



Publications

Voici quelques documents publiés depuis 2005, tous gratuitement et téléchargeables sur ce blog sous forme de PDF en général et parfois en ePub par ordre décroissant de parution :

- **L’essai AI, LLMs and quantum science can empower each other?** (24 pages avec 70 pages d’annexes, un index et une bibliographie, janvier 2024) qui décrit notamment le rôle existant et potentiel des chatbots à base de grands modèles de langage pour accompagner les enseignants, étudiants, chercheurs et professionnels des sciences et technologies quantiques.

How AI, LLMs and quantum science can empower each other?
Olivier Ezratty
Author of the Understanding Quantum Technology book, Paris, France - olivier@ezratty.net

Large Language Models (LLMs) based chatbots such as OpenAI, ChatGPT 4.0 and Google Bard are emblematic of the broader generative artificial intelligence advances. They have generated substantial interest in academic, economic and policy making discussions. This paper aims to examine the intersection of LLMs chatbots with quantum science and technology, focusing on their potential to empower research methodologies and pedagogical approaches within these disciplines. It explores with many examples the capabilities of LLM-based tools by reviewing their existing and potential future utility to various scientific domains and in the industry. These range from facilitating basic, question-and-answer interactions to more complex activities such as software development, writing scientific papers, scientific paper reviewing, experiment preparation, research literature and funding collaborative research projects in quantum science. The first of several LLMs and other related tools implementing various forms of wide quantum reasoning suggests they have the potential to significantly alter the research and educational landscape, especially in the manufacturing space of the former and in research tools. Accordingly, this paper reviews the creation of a quantum science domain specific LLM based chatbot using open source models and scientific corpus. It also contextualizes LLM-based chatbots within the broader spectrum of machine learning techniques which are directly used in the advancement of quantum science and technology. It then quickly explores how quantum computing might or might not further advance machine learning applications and language-based models. The conclusion is that AI may have a profound impact in shaping the trajectory of quantum science research, education, and technology development while the other way around is quite uncertain, at best or the other way round.

I. INTRODUCTION.....	2	Quantum LLMs.....	23
II. LLM-BASED CHATBOTS PRIMER.....	2	Quantum Inspired Algorithms.....	23
LLM features.....	2	VI. DISCUSSION.....	24
LLM size and training data.....	6	VII. SUPPLEMENTAL MATERIALS.....	25
Figures of merit.....	8	ChatGPT 4.0 on superposition.....	25
Emergent engineering.....	8	ChatGPT 4.0 on entanglement.....	25
Domain specific LLM chatbots.....	9	ChatGPT 4.0 on quantum algorithms.....	27
Emergent capabilities.....	10	ChatGPT 4.0 and Bard on NMRQC and IQOCC.....	29
III. LLMs IN QUANTUM SCIENCE.....	11	ChatGPT 4.0 and Google Bard on bosonic qubits.....	33
Learning.....	12	ChatGPT 4.0 on figures of merit.....	34
Reviewing papers.....	15	ChatGPT 4.0 and Google Bard on a quantum writer.....	44
Writing papers.....	17	ChatGPT 4.0 on Bloch sphere.....	48
Software development.....	16	ChatGPT 4.0 on superconducting qubit materials.....	51
Hardware.....	19	Google Bard on qubit fidelities.....	57
Collaborative research.....	20	LLM 2.0 on funding research papers.....	64
Market considerations.....	20	ChatGPT 4.0 on funding research reviews.....	66
IV. OTHER AI TOOLS USED IN QUANTUM SCIENCE.....	21	ChatGPT 4.0 on machine learning techniques.....	74
Quantum physics and hardware.....	22	ChatGPT 4.0 on qubit entanglement.....	79
Quantum software and tools.....	22	VIII. INDEX.....	88
Other domains.....	22	IX. BIBLIOGRAPHY.....	89
V. QUANTUM COMPUTING AI APPLICATIONS.....	23		
Quantum Machine Learning.....	23		

2

I. INTRODUCTION

This paper looks at the intersection of machine learning and quantum science, with a focus on large language models (LLMs) chatbots. It recognizes that various wide quantum science can benefit from these new tools and urges them to learn how to make the best use of them. It describes the existing and potential future use cases for LLMs with the observation that they have a significant potential to alter research methodologies and pedagogical approaches in quantum science with academics, researchers and within the industry. It also explores the various other ways machine learning techniques and quantum technologies can help each other.

