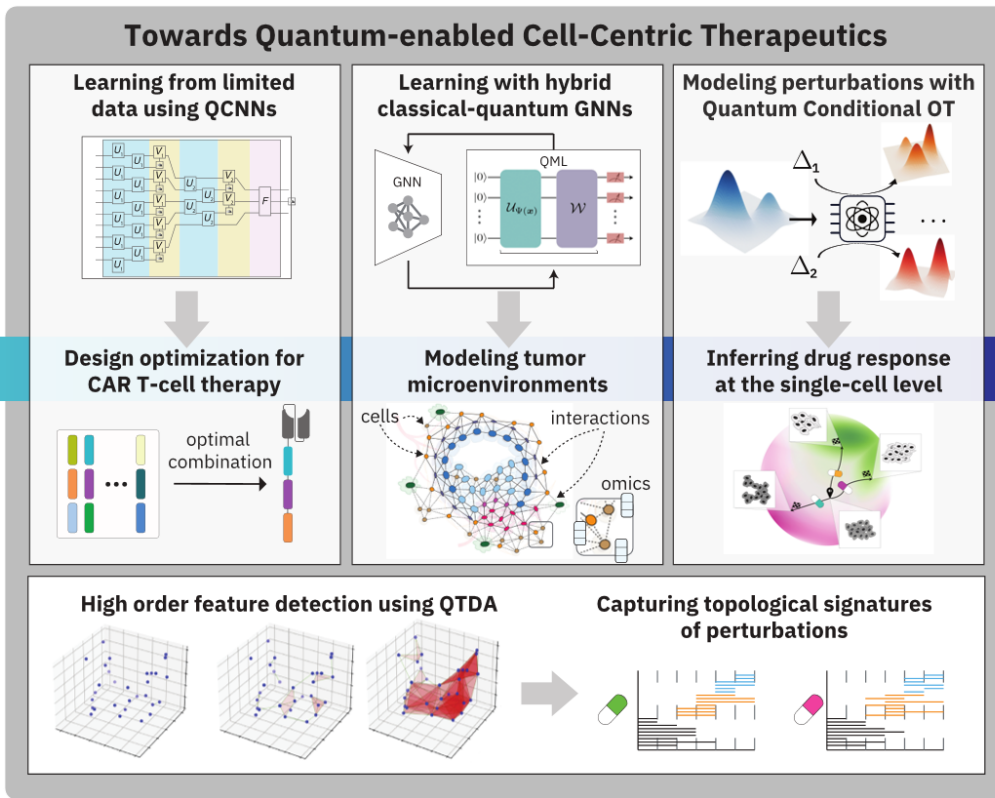
quantum-based multi-omics



spatial single-cell multi-omics

tissue imaging organoid drug screens

drug profiles clinical data



source: Towards quantum-enabled cell-centric therapeutics by Saugata Basu et al, IBM Research, July 2023.

drug discovery pipeline

source: Generalizable Quantum Computing Pipeline for Real World Drug Discovery by Weitang Li et al, arXiv, January 2024.

