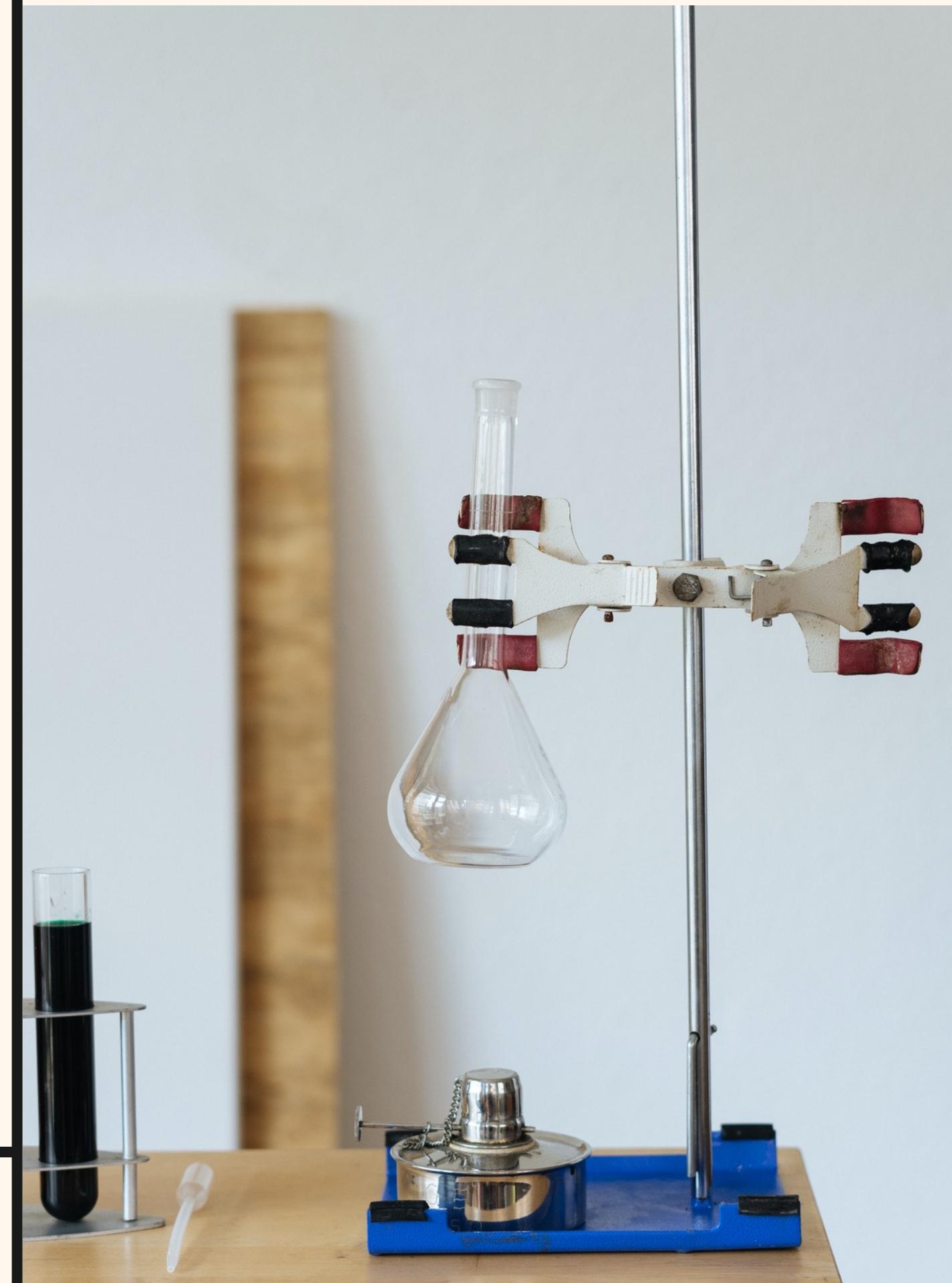
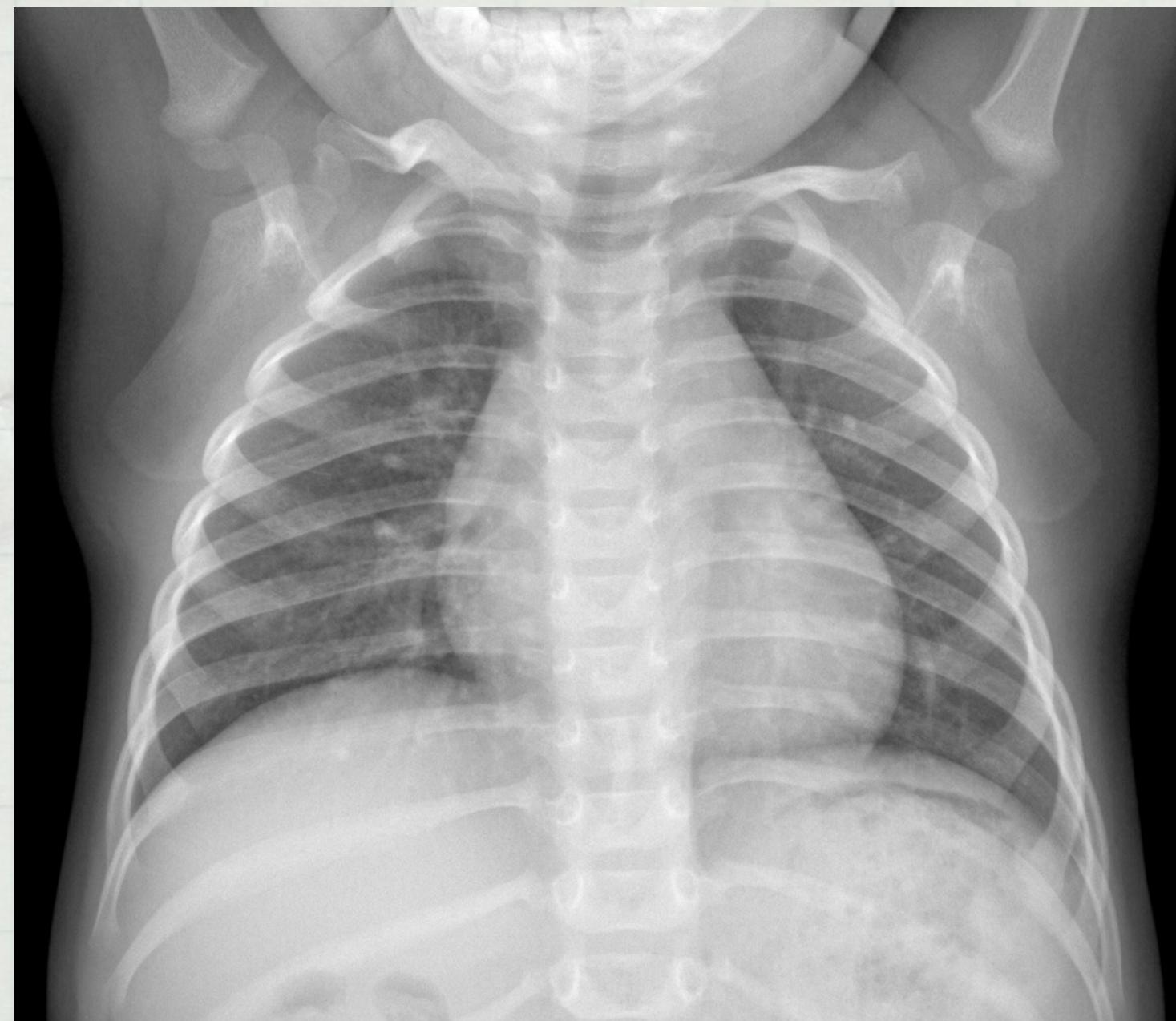
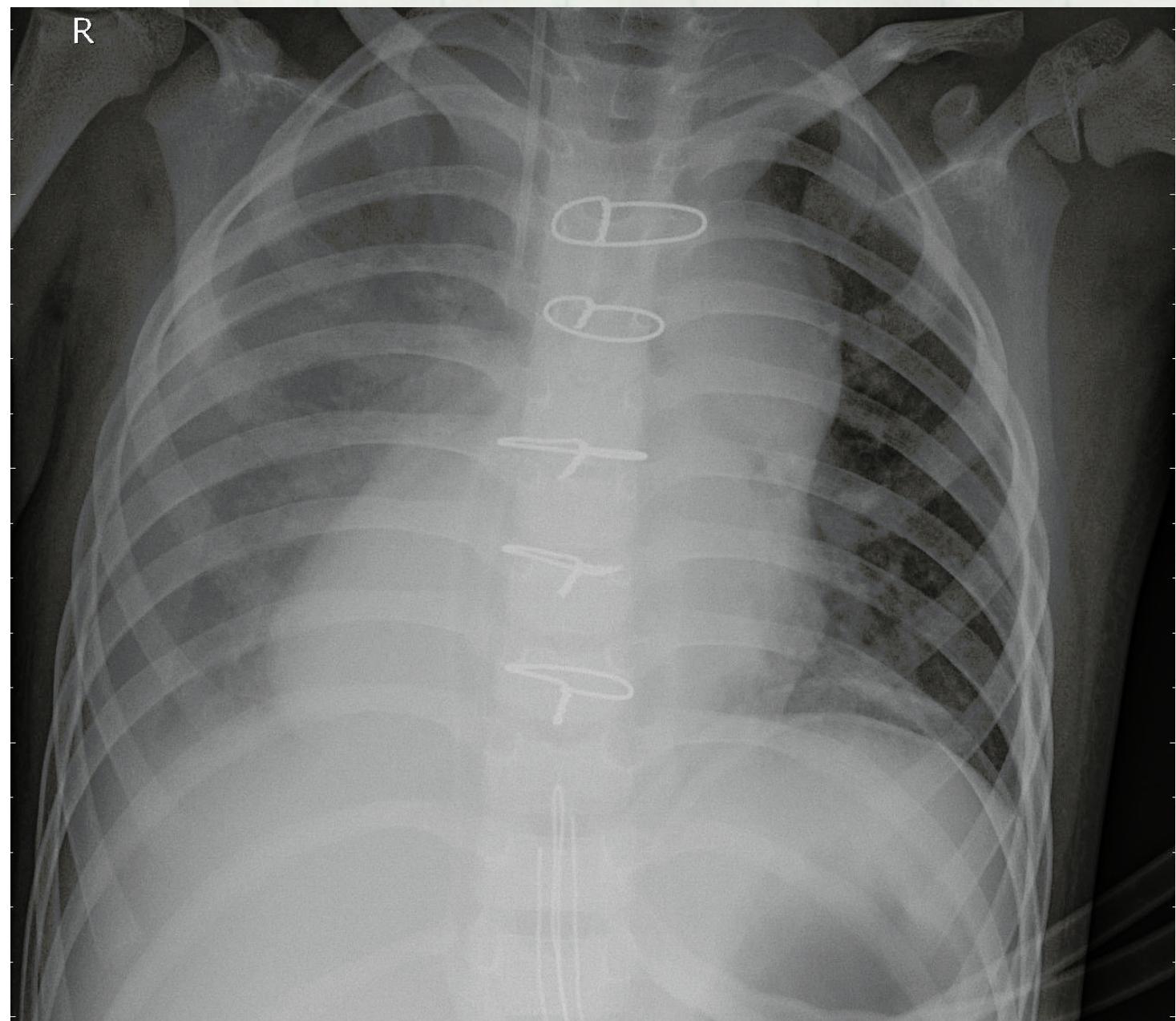