Part II describes how LLMs fit into the generative AI landscape, the key features of LLM-based chatbots, their use and their training data sources, their figures of merit, and how to make best use of them with prompt engineering. It assesses their reasoning capabilities and shows how it will grow with the addition of various symbolic AI tools, on the road to so called “artificial general intelligence”. This part also describes how to create domain specific LLM chatbots using LLM fine tuning and retrieval augmented generation (RAG) with document databases. It suggests the launch of a quantum science domain LLM based chatbot using open source language models.

Part III showcases how LLM chatbots can be used in the context of quantum science by researchers, students, students, and industry professionals. It covers the process of learning and studying quantum science and technologies, reviewing, and writing scientific and other papers, doing classical and quantum software development, conducting research, education, and collaborative research.

Part IV examines the use cases of other types of machine learning-based tools in quantum science with research and technology development in quantum physics and hardware, quantum software and tools and other domains like quantum sensing and quantum communication and cryptography.

Part V covers the potential use cases of quantum computing in machine learning applications including large language models. It also shows how quantum inspired algorithms can help reduce the computing and energetic footprint of classical machine learning solutions.

Part VII supplemental materials contain a wealth of prompts and results covering various fields of quantum science, including learning, summarizing the state of the art, listing figures-of-merit for technologies like single-photon sources and detectors, circuit simulators, traveling wave parametric amplifiers analyzing a paper, producing a position paper, and creating a quiz.

Part IX contains an extensive bibliography for readers willing to dig into the way LLMs and their tools operate.

The intended audience of this paper is students, researchers and professionals in the broad quantum science and technology ecosystem who have a limited knowledge and understanding of machine learning and particularly, large language models chatbots. A preliminary understanding of machine learning and neural network basics is however a plus factor.

II. LLM-BASED CHATBOTS PRIMER

Generative AI refers to a subset of artificial intelligence algorithms and techniques that create new content of various formats: texts, images, 3D models or even language, videos, music, software code, molecules, etc.), based on the patterns and information learned from large datasets, and with varying fidelity use cases for LLMs with the observation that they have a significant potential to alter research methodologies and pedagogical approaches in quantum science with academics, researchers and within the industry. It also explores the various other ways machine learning techniques and quantum technologies can help each other.

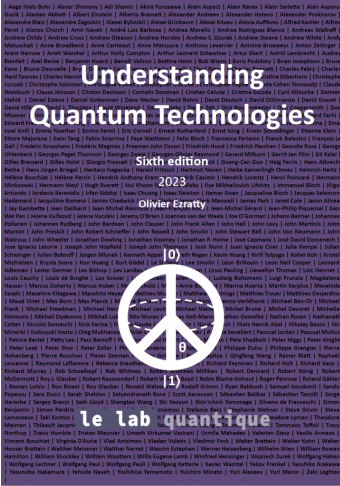
Generative AI tools make use of deep learning neural networks models that are trained on vast amounts of data, allowing them to implicitly understand patterns and structures within the training data. Once trained, these models generate new content extrapolated from training content. Here we will focus on generative AI tools on large language models based on transformers like OpenAI GPT (Generative Pre-trained Transformer), which generates human-like text in chatbots, GANs (Generative Adversarial Networks) and VAE (Variational Autoencoders), which create realistic images, videos, and music under various constraints (using a given style, changing its format, filling voids, adding labels to a picture background, etc.) with applications in verticals like healthcare and artistic creation. These models can produce content not explicitly programmed in the model but by understanding the data they were trained on.

Generative AI applications include the transmutation of existing content (improving image resolution, converting films from monochrome to color, making people younger or older, creating new music) or the generation of content using content of different types (creating a text description of an image, creating an image based on its description, creating videos and sound of a person based on a text script, turning a sketch into a picture or even a 3D model, etc.) We will differentiate here the generative AI algorithms and models from the products which are using it.