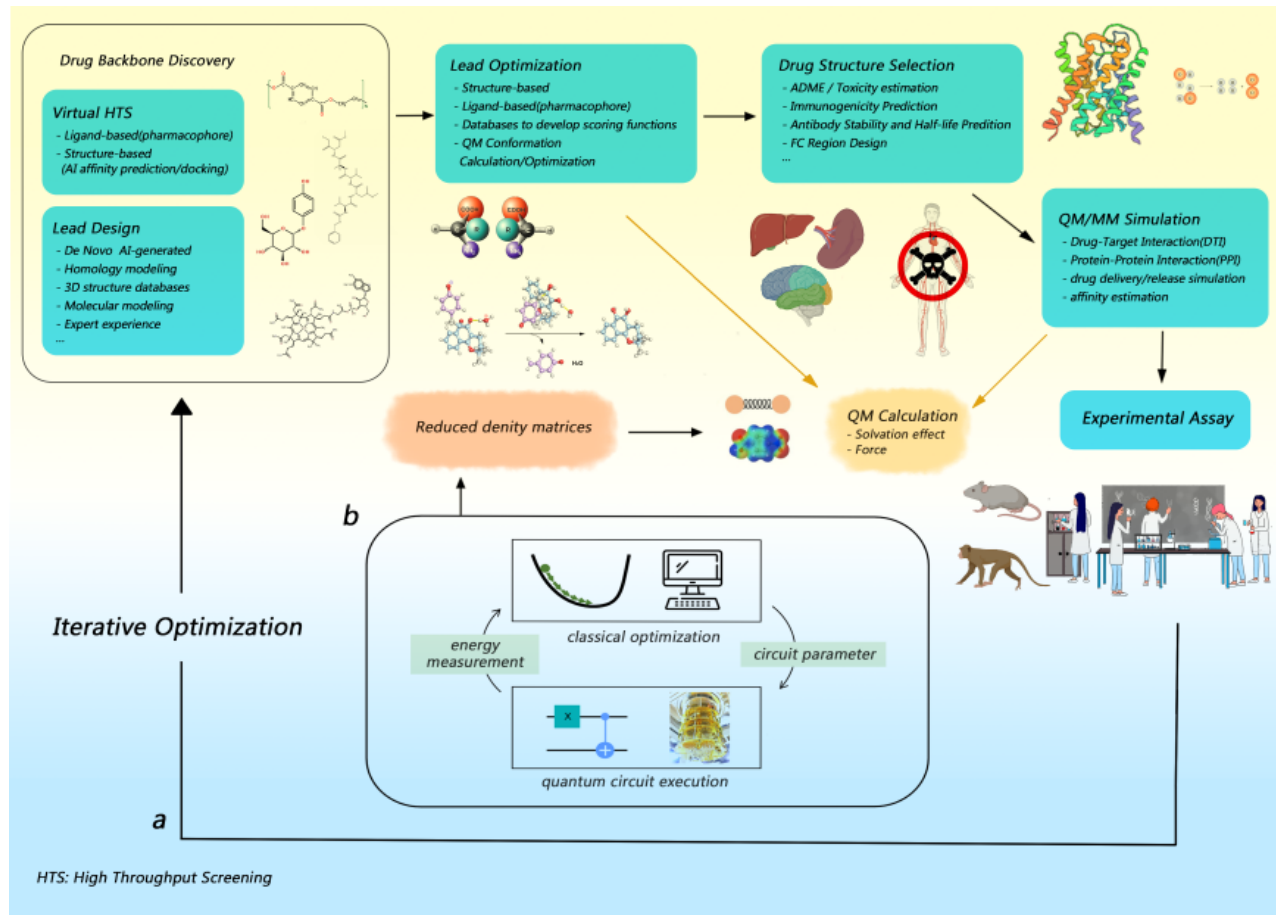


TABLE II. Comparison of computational wall times for classical computing (CASCI) and quantum computing (VQE) on solving the active space of molecule **4**, **5**, **6**, and **TS**.

Molecule	Computational Wall Time (s)	
	CASCI	VQE
4	358	424
5	3	63
6	97	161
TS	360	424

classical
method

current VQE
NISQ based
method

source: Generalizable Quantum Computing Pipeline for Real World Drug Discovery by Weitang Li et al, arXiv, January 2024.