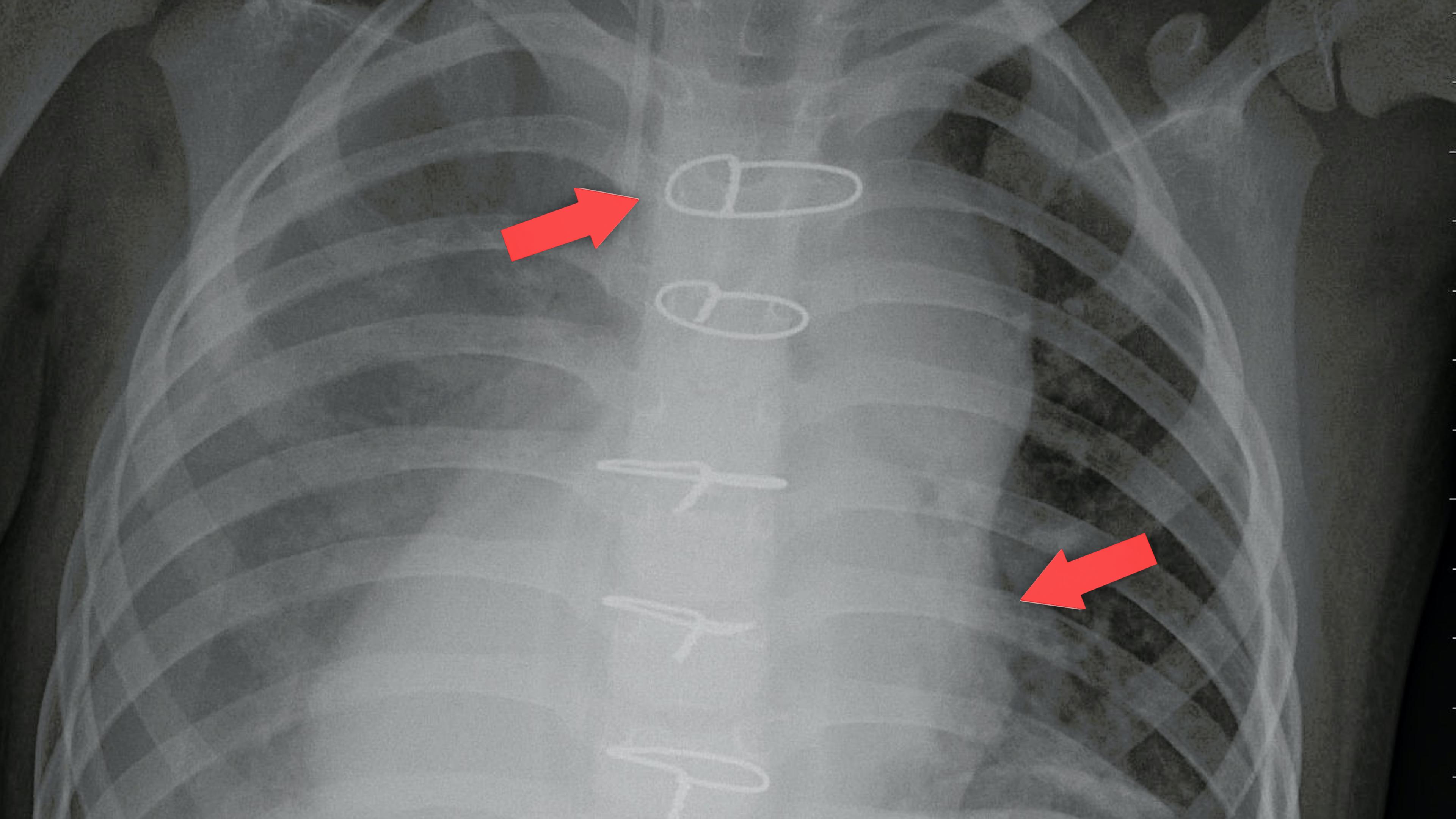
Quantum Image Processing

Anisha Musti

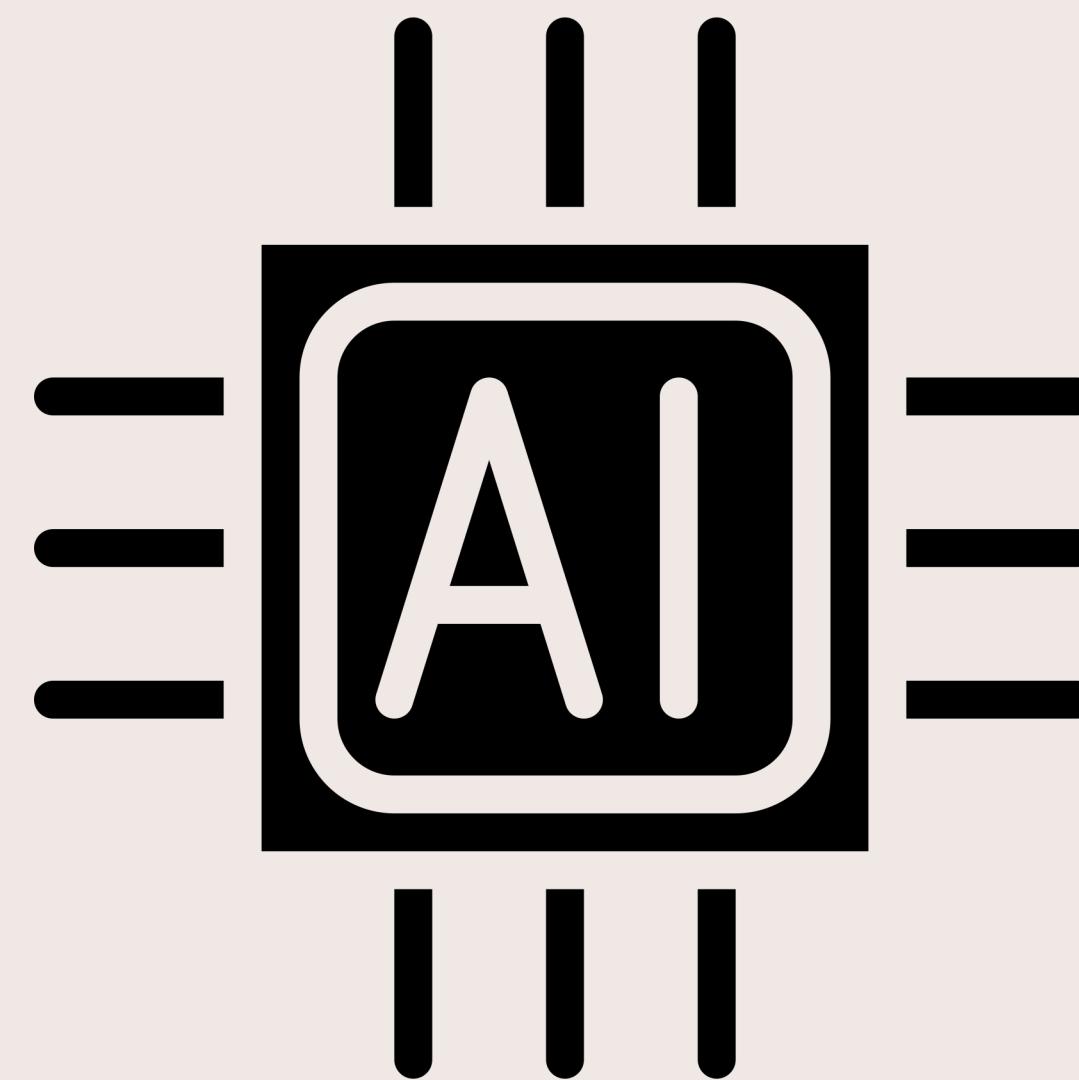
