Cambridge Quantum

QNLP Compositional Intelligence

(qnlp)^{cQ}

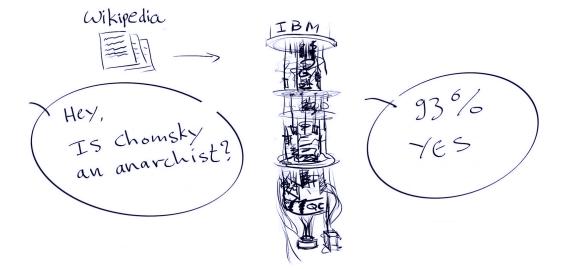
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Why quantum computing for Natural Language Processing?

Our team focuses on Quantum Natural Language Processing (QNLP). More broadly, we are interested in the potential quantum computing has to enhance Artificial Intelligence (AI). We take advantage of structural correspondences between the matching compositional structures underpinning quantum theory (e.g. process theories and tensor networks) on the one hand, and formal and natural languages on the other hand, in order to design novel models for language and other cognitive phenomena. These mathematical connections between quantum theory and language models allow us to implement our models on quantum computers and exploit the advantage that may bring.

Framework transparency

The relevant mathematical framework is category theory, which comes equipped with an intuitive graphical language in terms of process diagrams. Last but not least, as current "black box" machine learning architectures are confronted by the need for interpretability, explainability, and responsibility, we envisage that our brand of AI models provide a scalable solution towards transparency.



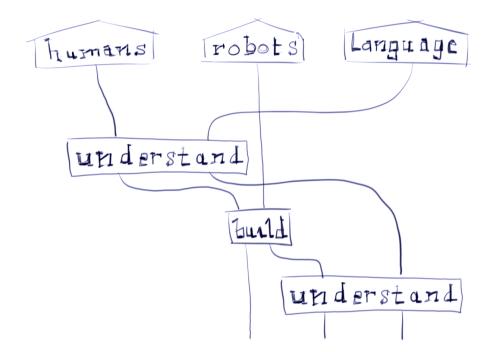
- 1 Coecke et al Lambek Festschirft, special issue of Linguistic Analysis 2010.
- 2 Coecke-Kissinger book <u>https://doi.org/10.1017/9781316219317</u> 2017.
- 3 Zeng-Coecke EPTCS 221, pp. 67-75 2016.

Quantum Natural Language Processing

The foundations we built upon have largely been developed by ourselves, over the past two decades, when we were still residing in academia. Our journey towards QNLP began with the question of how to combine the strengths of symbolic approaches to AI, which naturally capture compositionality via recursive rules, with the distributed approach to modelling meaning, which captures the flexible and ambiguous nature of natural language semantics and allows the meanings to be learned automatically from large amounts of text.

In our original DisCoCat paper,¹ grammatical rules dictate how the meanings of words flow and interact inside a sentence to produce its meaning. Interestingly, this flow of information is similar - at an abstract level - to how information flows in quantum protocols, which can be formulated entirely in terms of diagrams.²

As implementations of this compositional framework on classical computers can become exponentially costly, we turn to its quantum origins and consider quantum computers as the native environment for language to inhabit.³





4 Kartsaklis arXiv:1505.00138 2015.

5 GitHub <u>https://github.com/CQCL/lambeq</u> 2021.

6 Cambridge Quantum <u>https://qnlp.cambridgequantum.com/</u> <u>generate.html</u> 2021. This allows us to exploit the exponentially large state spaces defined by qubits and invoke entanglement and interference to capture the complexity of meaning interactions in text. Thus, our compositional approach to NLP naturally leads to Quantum NLP. Furthermore, this formal analogy between linguistics and quantum physics goes both ways; for example, concepts from quantum theory such as density matrices can be used to model entailment and ambiguity in language.⁴

Our developers are building a software library, λ ambeq⁵, which enables the design and implementation of end-to-end QNLP pipelines which seamlessly integrate with Cambridge Quantum's platform-agnostic state-ofthe-art compiler, TKET. Like TKET, λ ambeq is also opensourced, with aim to accelerate the development of novel quantum applications for NLP. With our QNLP toolkit, grammatical sentences can be automatically parsed and mapped to process diagrams, as is also demonstrated in our online tool⁶.

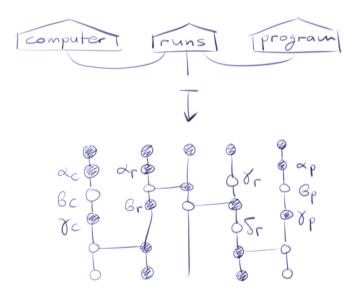
With our library for building and interpreting diagrams, DisCoPy, running under the hood of lambeq, we can map sentence diagrams to quantum circuits, which faithfully reflect grammatical structure. Thus, we have already been able to implement the first proof-of-concept experiments^{5,6} solving NLP tasks such as sentence classification on noisy near-term quantum processors, using techniques from the rapidly developing field of Quantum Machine Learning to automatically learn parameterised "language circuits".

7 Coecke-Duncan New J. Phys. 13 (2011) 043016 2009.

Looking forward

The emphasis on compositionality has been the main source of our results so far, which range from the foundations of quantum theory to applications in quantum computation. A significant contribution has been the development of the ZX-calculus⁷, a low-level diagrammatic language for reasoning about quantum computations. As we employ the ZX-calculus when reasoning about QNLP architectures for both near-term quantum processors as well as scalable fault-tolerant quantum computers, and continue to advance the theory of graphical languages.

We also intend to move beyond QNLP into Compositional Intelligence more broadly, where we will explore cognitive phenomena beyond language, such as causal and spatial reasoning. Finally, we have also recently ventured into the arts, by viewing musical structure from a linguistic point of view, which allows us to use our QNLP pipelines to analyse musical compositions.



GET STARTED WITH QNLP TODAY

CONTACT US

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Cambridge Quantum

We set out our vision to positively transform the world using the power of quantum computing back in 2014. Today, we are recognised as one of the foremost quantum computing companies, delivering science-led, enterprise-driven solutions to tackle hard problems across a diverse range of industries.

> Cambridge Quantum designs, engineers and deploys algorithms and enterprise application libraries, translating cutting-edge research into industry leading technologies through a product-centric focus. TKET, our hardware-agnostic software development platform, and other technologies are currently utilised by an expansive and ever-growing user base.

The team at Cambridge Quantum has been developing the theoretical foundations of quantum computing for over 25 years, forging ahead with breakthroughs in the fields of quantum chemistry, quantum artificial intelligence, quantum cybersecurity and quantum algorithms.

At present, we have the deepest roster of researchers, developers and engineers, working to democratise quantum computation and realise the benefits for the greatest possible number of people.

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