LLM features

As of January 2024, the most popular generalist large language models-based chatbots were ChatGPT 4.0 (20 months subscription), Google Bard (GPT) and Claude from Meta (free). Other such tools include Claude 2 from Anthropic (not its regular access is limited to US and UK users). These tools use language models based on the transformer neural network model which was invented in 2017 by a Google AI team. To clarify the LLM terminology, ChatGPT 4.0 is a chatbot product that is using a language model GPT-4 and other software tools and generative AI models like DALL-E which produces images based on their text description. Google Bard is based on the PaLM-E language model, and uses in Gemini successor.

- **L’ebook Understanding Quantum Technologies**, sixième édition, publiée en septembre 2024, 1366 pages. Toujours en anglais et sans version française. Une version simplifiée de 24 pages est aussi disponible.



- L'essai **Where are we heading with NISQ?** (50 pages, publié en mai 2023) qui fait le point des ordinateurs quantiques à qubits bruités, leurs applications et leur devenir.

Where are we heading with NISQ?

Olivier Ezratty
 *Author of the [Understanding quantum technologies](#) book and cofounder of the [Quantum Energy Initiative](#), Paris, France. [olivier@ezratty.net](#)

In 2017, John Preskill defined NISQ (Noisy Intermediate-Scale Quantum) computers in an introduction to the field of near-term quantum computing (FTQC). The NISQ regime comprises a wide range of quantum computing architectures, including those that are currently being developed, such as superconducting qubits, trapped ions, neutral atoms, and photonic qubits. In this paper, we review the current state of NISQ, focusing on the challenges and opportunities of this emerging technology. We discuss the progress made in the development of NISQ algorithms and hardware, and the potential applications of NISQ in various fields, including optimization, simulation, and machine learning. We also discuss the challenges of NISQ, such as the need for error correction and the limited coherence times of qubits. Finally, we discuss the future of NISQ and the potential for quantum computing to revolutionize various industries.

CONTENTS

- I. INTRODUCTION 1
- II. NISQ CURRENT TRENDS AND RESEARCH 5
- III. NISQ ALGORITHMS RESOURCES 11
- IV. NISQ POTENTIAL ENABLERS 21
- V. QUBIT FIDELITY AND CAPABILITIES 21
- VI. QUANTUM ERROR CORRECTION 25
- VII. NISQ SOFTWARE ECOSYSTEMS 26
- VIII. NISQ AND FTQC ROADMAPS 35
- IX. NISQ SOFTWARE ECOSYSTEMS 37
- X. QUBIT FIDELITY AND CAPABILITIES 40
- XI. NISQ POTENTIAL ENABLERS 49

- L'essai **Is there a Moore's law for quantum computing?** (32 pages, publié en mars 2023) qui pose la question de l'éventuelle existence d'une loi de Moore pour l'augmentation de la puissance des ordinateurs quantiques. La réponse est normative : cela dépend des indicateurs !

Is there a "Moore's law" for quantum computing?

Olivier Ezratty
 *Author of the [Understanding quantum technologies](#) book and cofounder of the [Quantum Energy Initiative](#), Paris, France. [olivier@ezratty.net](#)

There is a common wisdom according to which technology progresses according to some exponential rate, the so-called Moore's law. This law states that the number of transistors on a chip doubles every two years. This law is not a physical law, but a technological one. It is a result of the continuous investment in research and development in the semiconductor industry. In the quantum computing era, the question arises: is there a Moore's law for quantum computing? This paper explores the challenges and opportunities of quantum computing, and discusses the potential for quantum computing to revolutionize various industries. It also discusses the challenges of quantum computing, such as the need for error correction and the limited coherence times of qubits. Finally, it discusses the future of quantum computing and the potential for quantum computing to revolutionize various industries.

INTRODUCTION

Quantum computing has attracted significant attention in the past few years. Many signs are showing it is reaching some limits, but there are other dimensions like transistor density, computing power per area, computing costs, number of cores and clock speed.