2021







Current Solution



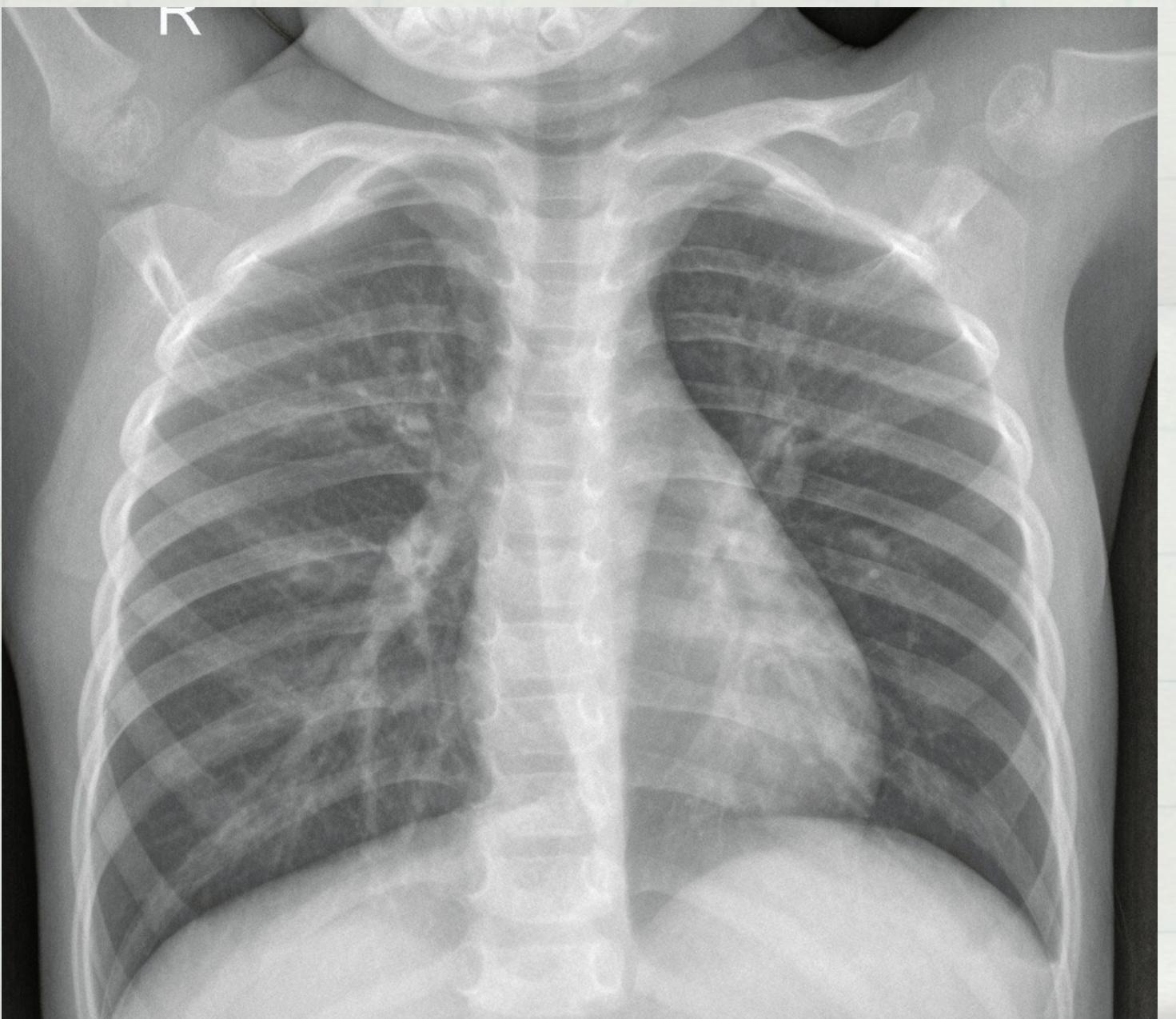
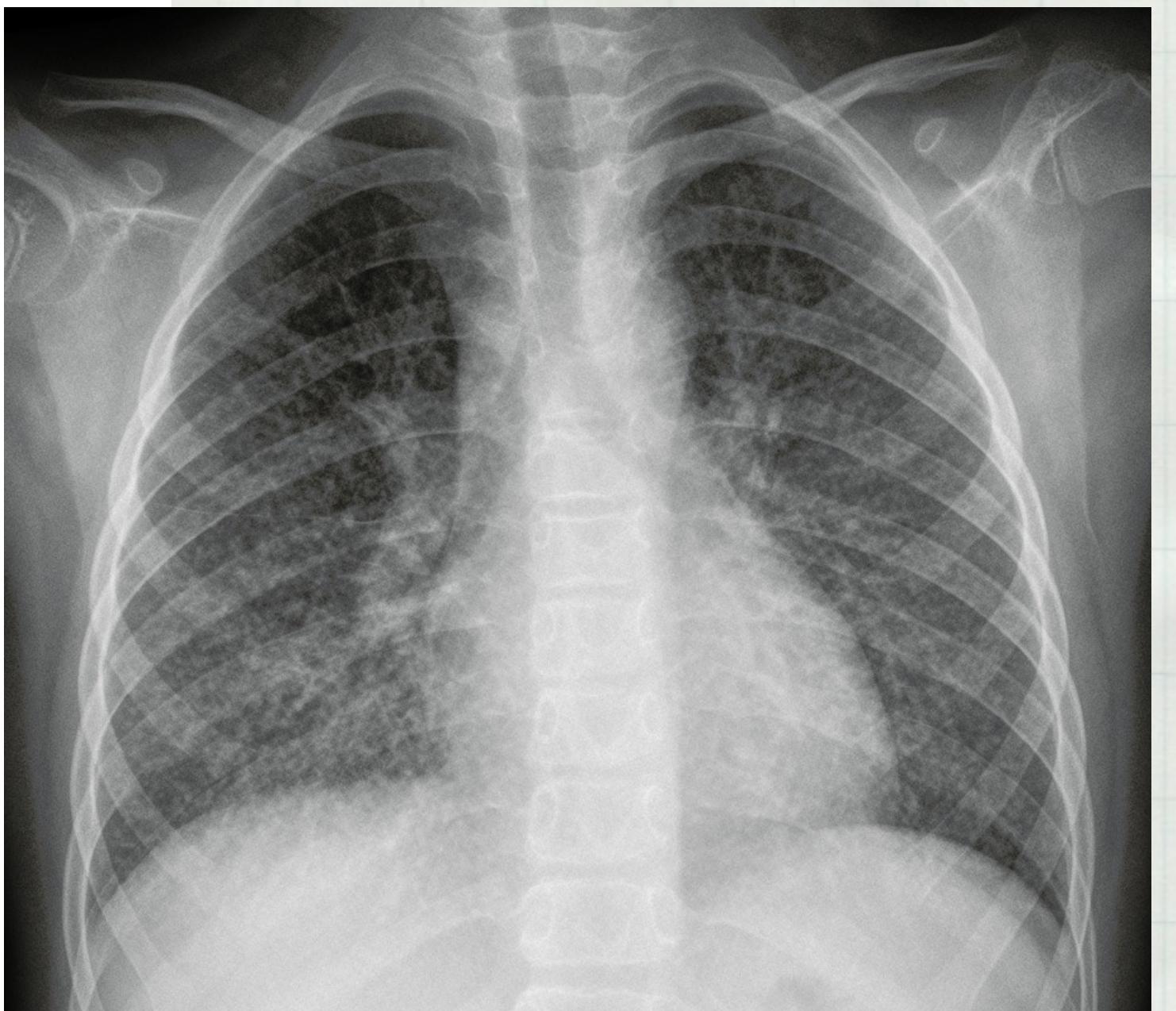


