

# Quantum Computing in Medical Imaging: A Glimpse into the Future

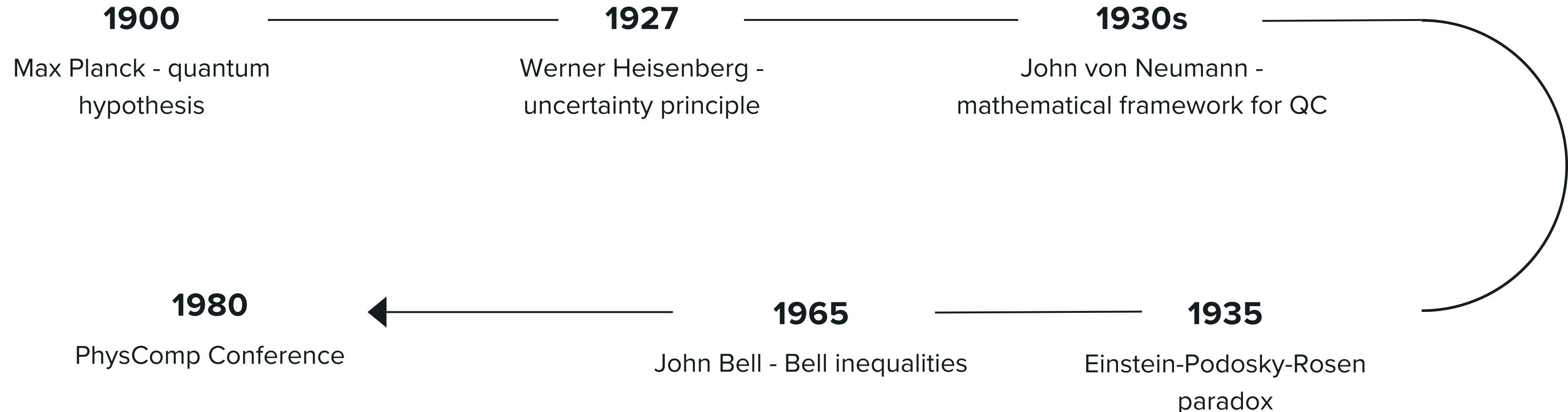


Präsentation von Clara Morrissey

# ROADMAP

1. The History of QC
2. Basic concepts of QC
3. Challenges of medical Imaging
4. Hybrid Quantum-CNN
5. Conclusion

# THE HISTORY OF QUANTUM COMPUTING



# THE CONFERENCE



<https://research.ibm.com/blog qc40-physics-computation>

# FOUNDATIONS OF QUANTUM COMPUTING

- SUPERPOSITION
- INTERFERENCE
- ENTANGLEMENT

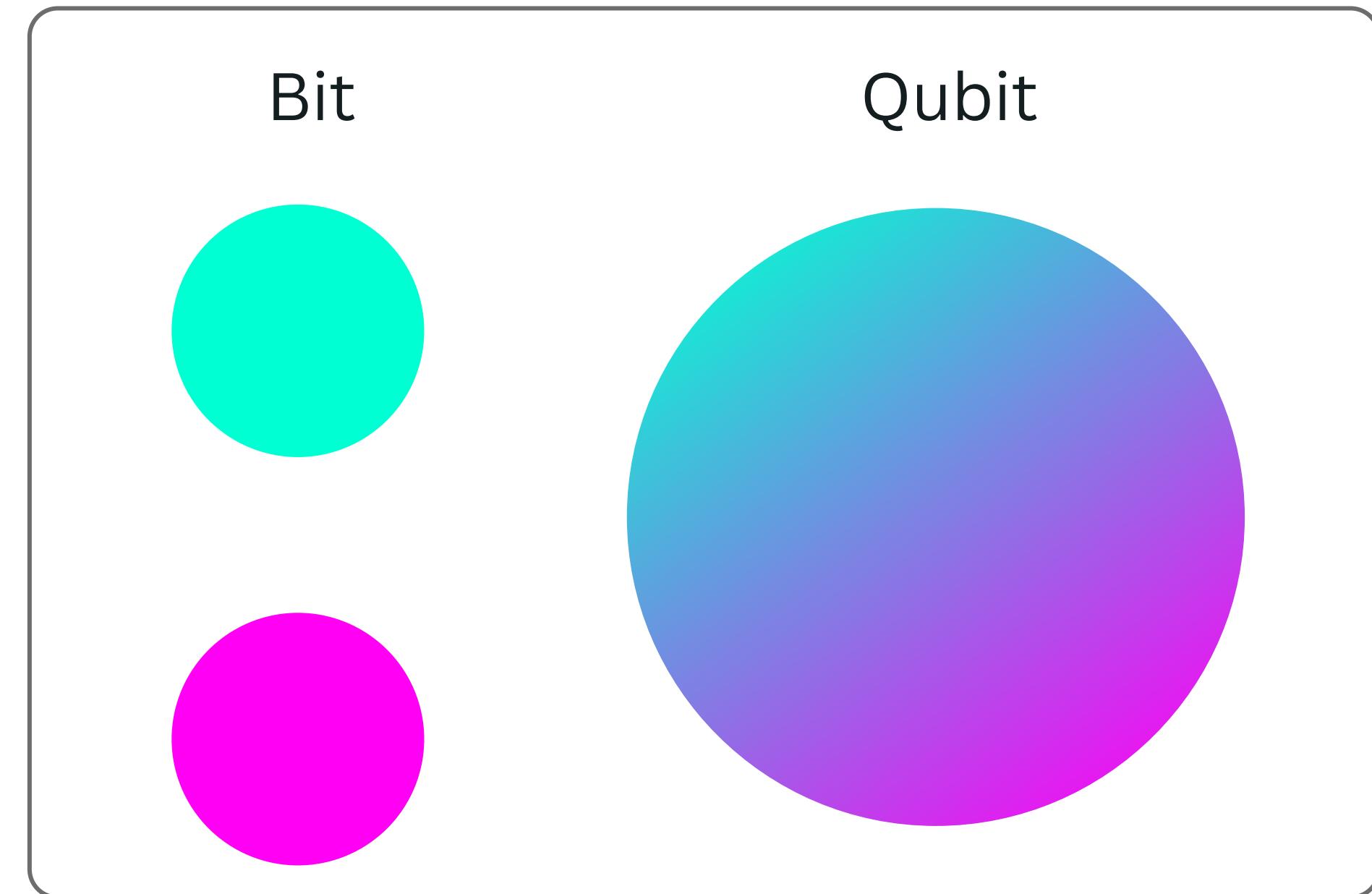