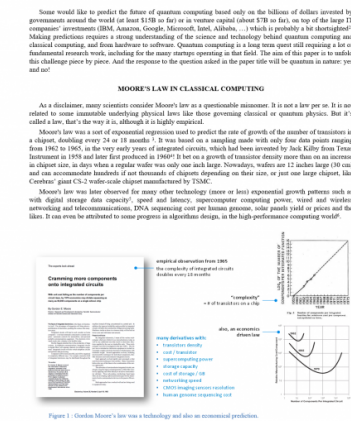
For about a decade now, quantum computing scientists and technologists have tried to identify various exponential growth rates similar to Moore's law, particularly on qubit numbers, qubit fidelities and other figures of merit. One can indeed wonder whether history will repeat itself in the quantum computing world. Understanding how these rates could work and making forecasts is not just about gut feelings and a naive optimistic view on technology progress determinism. It requires a mix of understanding of the scientific, technological challenges faced by quantum physicists and quantum information scientists, the economics of this emerging business. Predicting when Moore's law for quantum computing progress is highly non-trivial challenge.

Why may it be advised to find some empirical laws on the development of quantum computing? There are at least a couple reasons and scientific reasons.

One is to assess when quantum computing will become a real business outside the proof of concept zone it is in today. It is useful for investors, governments, and companies to have a better clue on their own quantum computing agenda, despite the related uncertainties.

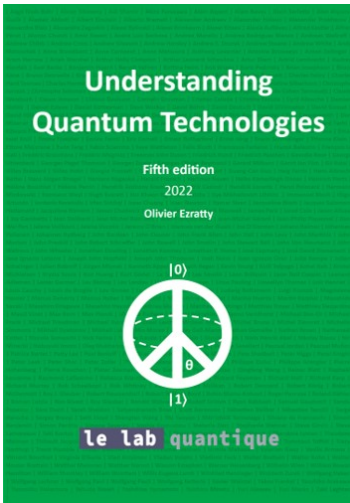
For example, it may influence the decision making process on launching quantum computing related educational programs and on the way to balance scientific fundamental research and technology development investments.

Another reason is linked to cybersecurity. It is common practice to estimate the quantum computing threat on current cybersecurity based on RGA public law estimations. Surveys are regularly being called for by security experts in quantum physics and quantum information science. The expectation for seeing a quantum computing breaking RSA 2048 plays is evaluated "in 15 years" with a Gaussian curve of response around this timeline showing a broad discrepancy of opinion among experts.



- L'ebook **Understanding Quantum Technologies**, cinquième édition, publiée en septembre 2022, 1128

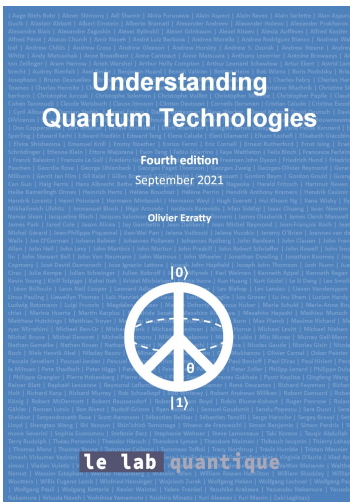
pages. C'est la mise à jour de la quatrième édition, toujours en anglais et sans version française. Une version simplifiée de 24 pages est aussi disponible.



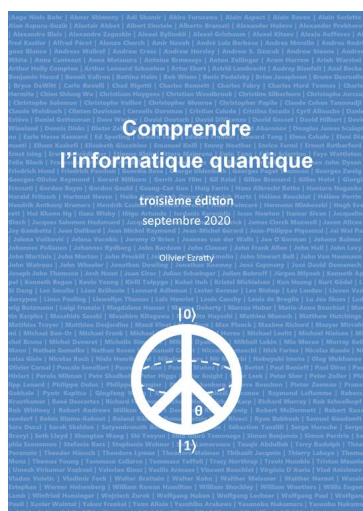
- L'essai **Mitigating the quantum hype** (24 pages, février 2022) qui fait le point sur la “hype” du calcul quantique et sur les moyens d'en limiter les effets négatifs.