Image Matching with Qiskit

01

Classical Image Preparation

02

Quantum Encoding

03

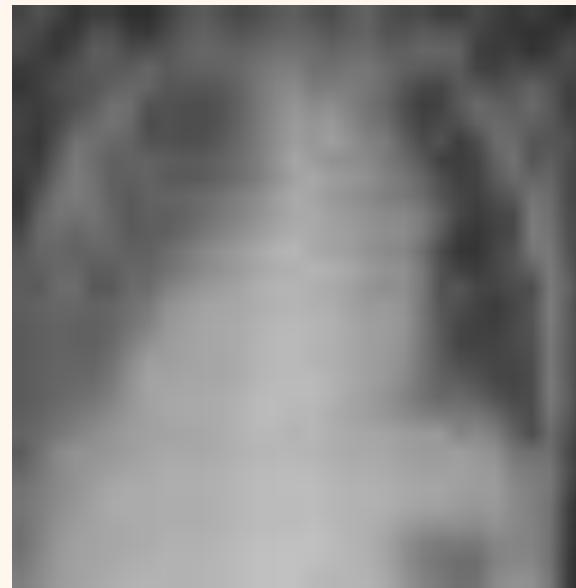
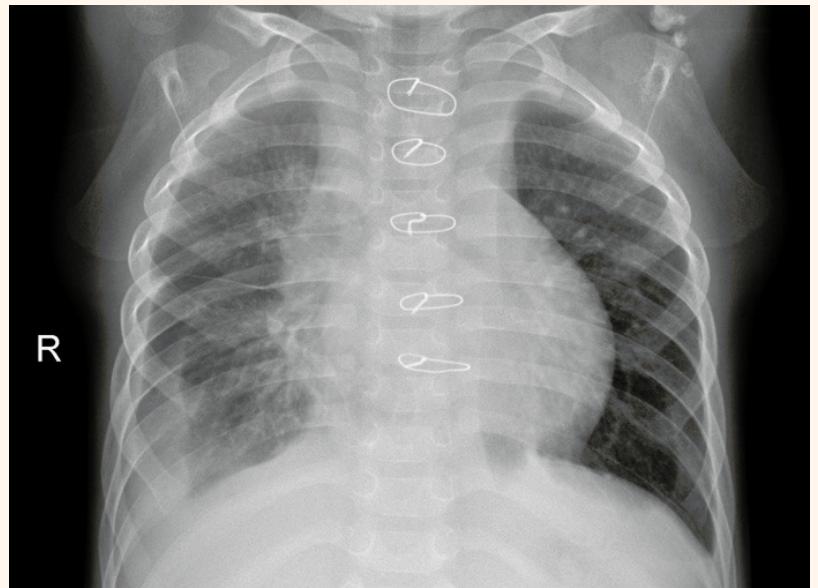
Quantum Edge Detection

04

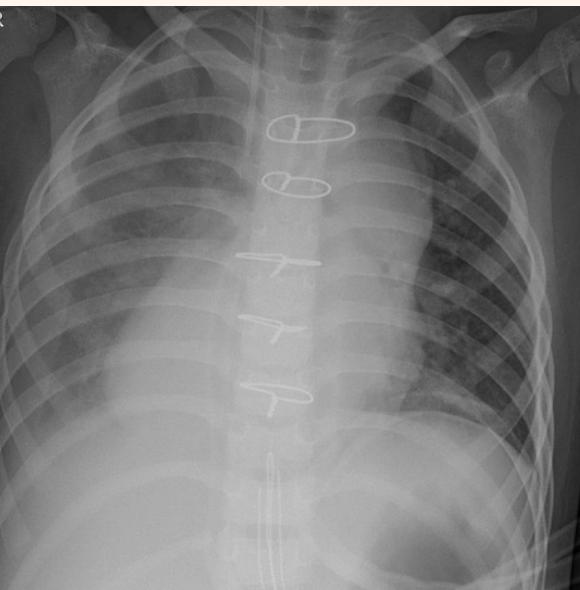
Quantum Matching

1. Image Preparation

1 2 3 4



What?
Grey scale
Square
32x32 pixels (10qubits)



Why?
#qubits <32
#gates (depth)

2. Quantum Encoding FRQI

1 2 3 4

$$|I(\theta)\rangle = \frac{1}{2^n} \sum_{i=0}^{2^{2n}-1} (\cos \theta_i |0\rangle + \sin \theta_i |1\rangle) \otimes |i\rangle$$

$$\theta_i \in \left[0, \frac{\pi}{2}\right], i = 0, 1, \dots, 2^{2n} - 1$$

A 2x2 image would have the following graph.

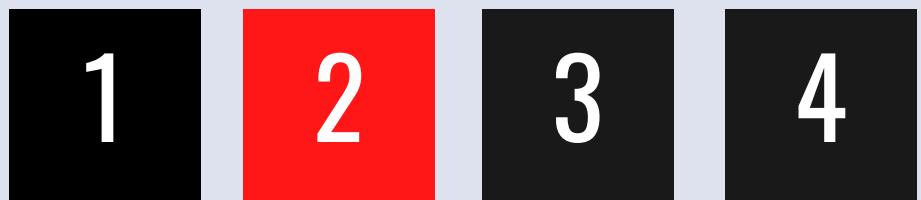
Corresponding θ angles (color encoding) and associated kets (position encoding).

The FRQI state is a normalized state from the equation to the left and is made of two parts:

- color information encoding
- associated pixel position encoding

| | |
|------------------------|------------------------|
| $\theta_0, 00\rangle$ | $\theta_1, 01\rangle$ |
| $\theta_2, 10\rangle$ | $\theta_3, 11\rangle$ |

2. Quantum Encoding FRQI



What?

Classical bit / pixels \rightarrow qubits

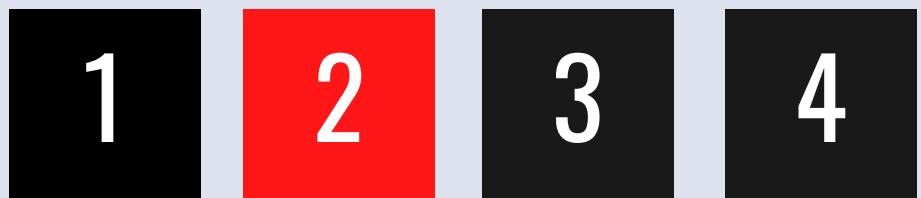
Why?

Advantage. m pixels $\rightarrow n = \log_2(m)$ qubits

But

Data loading: m gates $\rightarrow m$ pixels

2. Quantum Encoding FRQI



Alternative: Log Concave

- Reduce #gates
- Assumption: log concave probability distribution
- Classical probability distribution mapped to probability amplitude of quantum states.

| Encoding | Classical | Quantum FRQI | Quantum Log concave |
|----------|-----------|-----------------------------|-----------------------------|
| Pixels | m bits | $\log_2 m$ <u>qubits</u> | $\log_2 m$ <u>qubits</u> |
| Gates | - | m | $\log_2 m$ |

3. Quantum edge detection

1 2 3 4

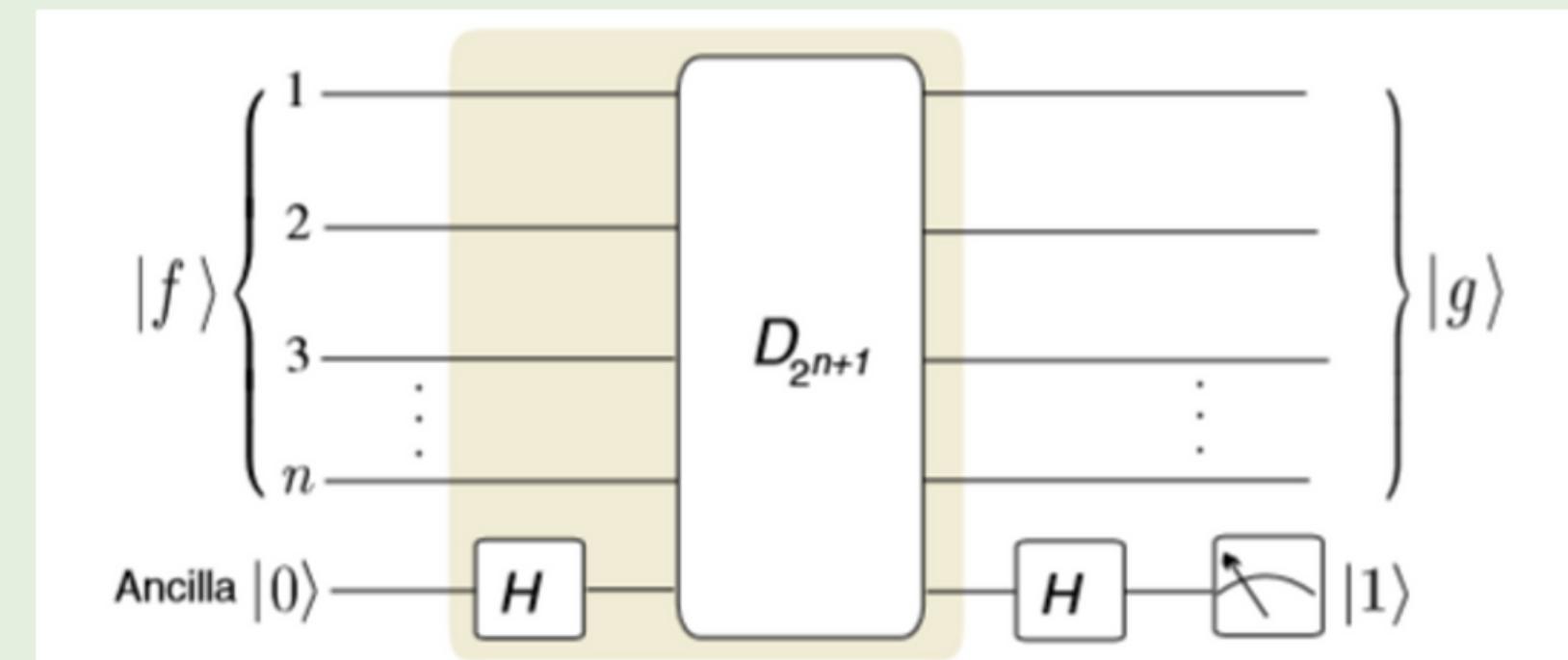


FIG. 9. Quantum circuit for the QHED algorithm with an auxiliary qubit. H is a Hadamard gate, and $D_{2^{n+1}}$ is an amplitude permutation operation for $n + 1$ qubits.

Source: Yao, X. W., Wang, H., Liao, Z., Chen, M. C., Pan, J., Li, J., ... & Zheng, W. (2017). Quantum image processing and its application to edge detection: Theory and experiment. *Physical Review X*, 7(3), 031041.