# FOUNDATIONS OF QUANTUM COMPUTING

## SUPERPOSITION

- multiple states at the same time
- refers to spinning electron's position
- probability distribution
- collapses on measurement (shot)

$$|\psi\rangle = \alpha|0\rangle + \beta|1\rangle$$

$$\text{with } |\alpha|^2 + |\beta|^2 = 1$$

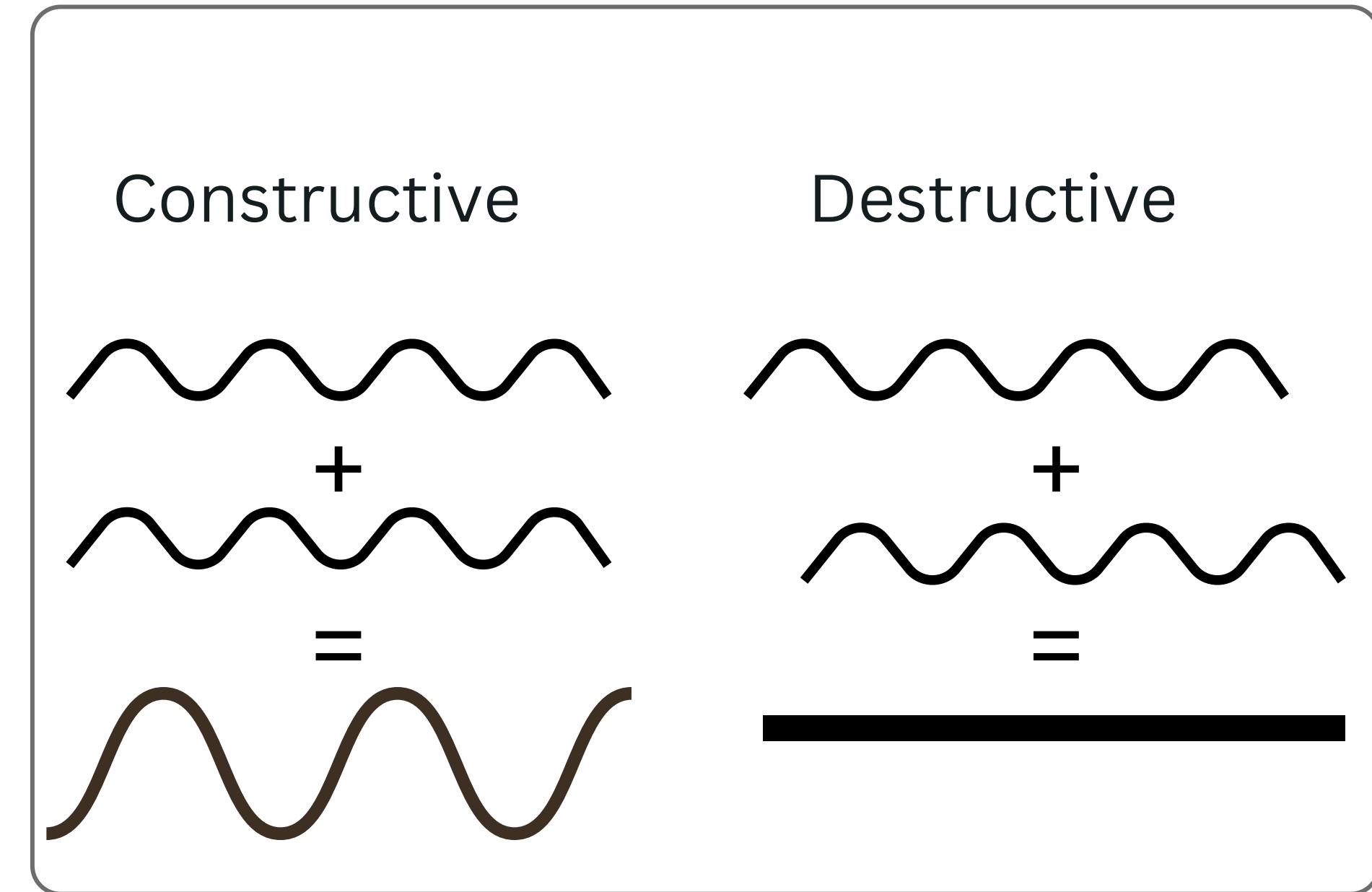


Grafik in Anlehnung an: Giani, Annarita & Eldredge, Zachary. (2021). Quantum Computing Opportunities in Renewable Energy.  
SN Computer Science. 2. 10.1007/s42979-021-00786-3.

