

LIVE SESSION ►

QUANTUM MACHINE LEARNING WORKSHOP

ON 16-JUL-2022 @ 9 AM IST - ONLINE LIVE DELIVERY

REGISTER FREE

<https://forms.gle/wrnBgsXgeuaAd5dx7>

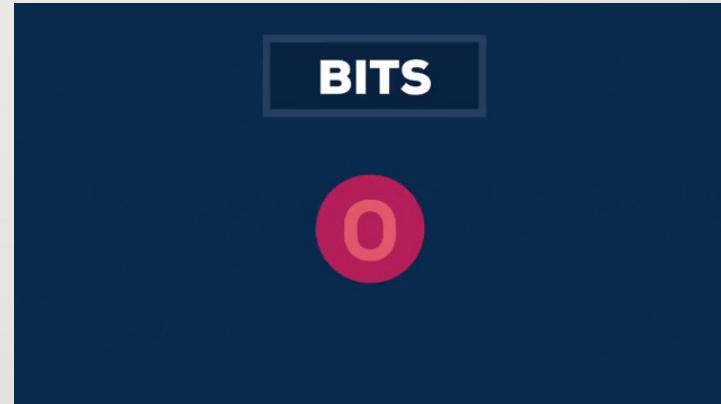
PRASANNA VENKATESH

AI AND CLOUD EVANGELIST



CLASSICAL COMPUTERS

- Basis of classical computers
- BITS
 - Either Zero or One
 - Only one state at a time



SIMPLE COIN FLIP

- Is it Head? Or Tails?
- What is the value when it is in REST?
- What is the value when it is tossed?



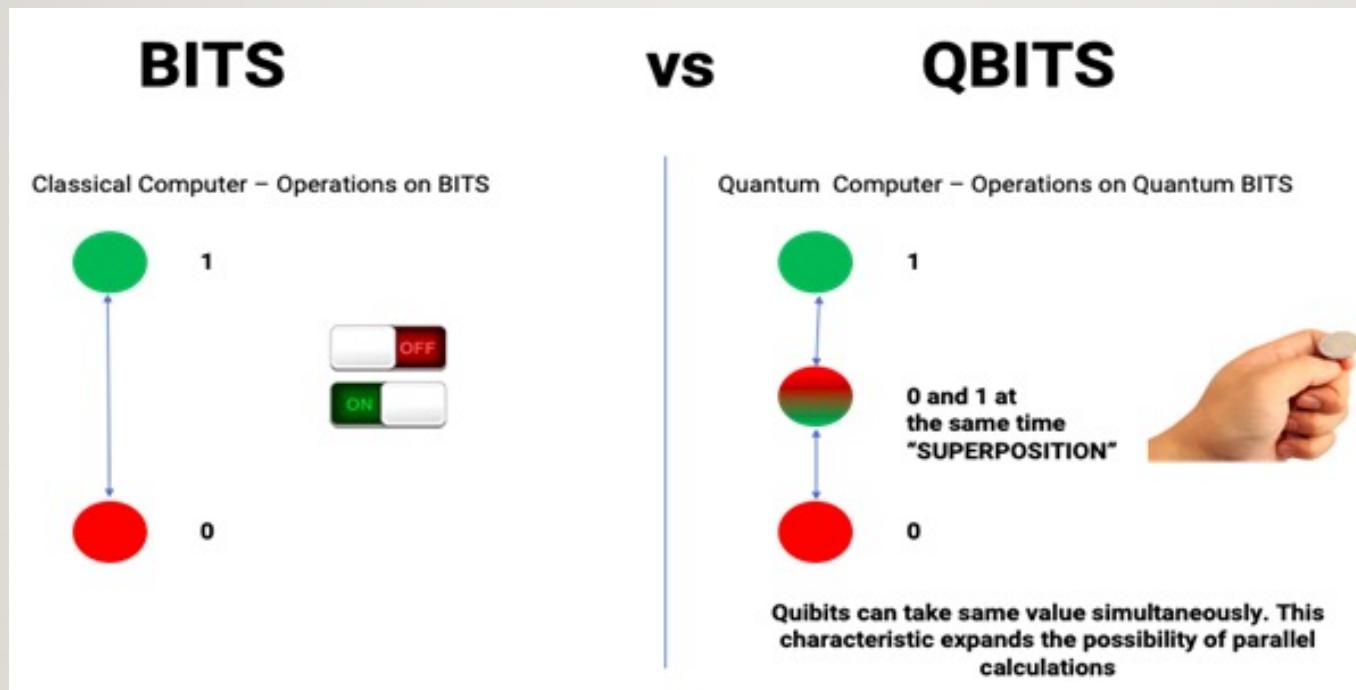
“ไทยน่าเรียน”