3. What is an edge?

1 2 3 4

$$\alpha = [0, 0, 0, 1, 1, 1, 0, 0, 0],$$



$$\Delta\alpha = [0, 0, 1, 0, 0, -1, 0, 0, 0]$$



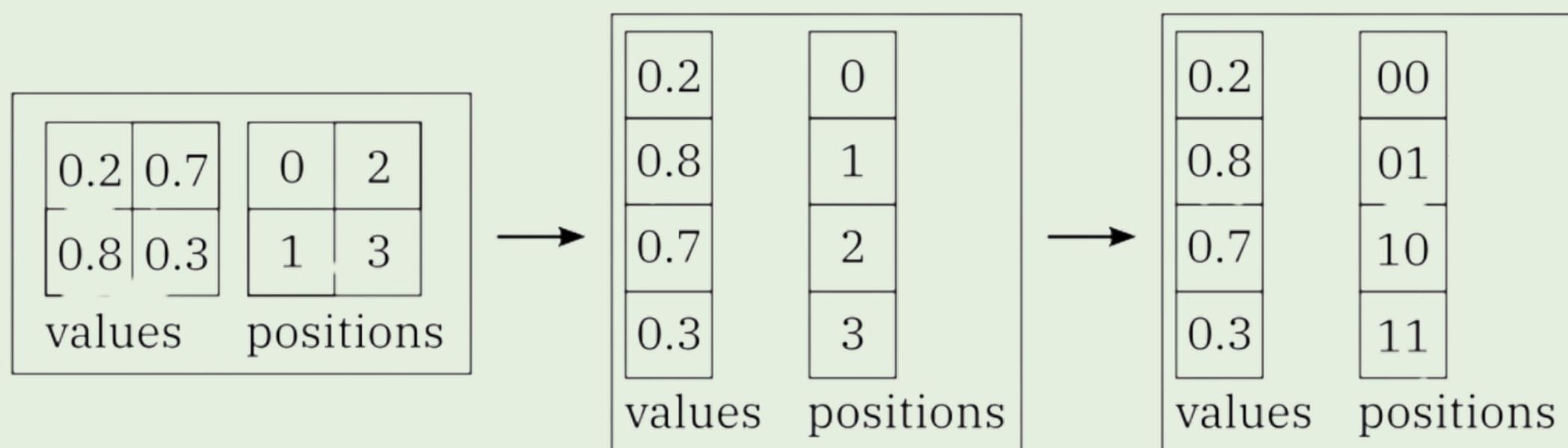
The Delta A is the difference of a pixel's nearest neighboring pixels

The differences (Delta A) take on non-zero values where there are changes (edges) in the original image.

So, a Delta A indicates an edge.

3. Image into statevector

1 2 3 4



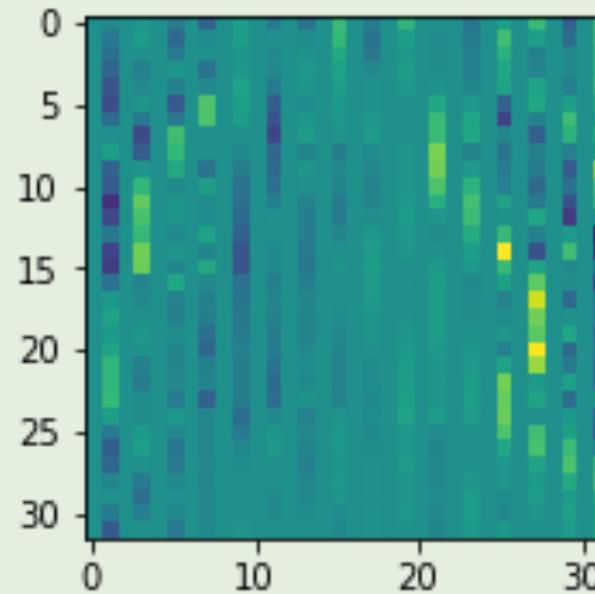
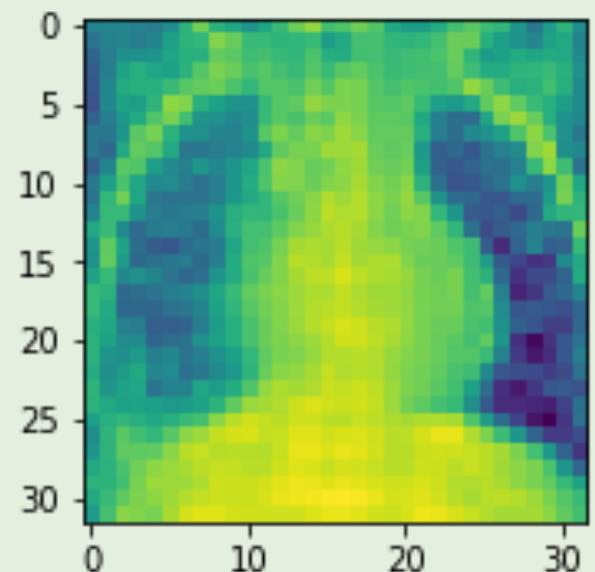
The image begins as a series of values corresponding to pixel positions. As you unravel the matrices to form vectors, you rewrite the pixels from decimals to binary.

That eventually corresponds to the quantum state of the system.

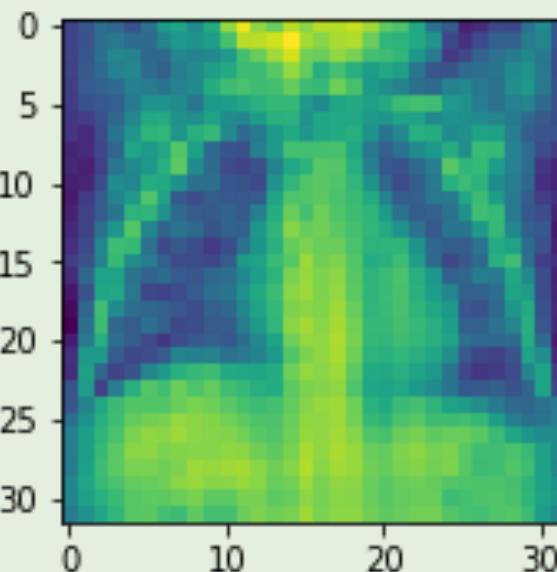
$$|\text{image}\rangle = \frac{0.2|00\rangle + 0.8|01\rangle + 0.7|10\rangle + 0.3|11\rangle}{\sqrt{0.2^2 + 0.8^2 + 0.7^2 + 0.3^2}}$$

3. Results

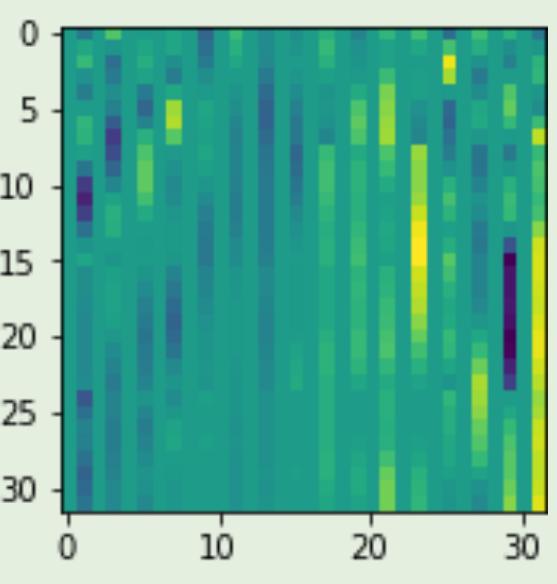
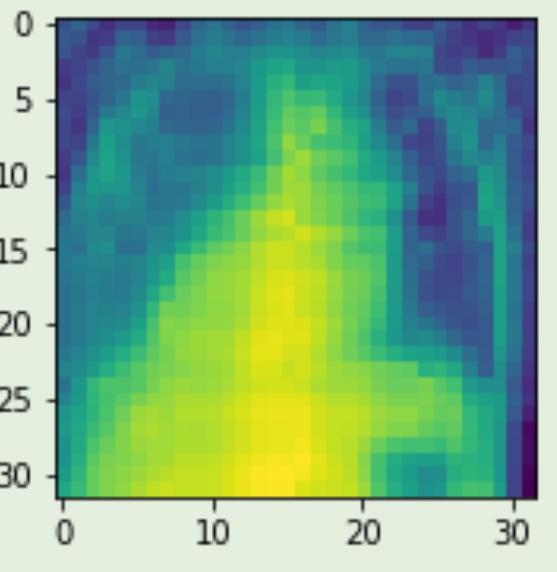
1 2 3 4