# FOUNDATIONS OF QUANTUM COMPUTING

## INTERFERENCE

- particles have wavelike properties
- in-phase waves: constructive
- out-of-phase waves: destructive

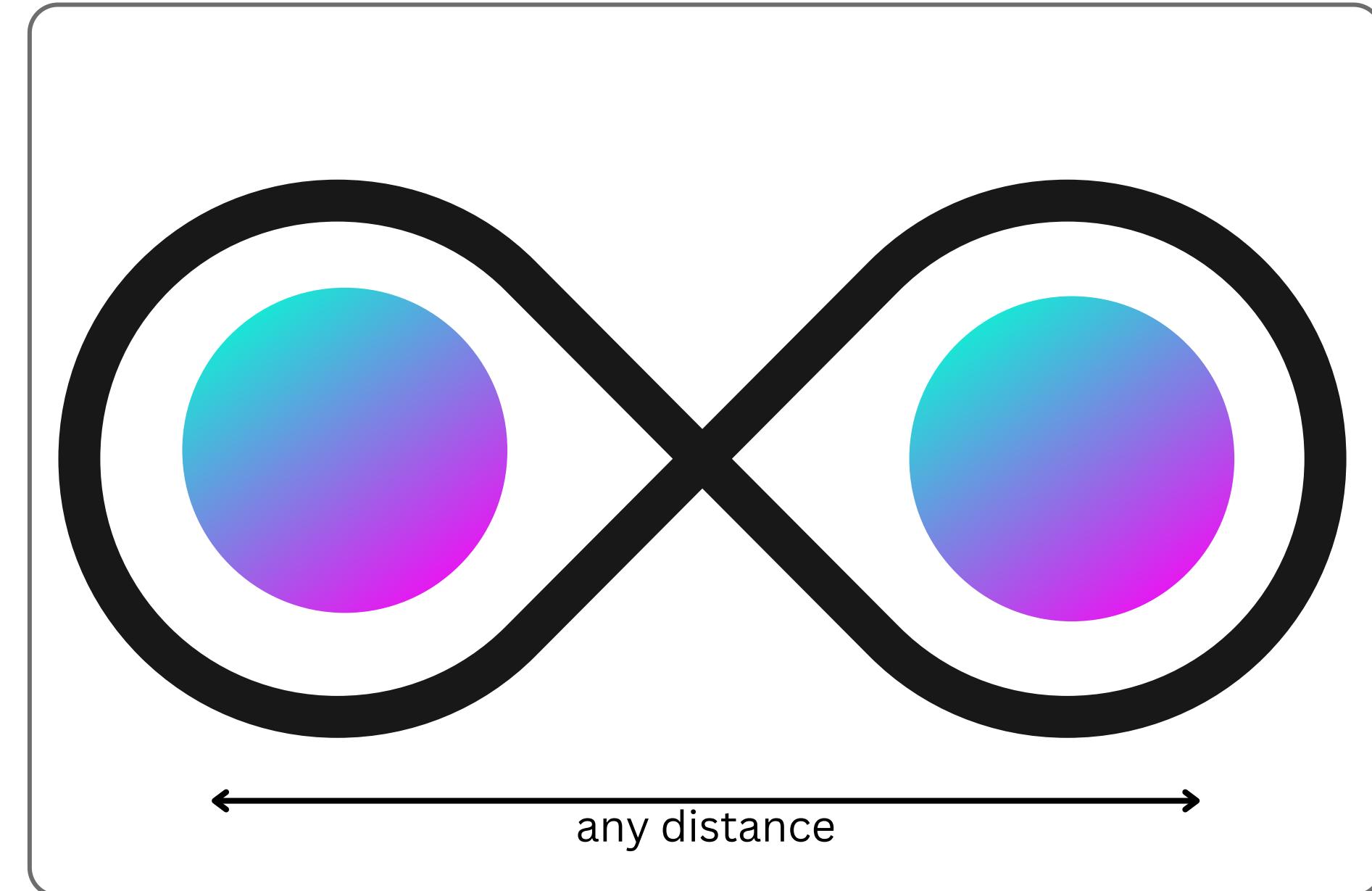


Grafik in Anlehnung an: Giani, Annarita & Eldredge, Zachary. (2021). Quantum Computing Opportunities in Renewable Energy. SN Computer Science. 2. 10.1007/s42979-021-00786-3.

# FOUNDATIONS OF QUANTUM COMPUTING

## ENTANGLEMENT

- independent from distance
- if one qubit is measured, both collapse into the same state



Grafik in Anlehnung an: Institute of Science and Technology Austria. <https://ist.ac.at/en/news/wiring-up-quantum-circuits-with-light/>

# FOUNDATIONS OF QUANTUM COMPUTING

## QUANTUM GATES

- changes state of qubit

$$R(\theta) = \begin{bmatrix} \cos\left(\frac{\theta}{2}\right) & -\sin\left(\frac{\theta}{2}\right) \\ \sin\left(\frac{\theta}{2}\right) & \cos\left(\frac{\theta}{2}\right) \end{bmatrix}$$