river lane

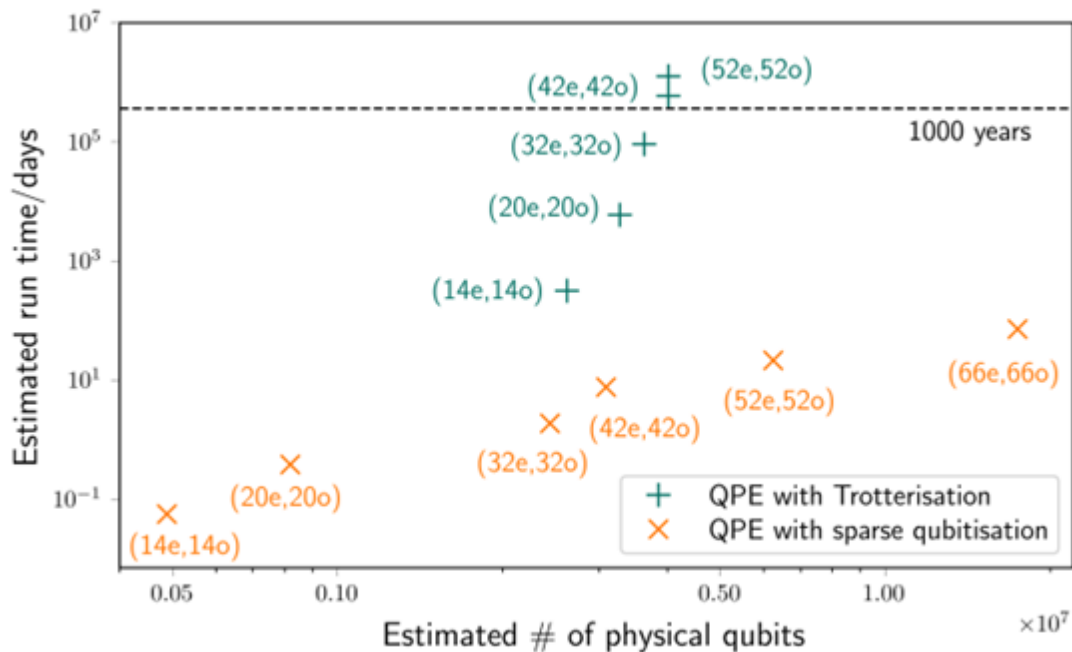


Figure 7: Comparison of resources (runtime and total number of physical qubits) using two QPE algorithms. The first (orange) used qubitisation, and the Hamiltonian was truncated to remove small terms up to an error budget. The second (green) used textbook QPE with Trotterisation and no truncation of the Hamiltonian. The latter algorithm has a much steeper scaling in runtime. Even for a (14e,14o) active space the runtime is multiple orders of magnitude more expensive.



IBM Quantum
System One



Cleveland Clinic

D-Wave use cases in healthcare



cancers classification

multi-omics: genomics + symptoms in QML

source: D-Wave



liver donor optimization

NP-complete complete problem using QUBO

source: Accenture, D-Wave



radiotherapy optimization

to minimized x-ray dose

source: Roswell Park, D-Wave



de-novo proteins and polypeptides creation

with hybrid computing, tests in research against the covid-19 virus.

source: D-Wave



drug retargeting

with Biogen, 1QBit and Accenture research

source: D-Wave



Pasqal use cases in healthcare

quantum algorithms able to
sample equilibrium water solvent
molecules configurations within
proteins thanks to analog
quantum computing

Leveraging Analog Quantum Computing with Neutral Atoms for Solvent Configuration Prediction in Drug Discovery

Mauro D'Arcangelo^{1, +}, Daniele Loco^{2, +}, Fresnel team¹, Nicolai Gouraud^{2,3,4}, Stanislas Angebault², Jules Sueiro², Pierre Monmarché³, Jérôme Forêt², Louis-Paul Henry¹, Loïc Henriet^{1, *}, and Jean-Philip Piquemal^{2,4, *}

¹Pasqal, 7 Rue Léonard de Vinci, 91300 Massy, France

²Qubit Pharmaceuticals, Advanced Research Department, 24 rue du Faubourg Saint-Jacques, 75014 Paris, France

³Sorbonne Université, Laboratoire Jacques-Louis Lions, UMR 7589 CNRS, 75005, Paris, France

⁴Sorbonne Université, Laboratoire de Chimie Théorique, UMR 7616 CNRS, 75005, Paris, France

^{*}loic.henriet@pasqal.com, jean-philip.piquemal@sorbonne-universite.fr

⁺these authors contributed equally to this work



PASQAL

Qubit
PHARMACEUTICALS

Quantum Feature Maps for Graph Machine Learning on a Neutral Atom Quantum Processor

Boris Albrecht,^{1, *} Constantin Dalyac,^{1,2, *} Lucas Leclerc,^{1,3, *} Luis Ortiz-Gutiérrez,^{1, *} Slimane Thabet,^{1,2, *} Mauro D'Arcangelo,¹ Vincent E. Elfving,¹ Lucas Lassablière,¹ Henrique Silvério,¹ Bruno Ximenez,¹ Louis-Paul Henry,¹ Adrien Signoles,¹ and Loïc Henriet^{1, †}

¹PASQAL, 7 rue Léonard de Vinci, 91300 Massy, France

²LIP6, CNRS, Sorbonne Université, 4 Place Jussieu, 75005 Paris, France

³Université Paris-Saclay, Institut d'Optique Graduate School, CNRS, Laboratoire Charles Fabry, 91127 Palaiseau, France

(Dated: November 30, 2022)

toxicity screening experiment, consisting of a binary classification protocol on a biochemistry dataset comprising 286 molecules of sizes ranging from 2 to 32 nodes, and obtain results which are comparable to those using the best classical kernels

A blueprint for a Digital-Analog Variational Quantum Eigensolver using Rydberg atom arrays

Antoine Michel,^{1,2, *} Sebastian Grijalva,³ Loïc Henriet,³ Christophe Domain,¹ and Antoine Browaeys²