TEST



NORMAL

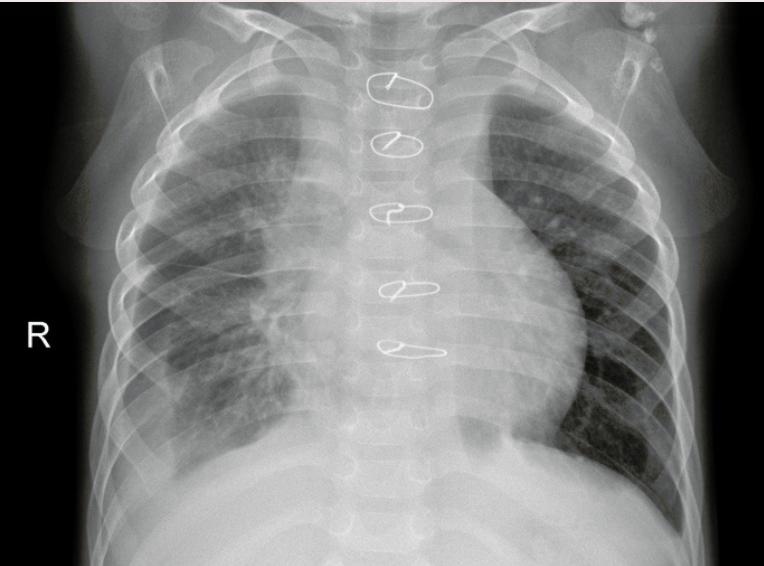


PNEUMONIA

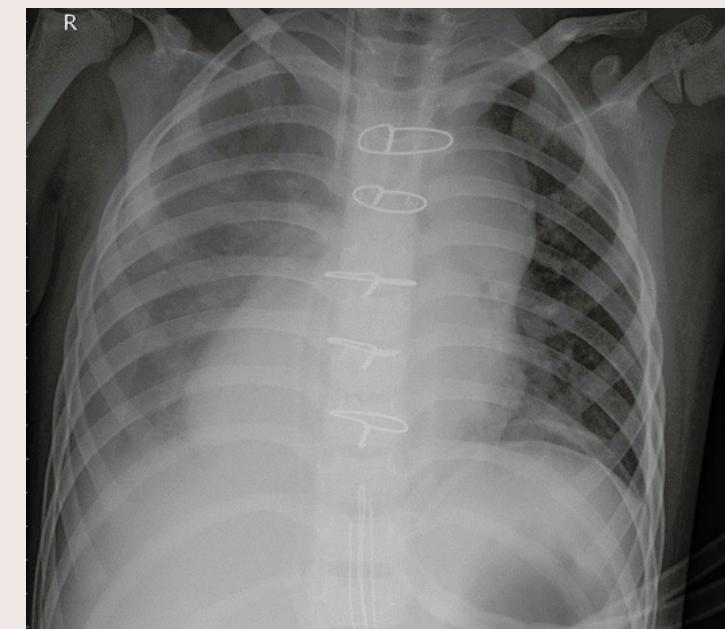
4. Quantum Matching

1 2 3 4

Problem Picture

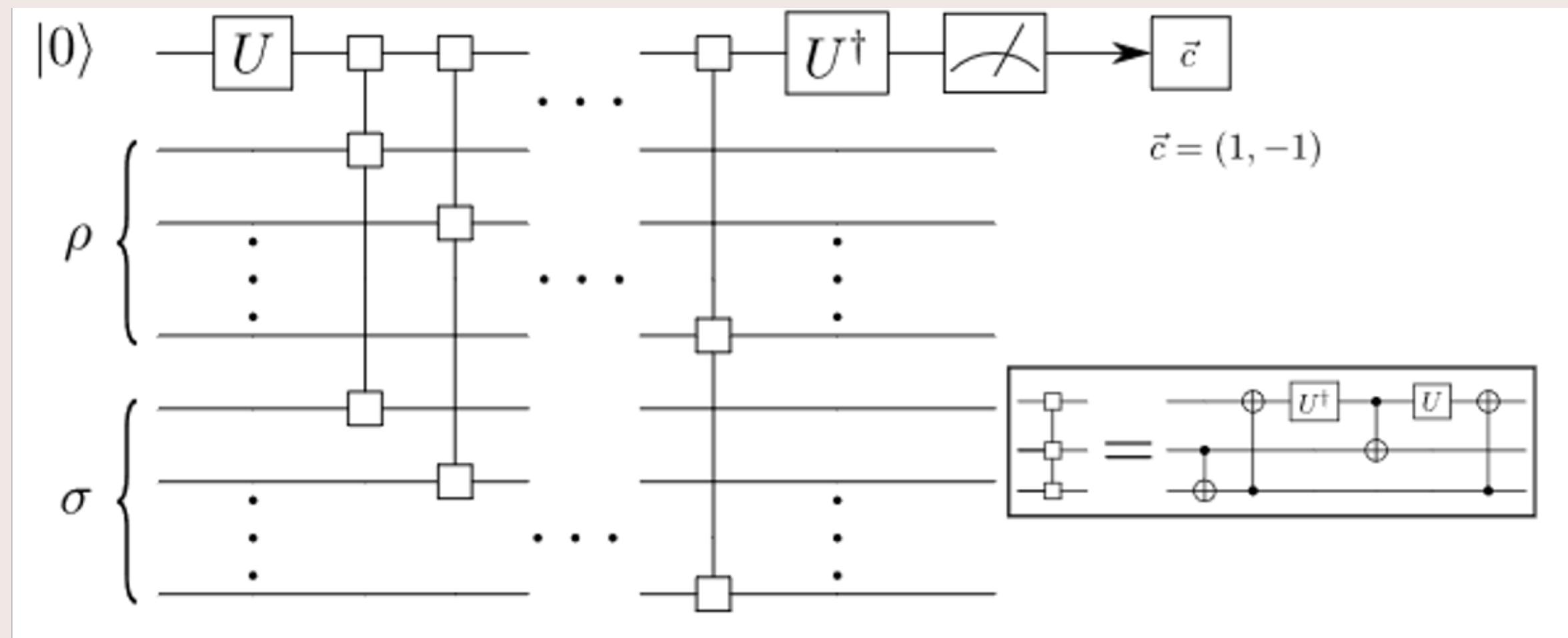


Two Options



4. The Circuit

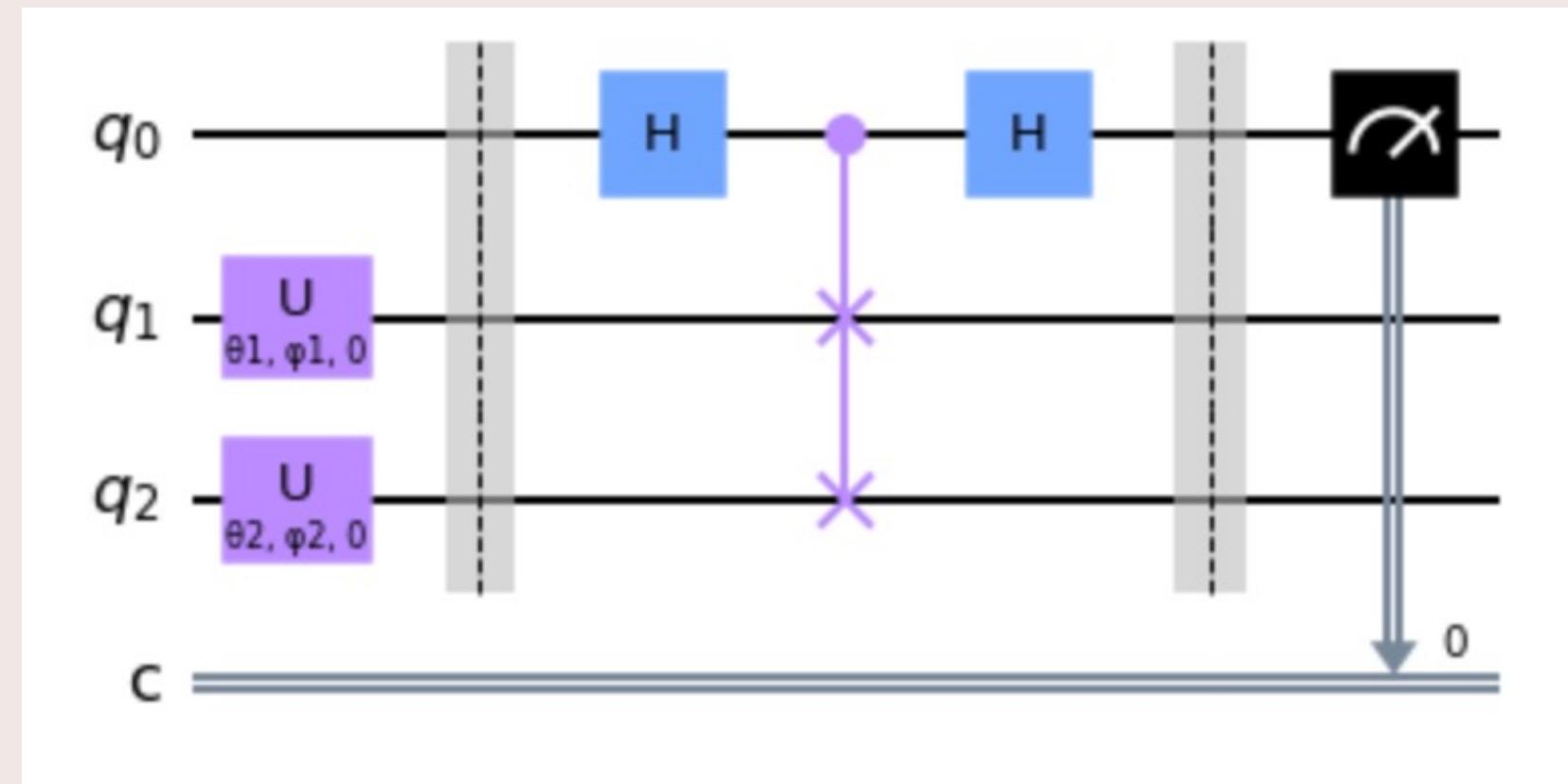
1 2 3 4



Source: Cincio, L., Subaşı, Y., Sornborger, A. T., & Coles, P. J. (2018). Learning the quantum algorithm for state overlap. New Journal of Physics, 20(11), 113022.