SIMPLE COMPARISON

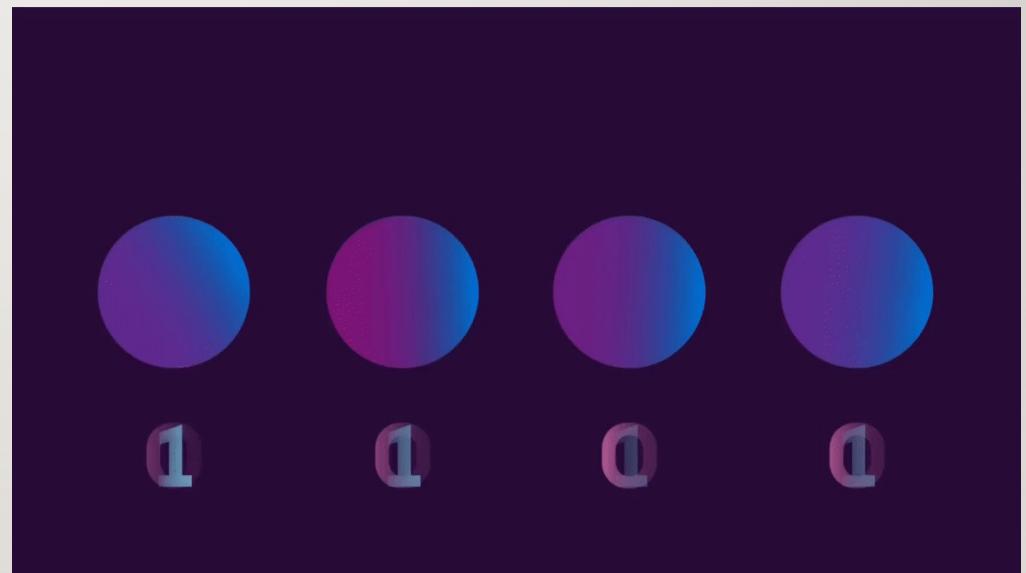
- **Coin at stable stage on the hand – compared to classical computers BITS.**
 - At any point only one state is possible.
- **Coin at the tossed stage – quantum computing super position stage.**
 - At any point two possible values at the same time for a bit
 - Quantum Bit
 - QuBIT

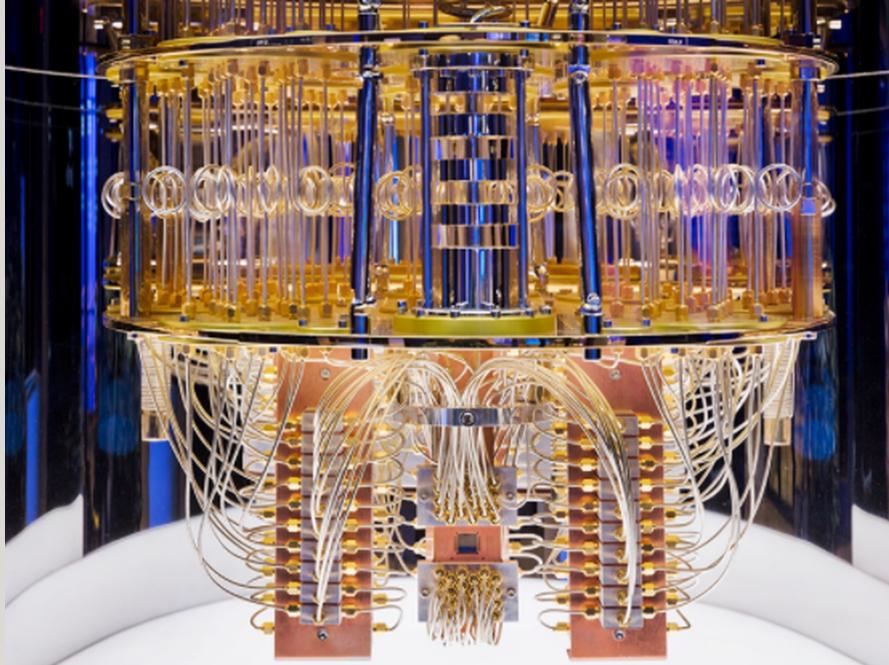
BITS VS QUBITS



QUBIT – SUPER POSITION STATE

- At the same time has both zero and one.
- Image shows 4 qubits and the value changes both 1 and 0 at the same time.
- This state is called super position state