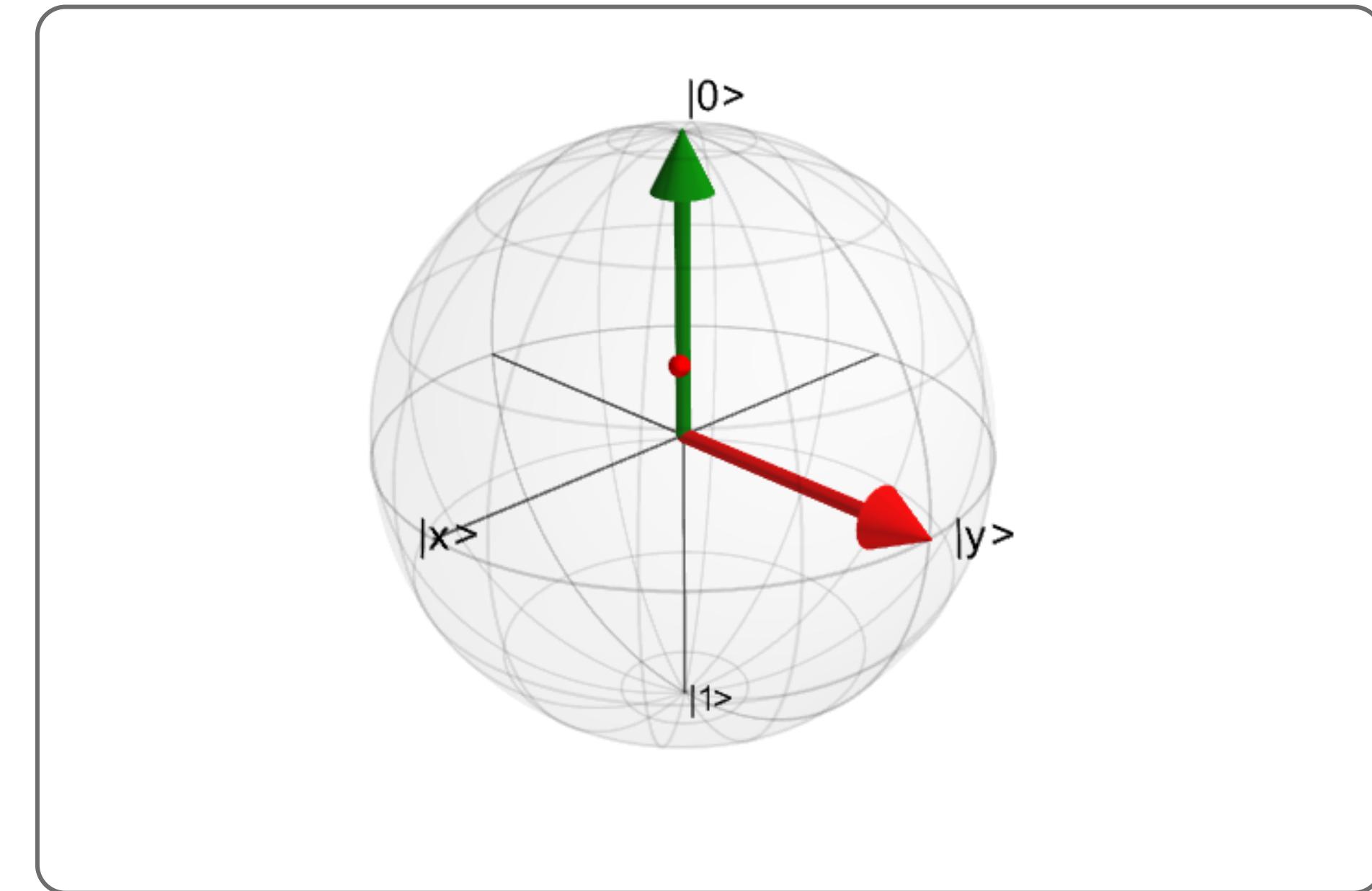


Image: Courtesy of :<https://qutip.org/docs/4.1/guide/guide-bloch.html>

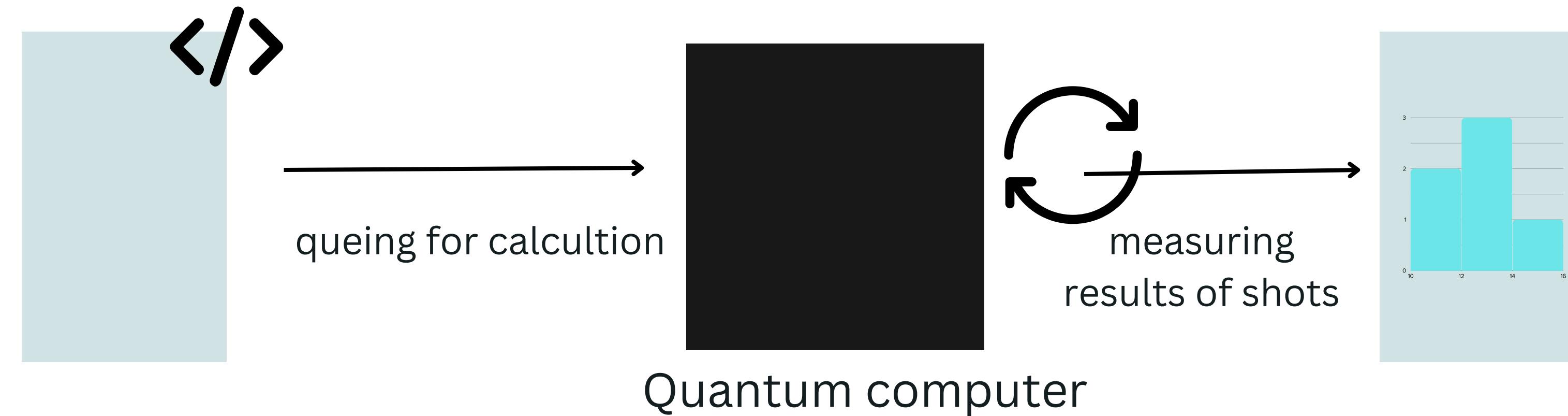
# QUANTUM COMPUTER



Image: Courtesy of IBM. Downloaded here: <https://newsroom.ibm.com/media-quantum-innovation?l=100&keywords=quantum>

	<b>CLASSICAL COMPUTING</b>	<b>QUANTUM COMPUTING</b>
<b>COMPUTING UNITS</b>	Transistors, which can take in 0's and 1's	Qubits which can represent 0's and 1's simultaneously
<b>COMPUTING CAPACITY</b>	capability increased linearly	capability increased exponentially
<b>ERROR RATES &amp; ENVIRONMENT</b>	low error rates, operate at room temperature	high error rates, need to be kept ultracold
<b>SUITABILITY</b>	suitable for routine processing	suitable for complex processing