4. My Circuit

1 2 3 4

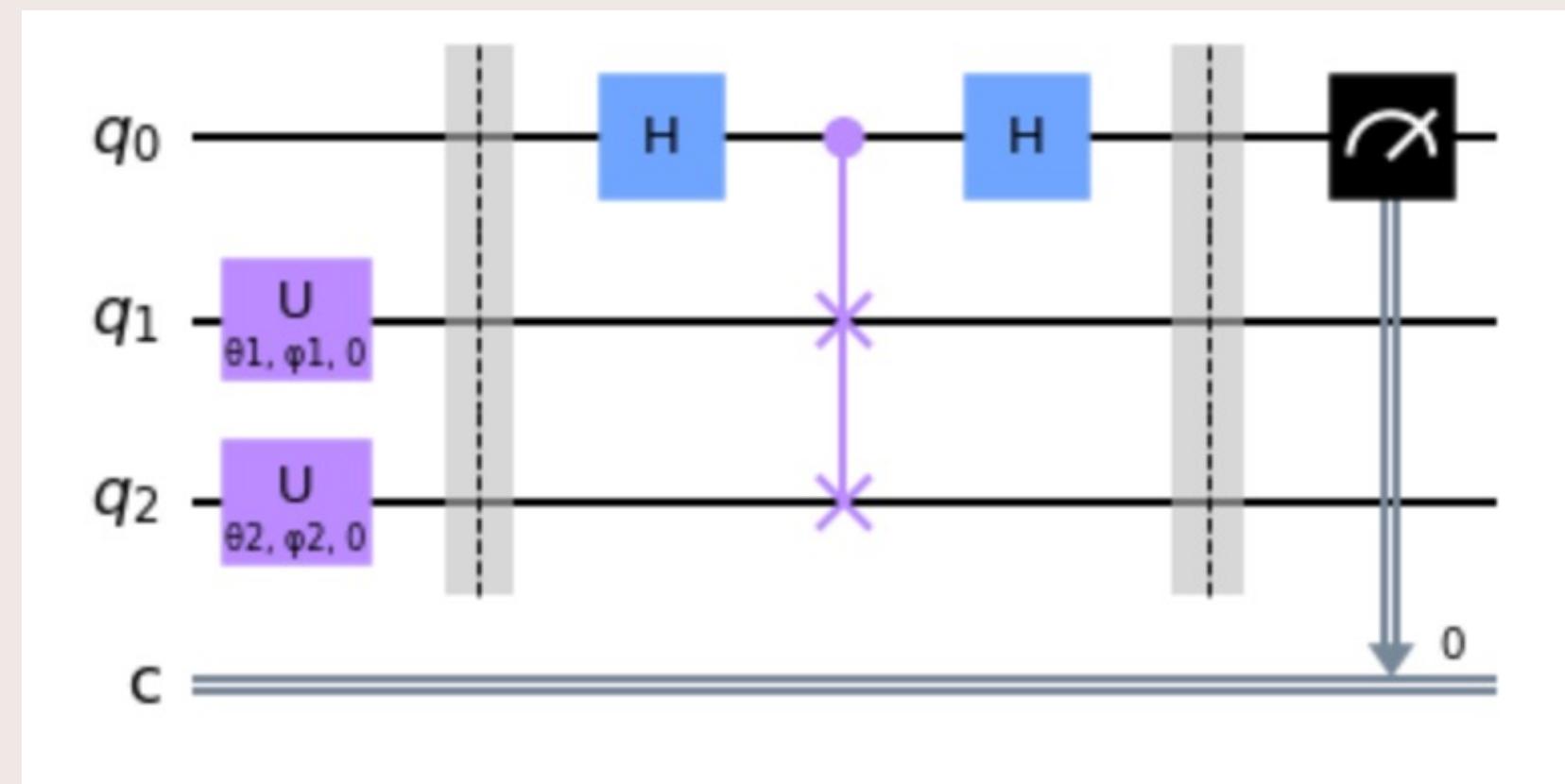


The qubits used to encode both the test and reference images represent the density matrices for each image.

These density matrices can then be compared via a quantum based similarity test.

4. SWAP Test

1 2 3 4



Two of these components have the ancilla in the $|1\rangle$ state, two have it in $|0\rangle$; the probability of measuring $|1\rangle$ is related to the inner product of the input states.

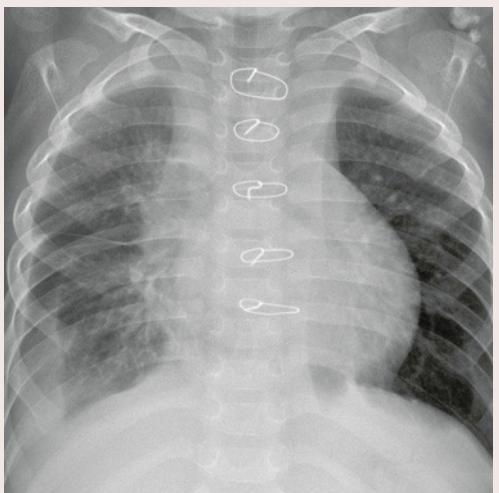
If the states are parallel, we always measure 0 (useful for results later). Otherwise, there's a nonzero chance of measuring 1.

4. Results

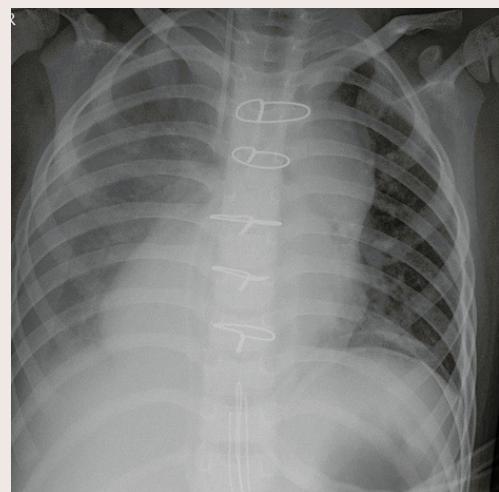
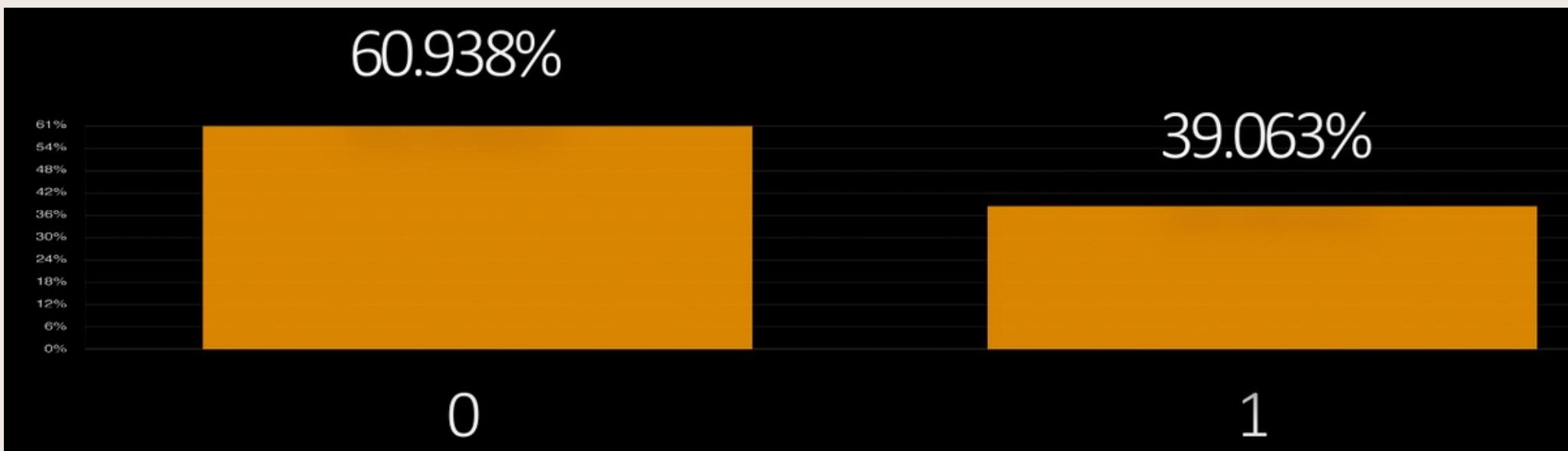
1 2 3 4