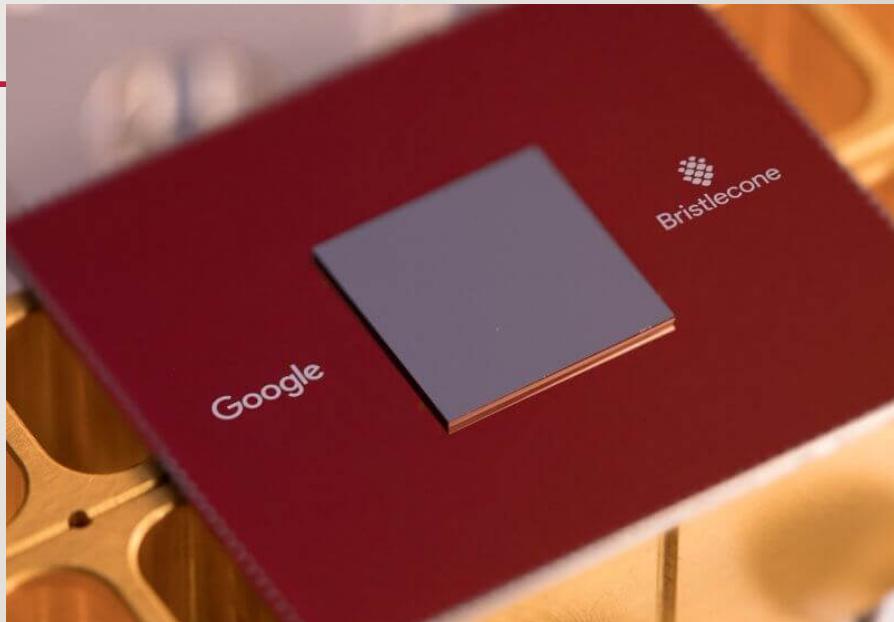
SAMPLE QUANTUM COMPUTERS

QUANTUM COMPUTING PLAYERS



GOOGLE BRISTLEcone

- 72 qubit quantum computer in a chip.
- Mainly used for research and innovations
- For creating algorithm building



GOOGLE SYCAMORE CHIPS



2^{52}

Times of processing.

Google showcased the
Quantum Supremacy???

- New computational capability that is not feasible by typical super computers of the world.