# COMMUNICATION TO QUANTUM COMPUTERS



# MEDICAL IMAGING

- includes many different types of imaging
- helps in diagnosis, prevention and treatment
- visualization of internal structures



# MEDICAL IMAGING - CHALLENGES

Storing and processing of images

recognizing patterns in the images

# SOLUTIONS IN QC FOR STORAGE PROBLEM

Storing a 16 bit image with  $1024 \times 1024$  pixel

classical computer system:  $1024 \times 1024 \times 16 = 16,777,216$  bits or  $2.09\text{ MB}$

quantum computing:

FRQI:  $1024 \times 1024 (= 2^{10} \times 2^{10}) = 2^{20} + 1 \rightarrow 21$  qubits

NEQR:  $1024 \times 1024 (= 2^{10} \times 2^{10}) = 2^{20} + 4 \rightarrow 24$  qubits

# **SOLUTIONS IN QC FOR ANALYZING IMAGES**

## **HYBRID QUANTUM-CONVOLUTIONAL NEURAL NETWORK**

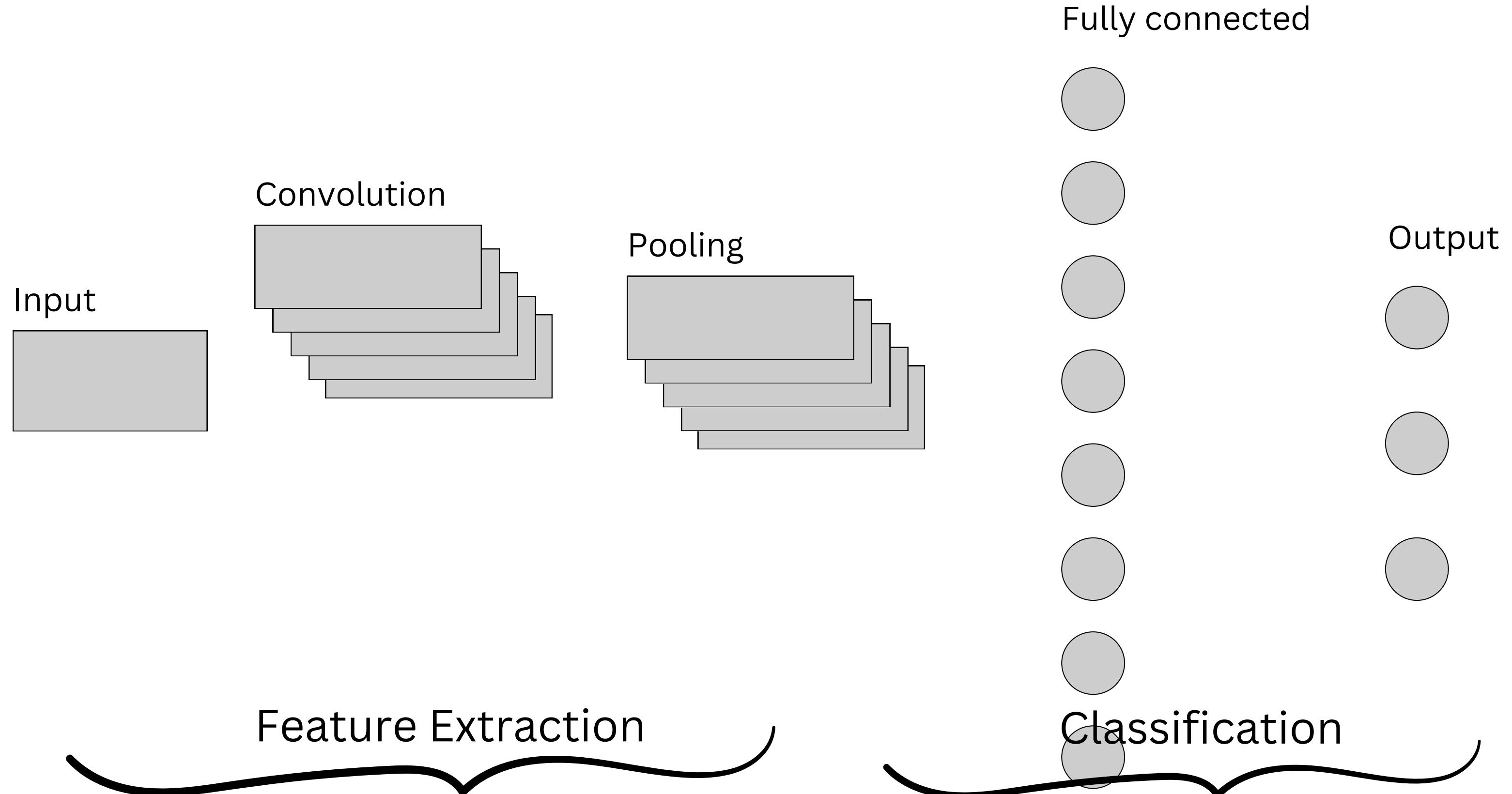
### **HQCNN**

## Why a HQCNN?

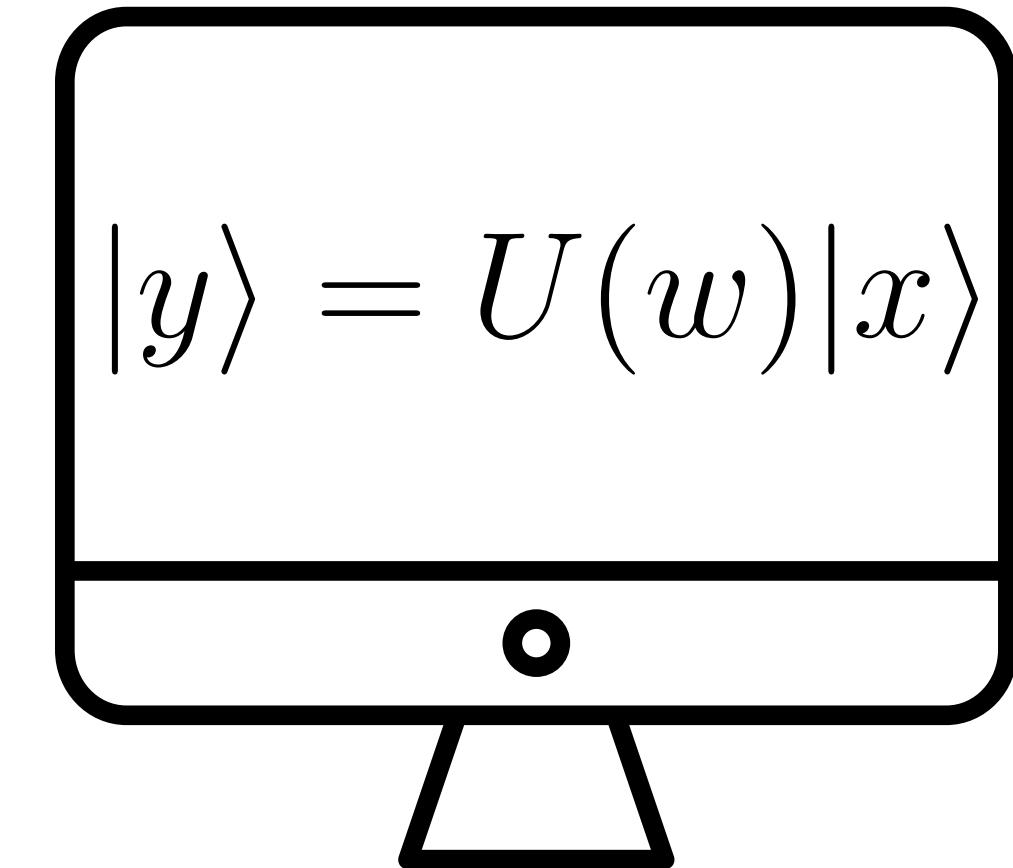
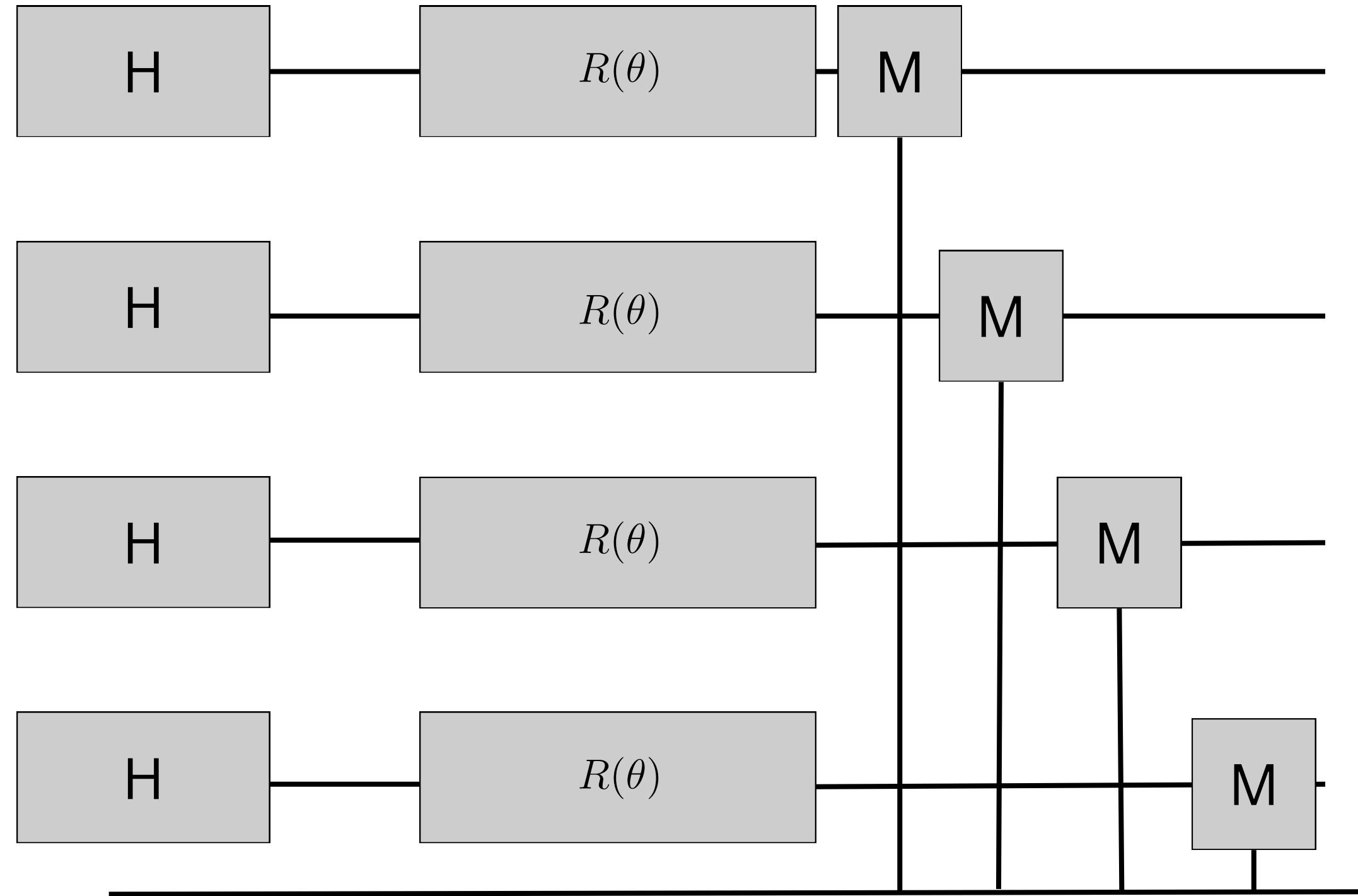
- testing CNN takes a long time
- slow inference time