- L'ebook **Understanding Quantum Technologies**, quatrième édition, publiée en septembre 2021, 836 pages. C'est la mise à jour de la troisième édition, passée en anglais et sans version française.



- L'ebook **Comprendre l'informatique quantique**, troisième édition, publiée en septembre 2020, 682 pages, les deux premières datant de septembre 2018 et septembre 2019. C'est un condensé unique et complet qui fait un tour d'horizon très large des enjeux scientifiques, technologiques, industriels, géopolitiques et sociétaux de l'informatique quantique.



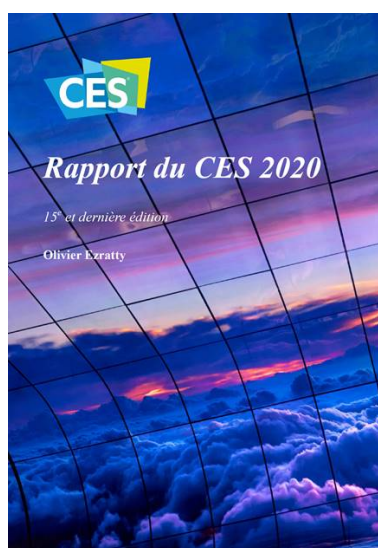
- L'ebook **Les usages de l'intelligence artificielle 2021**, en février 2021, 742 pages, une grosse mise à jour des éditions de 2017, 2018 et 2019.



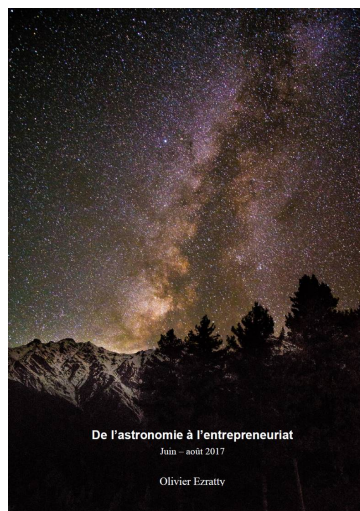
- Le **Guide des Startups 2019**, 23e édition, en avril 2019, 548 pages. C'est la dernière édition en date de 2022.



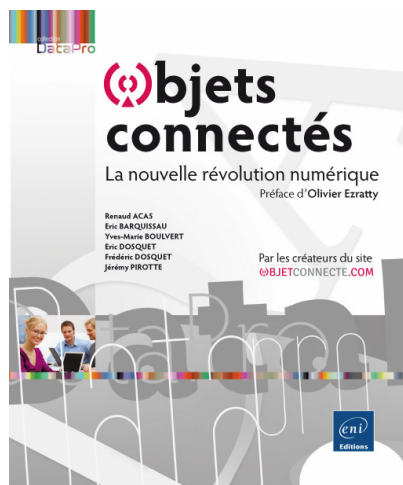
- **Le Rapport du CES 2020**, publié en janvier 2020, de 366 pages, le dernier d'une série lancée en 2006.



- Une compilation de 12 articles sur **l'astronomie et l'entrepreneuriat** publiée en août 2017 sous forme d'un ebook. Elle est focalisée sur la découverte des instruments d'observation de l'Univers, les télescopes spatiaux et terrestres ainsi que les radiotélescopes, puis sur les entrepreneurs qui s'intéressent à la conquête spatiale.



- J'ai rédigé la préface de **“Objets Connecté – La nouvelle révolution numérique”**, un livre paru en février 2016 aux éditions ENI et écrit par Renaud Acas, Eric Barquisseau, Yves-Marie Boulvert, Frédéric Dosquet, Eric Dosquet et Jérémy Pirotte.