IBM QUANTUM COMPUTING PROGRESS

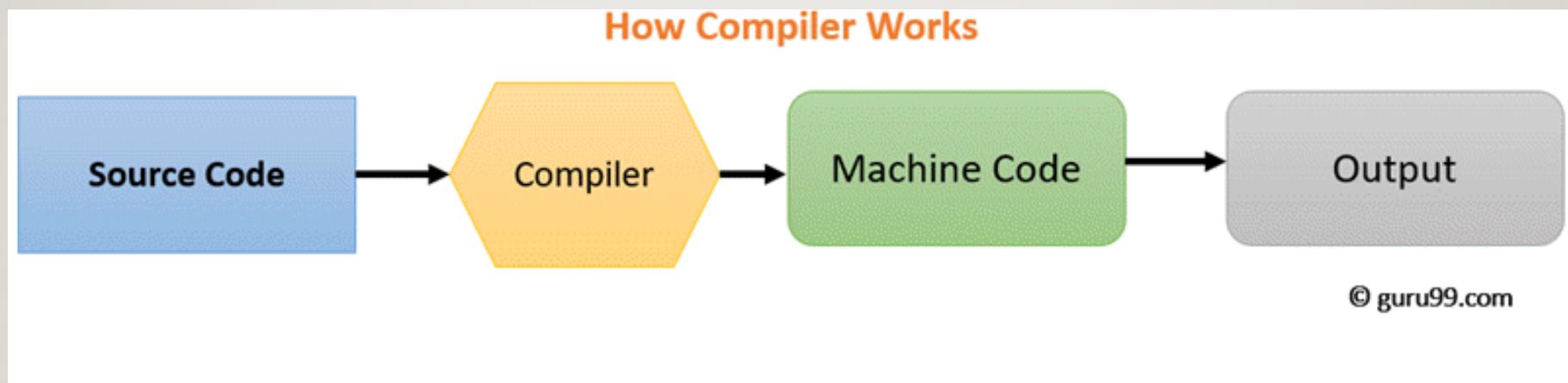


June-2022 release by IBM

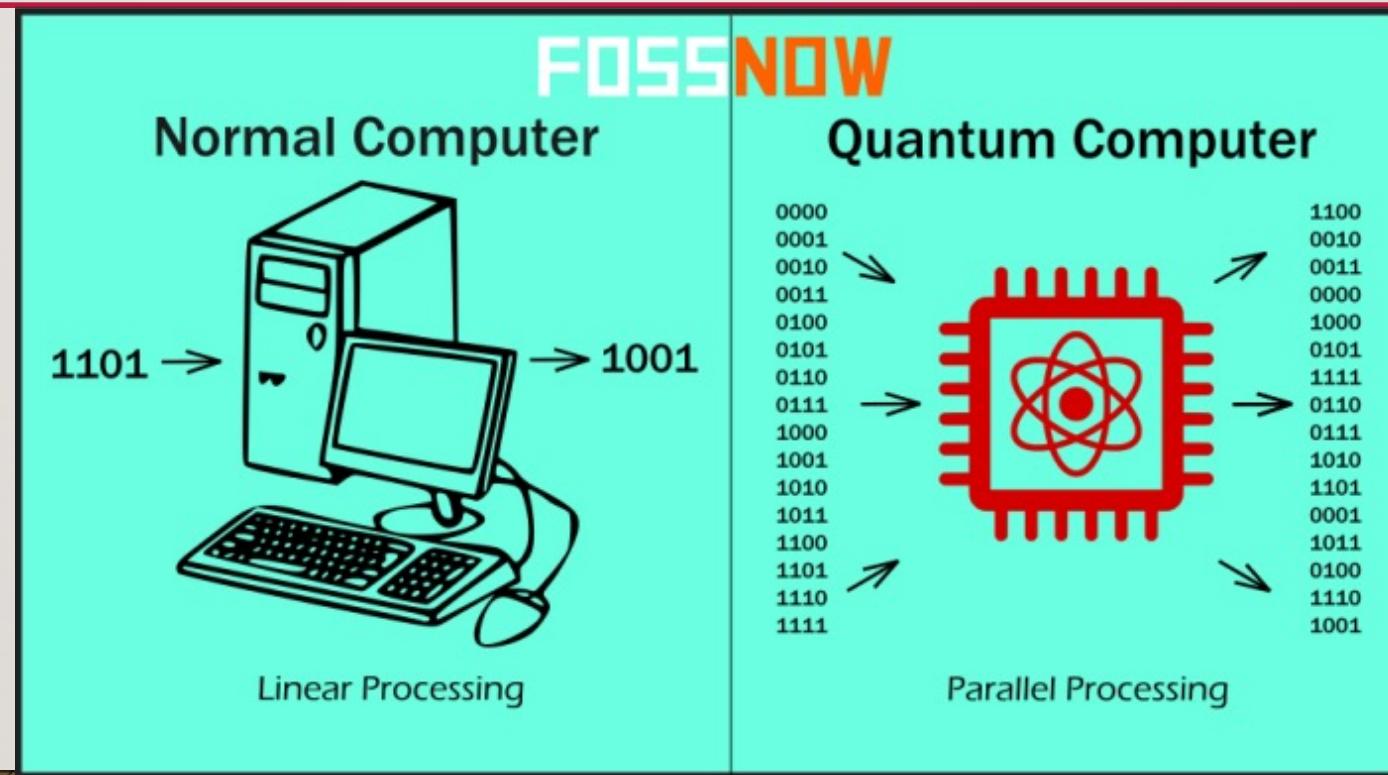
1386-qubit processor – Kookaburra

4,158-qubit POC system built using three connected Kookaburra processors by 2025

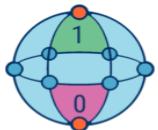
CLASSICAL COMPUTER EXECUTION METHOD



QUANTUM COMPUTER



Quantum Computing Vs. Classical Computing



Calculates with qubits, which can represent 0 and 1 at the same time

Classical Computing



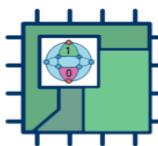
Calculates with transistors, which can represent either 0 or 1



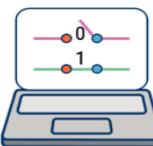
Power increases exponentially in proportion to the number of qubits



Power increases in a 1:1 relationship with the number of transistors



Quantum computers have high error rates and need to be kept ultracold



Classical computers have low error rates and can operate at room temp



Well suited for tasks like optimization problems, data analysis, and simulations



Most everyday processing is best handled by classical computers

CB INSIGHTS

COMPARING QUANTUM AND CLASSICAL COMPUTING

**Quantum Universal
Languages**
Full-stack libraries
Quantum algorithms
Quantum circuits
Assembly language
Hardware
XACC
ProjectQ
CirqProjectQ

IBM	Rigetti	DWave	Xanadu	Google	Microsoft*	Qilimanjaro*	
QISKit	Forest		Strawberry Fields	Cirq	Quantum Development Kit		
QISKit Aqua	Grove	QSage ToQ		OpenFermion -Cirq	Q#		
QISKit Terra	pyquil	qbsolv		Cirq		Qibo	
Open QASM	Quil	QASM	Blackbird	Other Quantum Machine Instruction Languages			
Quantum device							

* Hardware under development. Quantum programs are run on their own simulators.