¹Electricité de France, EDF Recherche et Développement, Département Matériaux et Mécanique des Composants, Les Renardières, F-77250 Moret sur Loing, France

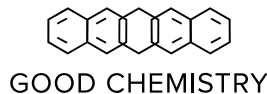
²Université Paris-Saclay, Institut d'Optique Graduate School, CNRS, Laboratoire Charles Fabry, F-91127 Palaiseau Cedex, France

³PASQAL, 7 rue Léonard de Vinci, F-91300 Massy, France

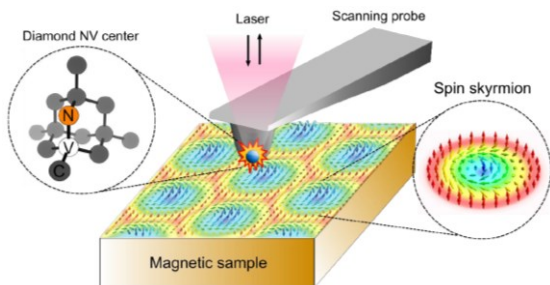
(Dated: April 25, 2023)

estimating the ground-state energy of Hamiltonians coming from chemistry. Study numerically the behavior of a digital-analog variational quantum eigensolver for the H₂, LiH and BeH₂ molecules.

chemistry and healthcare QC startups

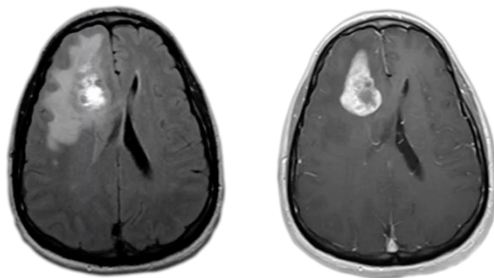


quantum sensors in healthcare

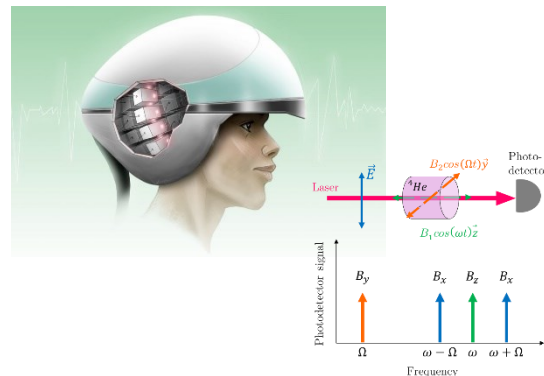


magnétomètres ultrasensibles
 $210 \text{ fT}/\sqrt{\text{Hz}}$

medical imaging
biological analysis



SQUID based
ultra-low field MRI

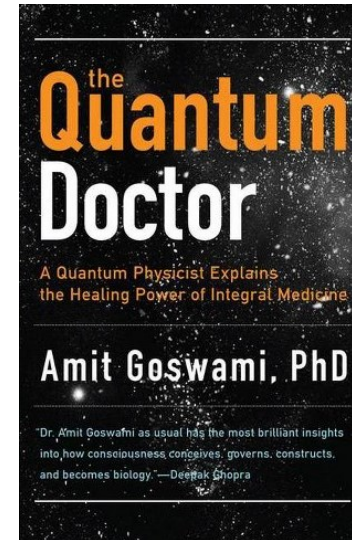
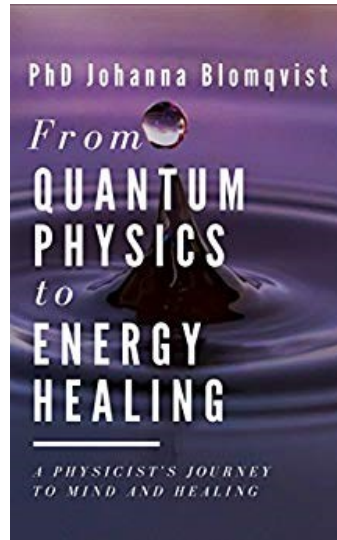
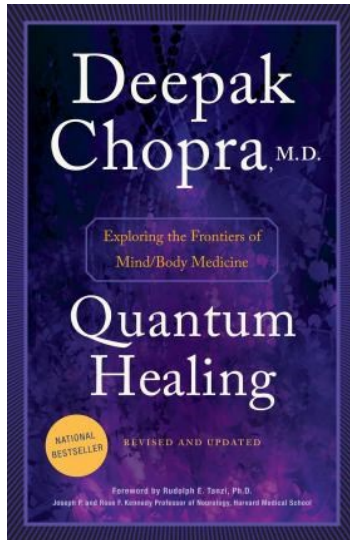