## What is a HQCNN?

- combines PQC with classical NN



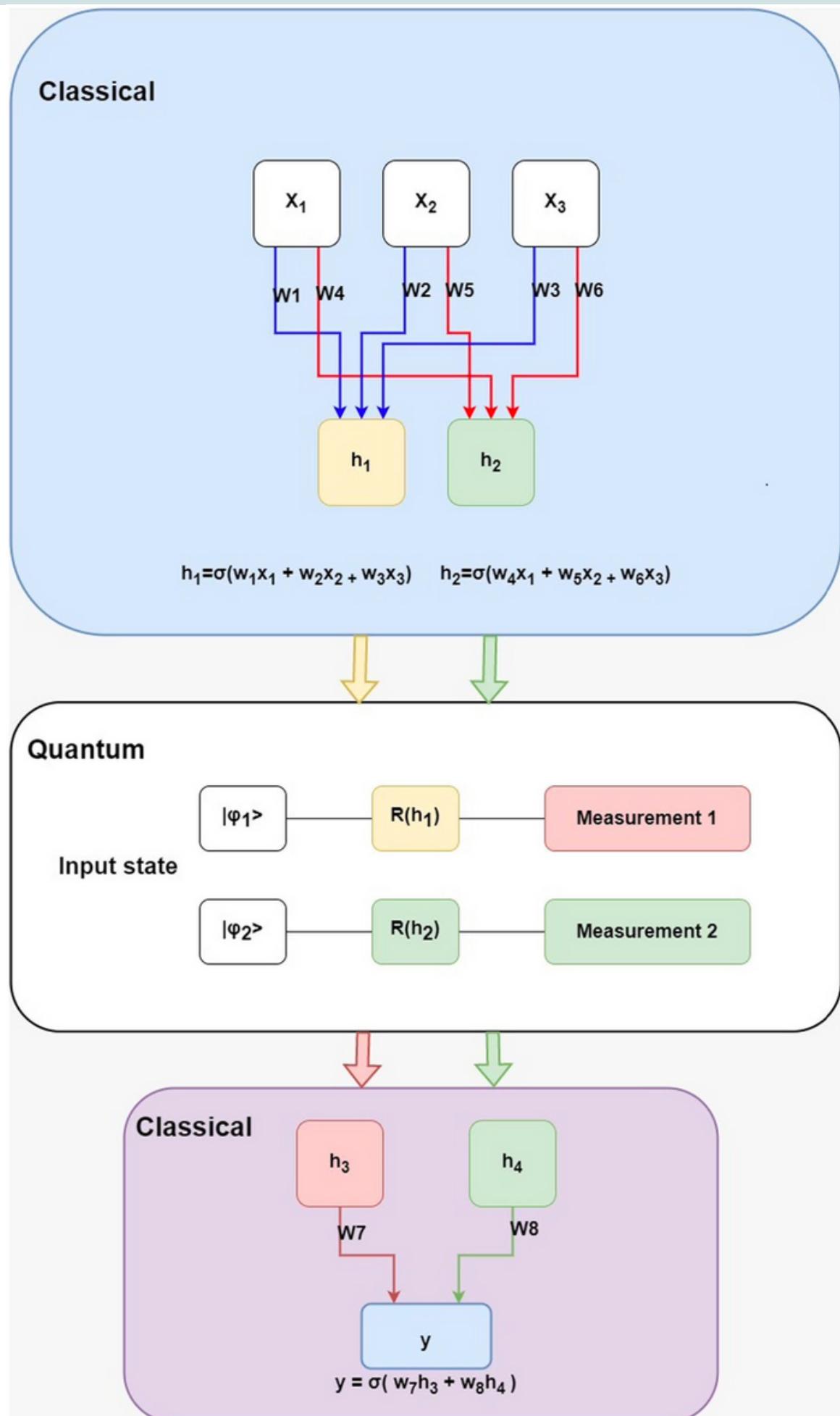
Graphics inspired by: Ajlouni *et al.* BMC Medical Imaging (2023) 23:126 <https://doi.org/10.1186/s12880-023-01084-5>



Graphics inspired by: Ajlouni *et al.* BMC Medical Imaging (2023) 23:126 <https://doi.org/10.1186/s12880-023-01084-5>

## Why a HQCNN?

- Speed
- high-dimensional feature representation
- accuracy
- Robustness to noise