VARIOUS QUANTUM PROGRAMMING FRAMEWORKS

a 1950s computing

Assembly language
(low-level) programs
Relay circuits and
discrete wires

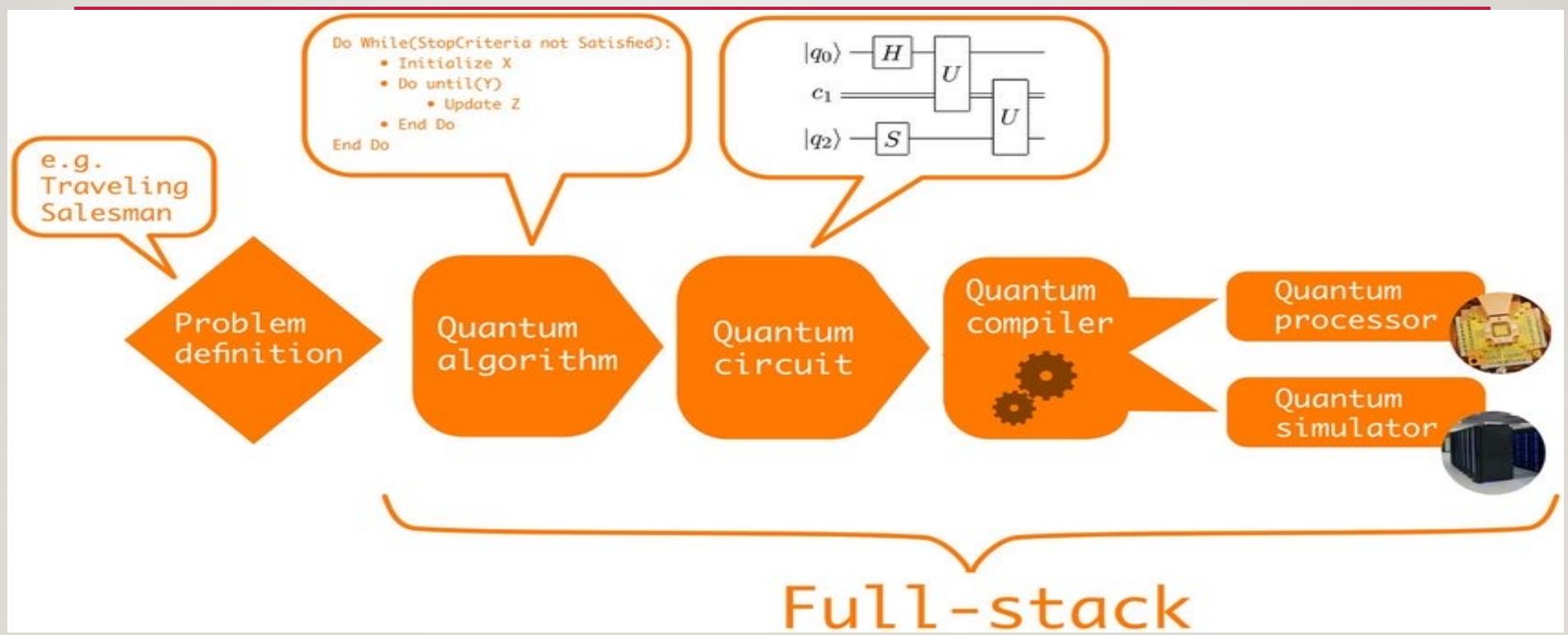
b Classical computing today

Algorithms
High-level languages
Compiler
Classical architecture
(memory, arithmetic
operations, control
operations, communication)
Hardware building
blocks: gates, bits
VLSI circuits
Semiconductor
transistors

c Quantum computing

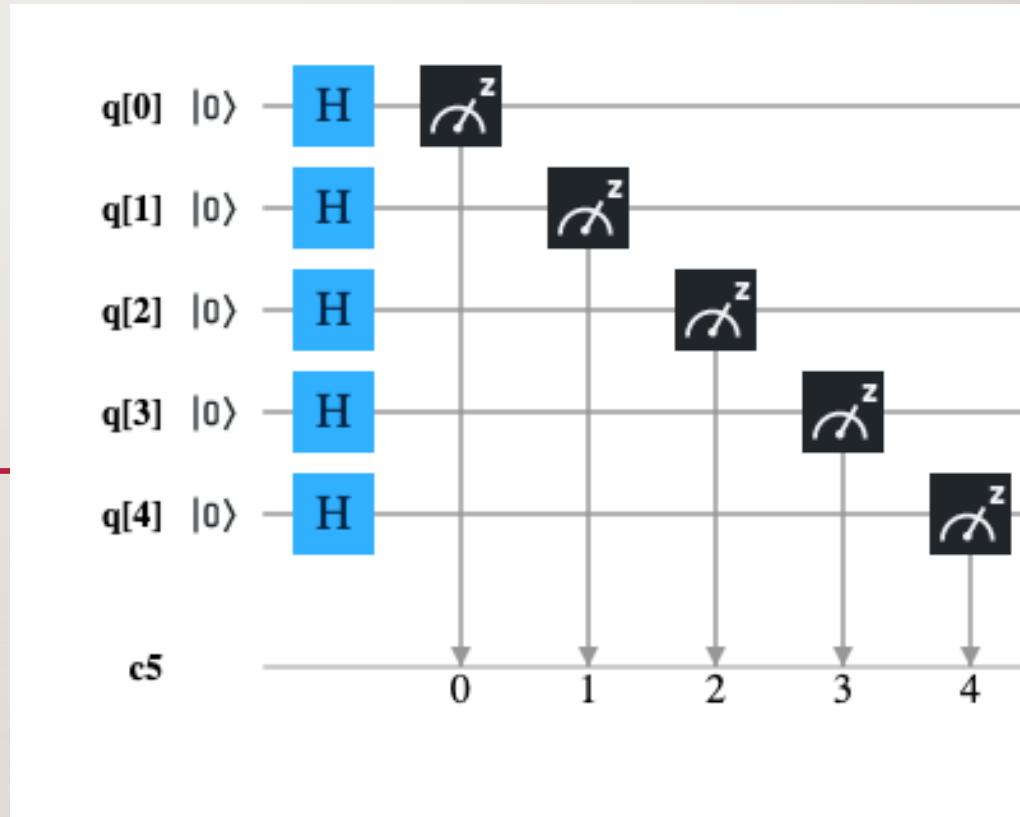
Algorithms
High-level languages
Classical compiler
Quantum compiler
Classical
architecture
(control operations)
Hardware building
blocks (gates, bits)
VLSI circuits
Semiconductor
transistors
Error-correction
and control pulses
Underlying technology
(semiconductors,
trapped ions)