helium 4 nucleus spin
MEG brain imaging

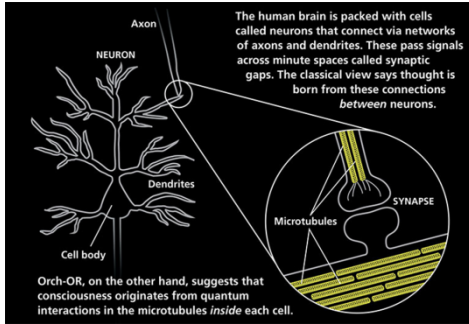
key takeaways

1. quantum computing can bring significant advantage like with **quantum simulations** for drug discovery but only in a FTQC regime.
2. it will require a **large number of logical and physical qubits** and require some patience.
3. quantum algorithms can be tested at **small scales** with existing QPUs or emulators.
4. there are some interesting **analog quantum computing** use cases, particularly for optimizations.
5. **quantum sensors** already work.

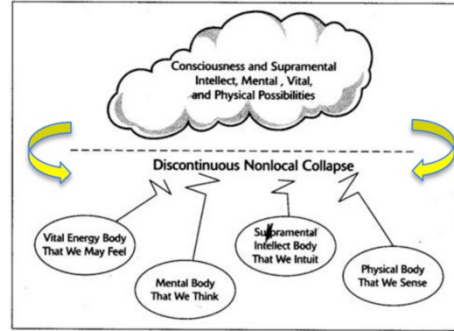
exponential b t



fake quantum medicines

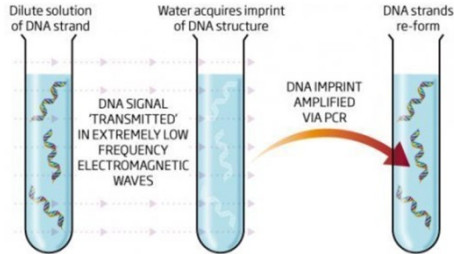


Roger Penrose's Orch-OR theory



Quantum consciousness

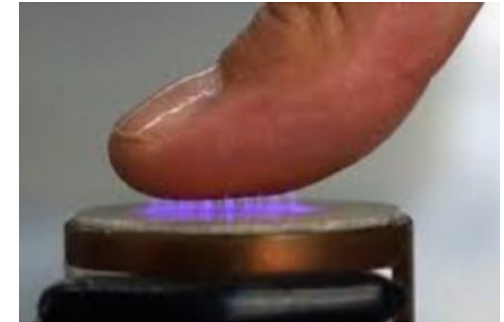
What Montagnier claims ©NewScientist
A weak electromagnetic field can form an imprint of a DNA strand in pure water, which can then be used to reconstruct the original DNA



Water memory



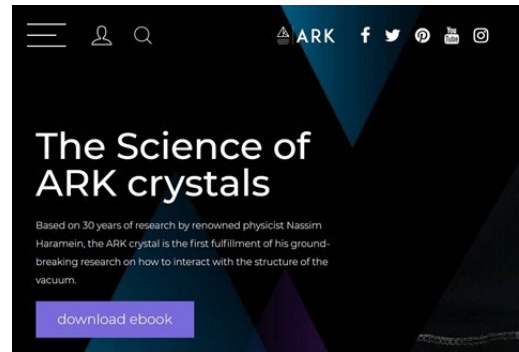
Structured water



Biophotons detectors



Scalar waves generators



Magic quantum crystals



Quantum Shield medallions



**5G BioShield
"quantum holographic catalyst"**



Roll over image to zoom in



i9Bottle Chakra - Healing Crystals, Reusable Glass Water Bottle, Yoga Bottle, Relieve Stress, Super Hydration, Increases Physical Fitness, Body Detox, Chakra Balancing, Sustainable Gifts, Zero Waste, Meditation

Brand: i9

★★★★★ 102 ratings

Amazon's Choice for "i9 bottle"

\$59⁹⁰

No Import Fees Deposit & \$13.89 Shipping to France [Details](#) ▾

Material	Glass, Silicone
Brand	i9
Capacity	1.4 Pounds
Age Range (Description)	Women aged 30 to 70 years
Special Feature	The bottle improves water quality

\$59⁹⁰

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discussion