Shots 1024

Simulation time taken 34m 4.8s



Problem Image

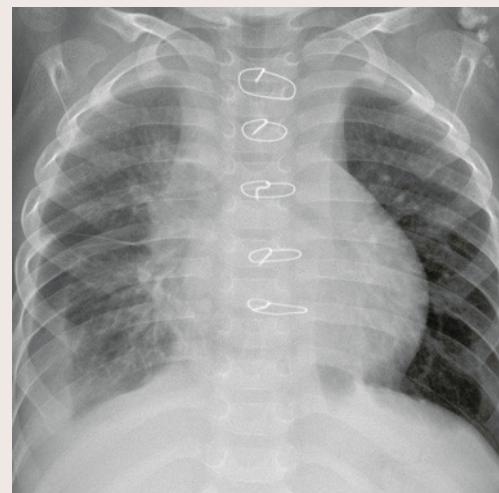


SWAP Image

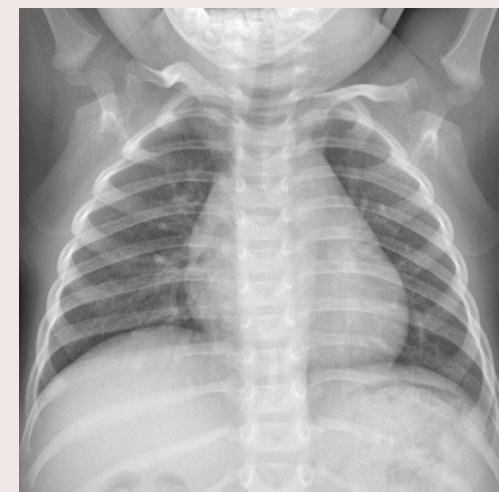
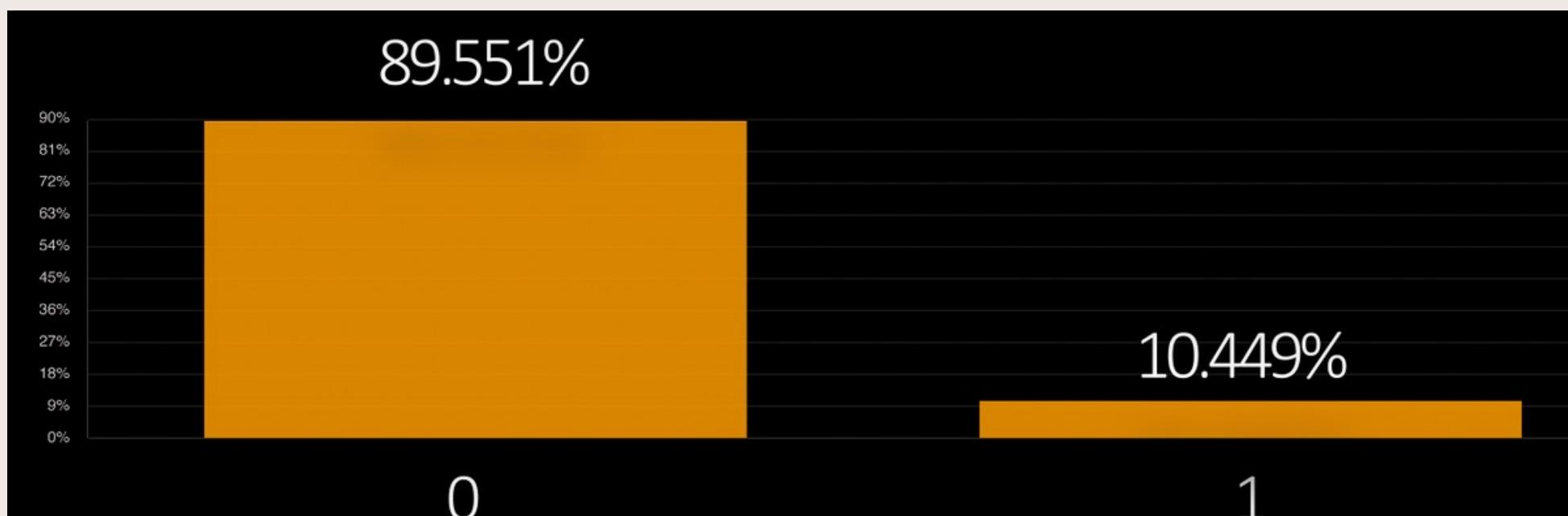
4. Results

1 2 3 4

Shots 1024
Simulation time taken 30m 18.5s

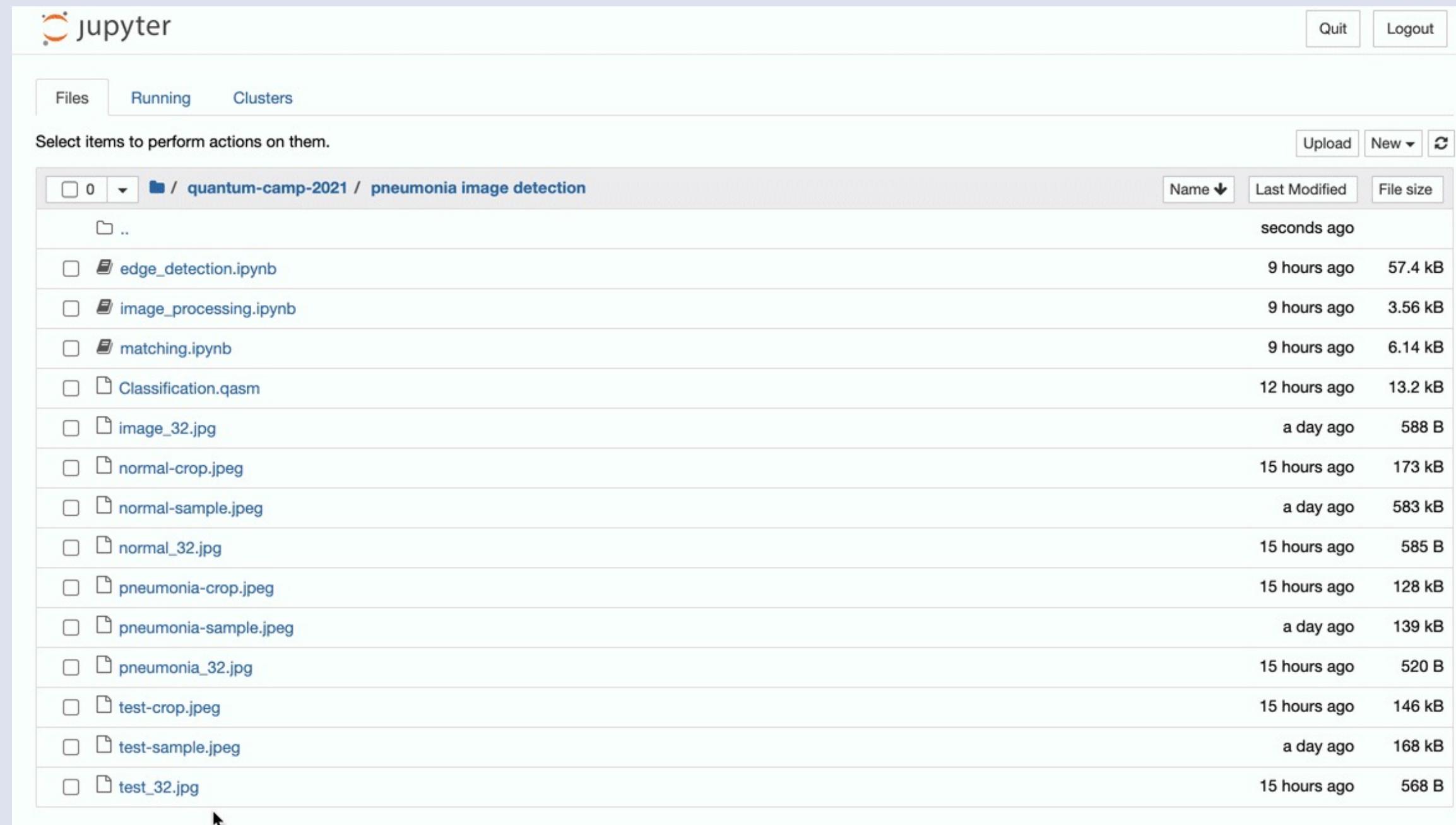


Problem Image



SWAP Image

Qiskit Implementation



Conclusion



- Algorithm showed that the patient was more similar to one who had pneumonia as opposed to not
- Classical AI still possesses an advantage with image similarity through deep learning. However, advances in hardware may change that.
- Further research involves mapping the images on near-term algorithms such as QAOA or VQE
- The algorithm can be applied to other forms of medical images such as tumors

References

- [1] Yao, X. W., Wang, H., Liao, Z., Chen, M. C., Pan, J., Li, J., ... & Zheng, W. (2017). Quantum image processing and its application to edge detection: Theory and experiment. *Physical Review X*, 7(3), 031041.
- [2] Le, P. Q., Dong, F., & Hirota, K. (2011). A flexible representation of quantum images for polynomial preparation, image compression, and processing operations. *Quantum Information Processing*, 10(1), 63-84.
- [3] Le, Q. P., Fangyang, D., Yoshinori, A., & Kaoru, H. (2009). Flexible representation of quantum images and its computational complexity analysis. I In 日本知能情報ファジィ学会 ファジィシステムシンポジウム 講演論文集 第25回ファジィシステムシンポジウム (pp. 185-185). 日本知能情報ファジィ学会
- [4] Yuan, Suzhen & Venegas-Andraca, Salvador & Wang, Yuchan & Luo, Yuan & Mao, Xuefeng. (2019). Quantum Image Edge Detection Algorithm. *International Journal of Theoretical Physics*. 10.1007/s10773-019-04166-9.
- [5] Gómez-Moreno, H., Maldonado-Bascón, S., López-Ferreras, F., Acevedo-Rodríguez, F. J., & Martín-Martín, P. (2001). Edge detection by using the support vector machines. training, 2, 3. [6] Cincio, L., Subaşı, Y., Sornborger, A. T., & Coles, P. J. (2018). Learning the quantum algorithm for state overlap. *New Journal of Physics*, 20(11), 113022.