QUANTUM PROGRAMMING FLOW

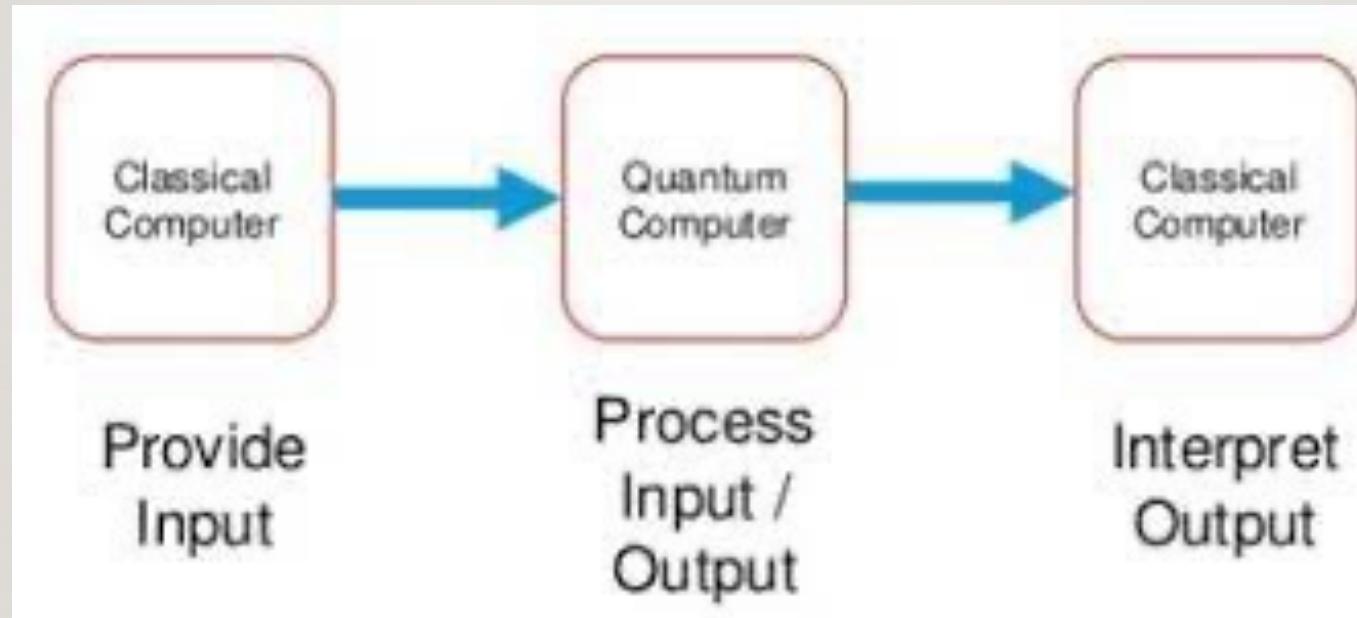


QUANTUM CIRCUIT – EXAMPLE

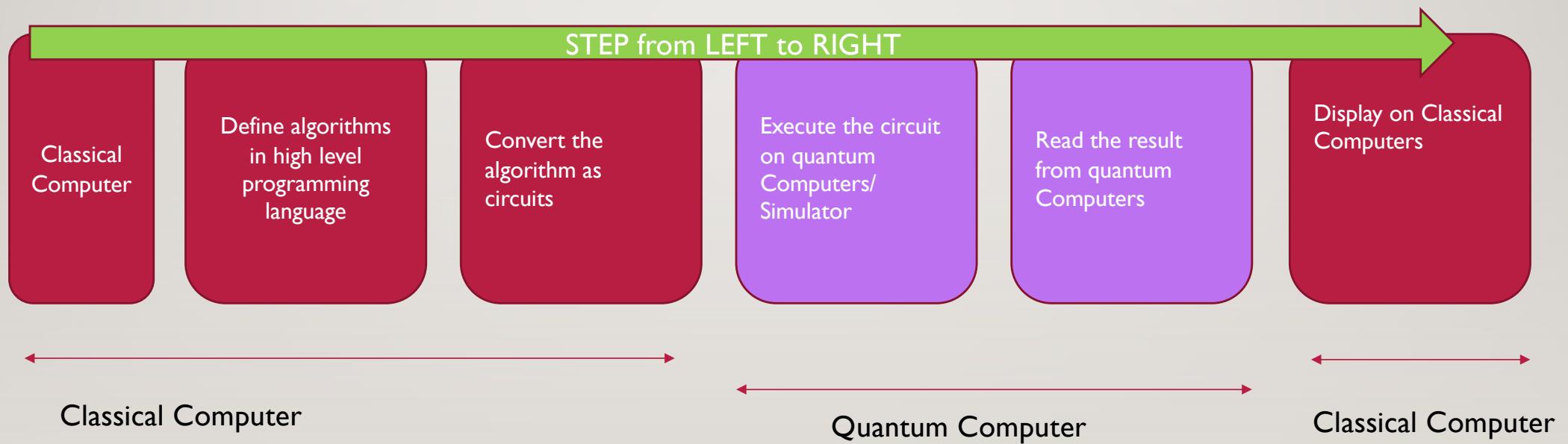
RANDOM NUMBER GENERATION ALGO



INTERACTING WITH QUANTUM COMPUTER



CLASSICAL COMPUTER TO QUANTUM COMPUTER INTERACTION



GOOGLE CIRQ – INTRODUCTION

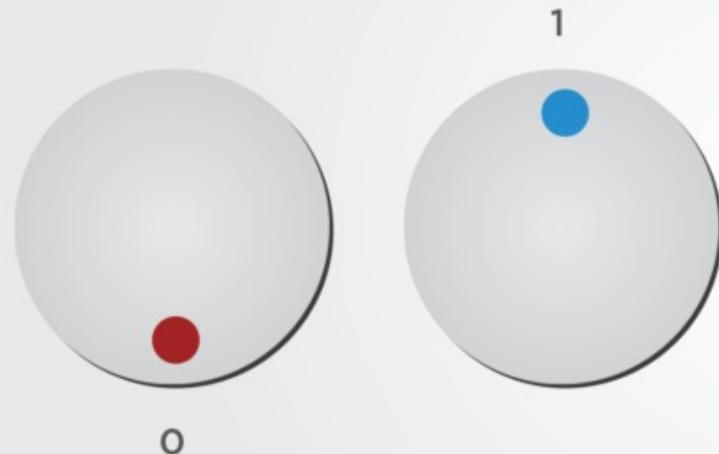
- Open Source Programming language for Quantum Algorithms and Circuit Building.
- Available on GitHub - <https://quantumai.google/cirq> \$ <https://github.com/quantumlib/cirq>