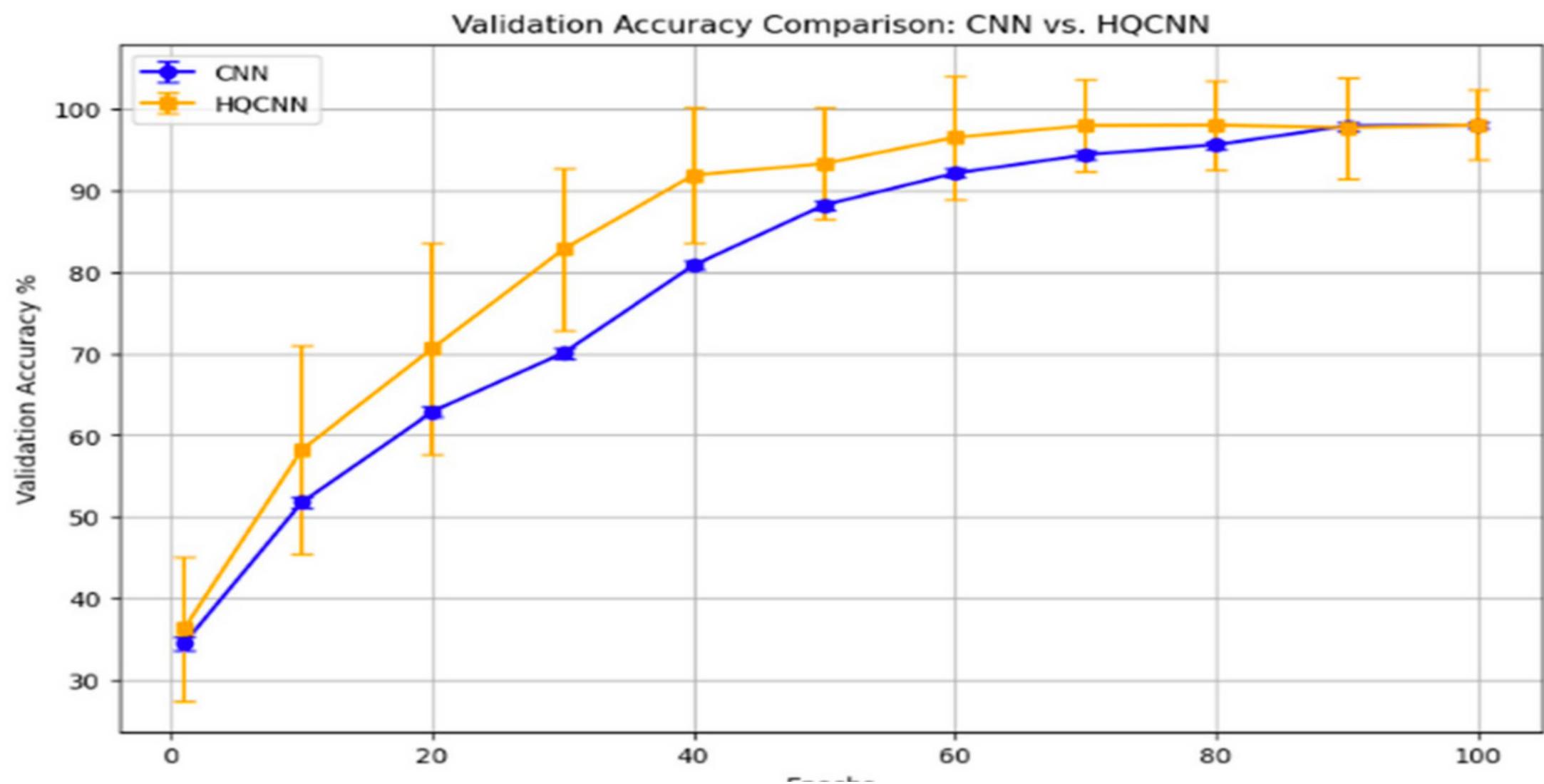
Graphics by: Ajlouni et al. *BMC Medical Imaging* (2023) 23:126  
<https://doi.org/10.1186/s12880-023-01084-5>

## Test-results

- superior performances
- accuracy of 98.07% within 70 epochs

**Table 10** Classification results of HQCNN and CNN models/

Dataset	Precision		Recall		F1 score	
	HQCNN	CNN	HQCNN	CNN	HQCNN	CNN
Kaggle Brain	97.74%	96.72%	97.33%	96.53	97.53%	96.62
REMBRANDT	96.86%	96.54	99.13%	98.91	97.98%	97.71



Graphics by: Ajlouni et al. *BMC Medical Imaging* (2023) 23:126

<https://doi.org/10.1186/s12880-023-01084-5>

# CONCLUSION

- QC holds a huge potential for medical imaging
- many researches and studies ongoing
- still very much at the beginning
- combination of classical and quantum computing

# QUESTIONS?

# SOURCES

- Schielein, R., Basting, M., Dremel, K., Firsching, M., Fuchs, T., Graetz, J., Kasperl, S., Prjamkov, D., Semmler, S., Suth, D., & Weule, M. (2022). Quantum Computing and Computed Tomography: A Roadmap towards QuantumCT. 11th Conference on Industrial Computed Tomography (iCT) 2022, 8-11 Feb, Wels, Austria. e-Journal of Nondestructive Testing Vol. 27(3). <https://doi.org/10.58286/26565>
- Zhang, Yi & Lu, Kai & Gao, Yinghui & Wang, Mo. (2013). NEQR: A novel enhanced quantum representation of digital images. *Quantum Information Processing*. 12. 10.1007/s11128-013-0567-z
- Ur Rasool, R.; Ahmad, H.F.; Rafique, W.; Qayyum, A.; Qadir, J.; Anwar, Z. Quantum Computing for Healthcare: A Review. *Future Internet* 2023, 15, 94. <https://doi.org/10.3390/fi15030094>
- <https://quantumpedia.uk/a-brief-history-of-quantum-computing-e0bbd05893d0>
- Ajlouni, N., Özyavaş, A., Takaoglu, M. et al. Medical image diagnosis based on adaptive Hybrid Quantum CNN. *BMC Med Imaging* 23, 126 (2023). <https://doi.org/10.1186/s12880-023-01084-5>
- Le, P.Q., Dong, F. & Hirota, K. A flexible representation of quantum images for polynomial preparation, image compression, and processing operations. *Quantum Inf Process* 10, 63–84 (2011). <https://doi.org/10.1007/s11128-010-0177-y>