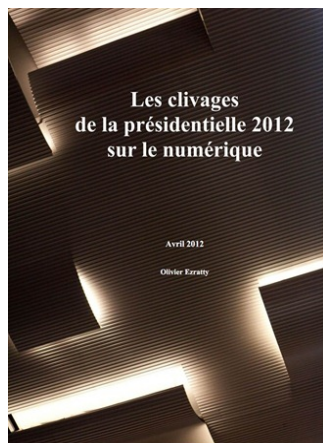
- **Le Rapport du CES 2017**, publié en janvier 2017. 396 pages, dans la lignée des rapports précédents.



- **“Tout tout tout sur la high-tech”**, publié aux éditions Kawa. Il s’agit de la version “livre” du Rapport du CES 2013.



- Une contribution sur le thème des blogs et celui des réseaux sociaux dans le **Dictionnaire Politique de l'Internet et du Numérique**, un ouvrage collectif paru en 2009 et diffusé par La Tribune.
- Le **Rapport du CES 2013**, publié en janvier 2013. 272 pages.
- Le **Rapport du CES 2012**, publié en janvier 2012. 244 pages.
- Le **Rapport du CES 2011**, publié en janvier 2011. 246 pages.
- Le **Rapport du CES 2010**, publié en janvier 2010. 204 pages.
- Le **Rapport du CES 2009**, publié en janvier 2009. 192 pages.
- Le **Rapport du CES 2008**, publié en janvier 2008. Ce document de 178 pages dresse un panorama très complet des technologies présentées au CES et lancées pendant l'année 2007.
- Le **Rapport du CES 2007**, publié en janvier 2007. Ce document de 164 pages avec 435 illustrations fait le tour des nouveautés présentées au CES et de l'année 2006.
- Le **Rapport du CES 2006**, publié en février/mars 2006 qui décrit les grandes tendances de ce salon. J'y décris également la présence française sur ce salon et les leçons que l'on peut en tirer.
- Le livre blanc sur **Les opportunités de la télévision numérique** qui fait un point sur ce secteur d'activité et particulier sur le développement de l'IPTV. Il met en évidence les bouleversements en cours de la chaîne de valeur de ce secteur et propose quelques pistes d'actions pour l'industrie française.
- **Les clivages de la présidentielle 2012 sur le numérique**, un recueil d'une série de six articles au format PDF sur la manière dont les candidats à la présidentielle 2012 ont traité le thème du numérique. Le document traite également des propositions des professionnels du secteur et fournit quelques pistes de solutions à différents problèmes notamment au sujet de l'entrepreneuriat et de l'enseignement supérieur.



- Un **panorama des logiciels photo** qui reprend et complète une série de sept articles publiés en septembre 2008 sur les logiciels et services en ligne dédiés au traitement de la photo numérique.



- Un ensemble de propositions pour les Assises du Numérique “**Développer l’entrepreneuriat et faire réussir les startups dans les TICs**” publié en juillet 2008. C’est un document conçu de manière collective avec un grand nombre de contributeurs, cités dans la couverture.
- Un essai comparant **Google et Microsoft**, dans leurs stratégies de croissance, les effets de leur taille, leur relation au marché et à leur écosystème.
- Un **Trop d’Etat – Oui mais où ça?**, un essai publié en mars 2007 analysant les dépenses du secteur public dans son ensemble et tentant d’identifier où des économies ou redéploiements pourraient être réalisés.
- La coordination d’un numéro spécial “Opportunités de l’industries informatique en France” de la revue Centraliens (des anciens élèves de l’Ecole Centrale Paris) paru en juin 2006 et dont l’un des articles est disponible sur ce blog: **l’interview de Bernard Liautaud** de Business Objects.
- Une série d’articles sur le thème “Décrypter Microsoft” publiés dans la revue **DecisionMakers IT**, le premier étant dédié aux **programmes partenaires** de l’éditeur.
- Un **comparatif de lecteurs RSS** sous forme de tableau commenté associé à **ce post**.
- Un **Compte-rendu d’installation de Windows Vista**, datant de novembre 2006.
- Une étude de cas sur “**Le défi de l’innovation dans Windows**“, publiée à l’occasion d’une présentation

réalisée aux Entretiens de la Technologie de Louis le Grand organisés par l'Institut de l'Entreprise en août 2005. Je l'ai faite pour le compte de Microsoft France.