- Python library for writing, manipulating, and optimizing quantum circuits and running them against quantum computers and simulators.
- Enable users to create Qubits, Gates, Operations, Circuits, Moments, Apply simulation or real device execution and visualize the result.

QUBIT INTRO

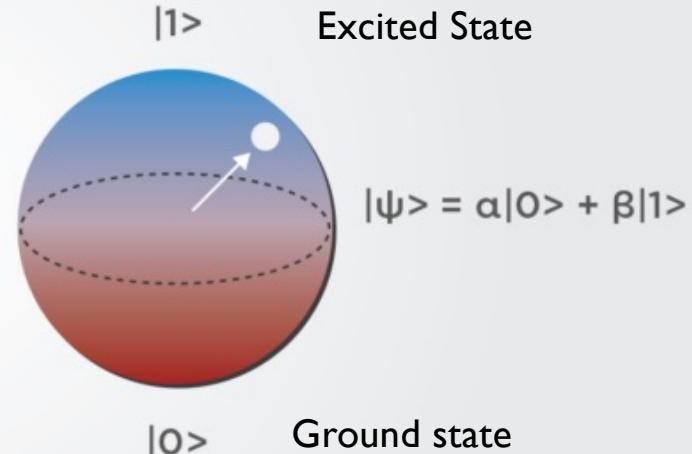
$|0\rangle$ = Ket Notation to represent the Qubit.

$$|0\rangle = \begin{pmatrix} 1 \\ 0 \end{pmatrix} |1\rangle = \begin{pmatrix} 0 \\ 1 \end{pmatrix}$$

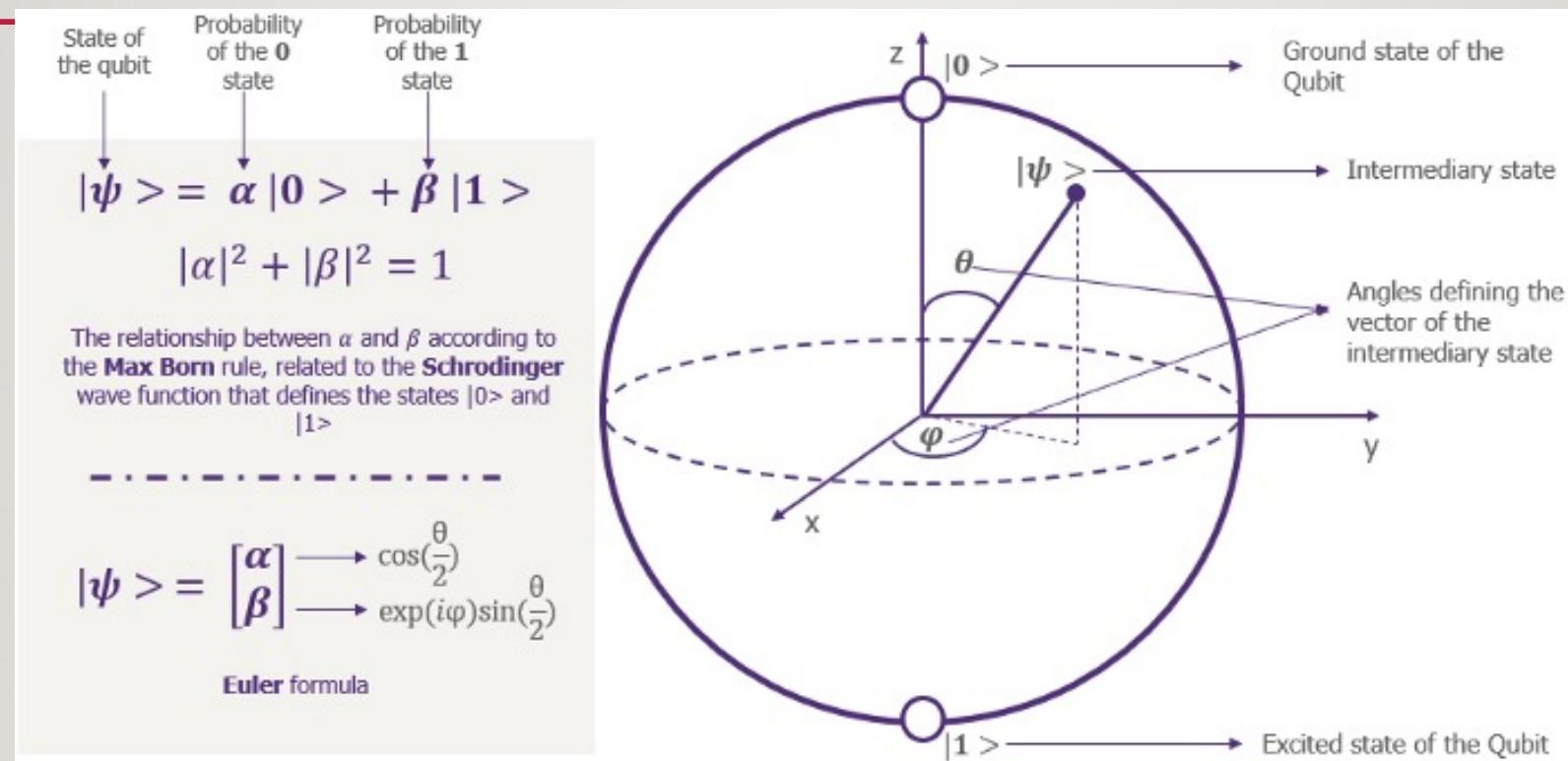
Classical Bits



Qubit



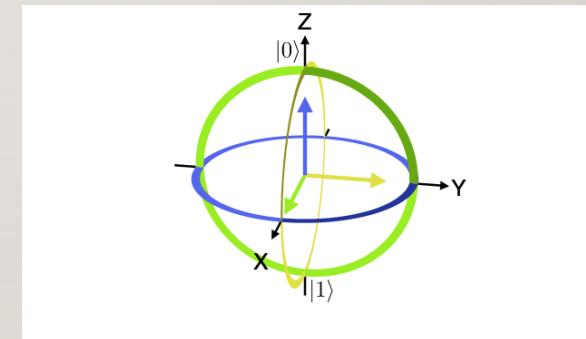
QUANTUM QUBIT IN BLOCH SPHERE



BASICS OF QUANTUM COMPUTING

- State Vector Representation of Qubit
 - state of a physical system in quantum mechanics is represented by **a vector belonging to a complex vector space**. This vector is known as the state space of the system.
 - Such a physical state of a **quantum system** is represented by a symbol $| \rangle$, known as a **ket**.

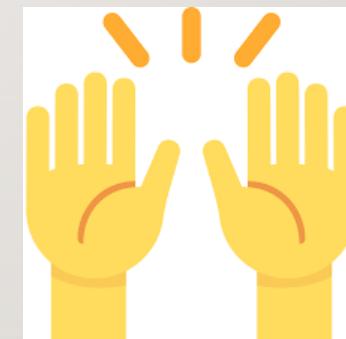
$$|0\rangle = \begin{pmatrix} 1 \\ 0 \end{pmatrix} |1\rangle = \begin{pmatrix} 0 \\ 1 \end{pmatrix}$$



BASICS OF QUANTUM COMPUTING

- **Quantum Entanglement**

- If two qubits are in quantum entanglement then if one qubit value is observed other qubit value is automatically identified.
- i.e you have two gloves in a box
 - If you take out left hand glove
 - You are sure and know that the other glove is right hand one!
- CNOT Gate is used for quantum entanglement



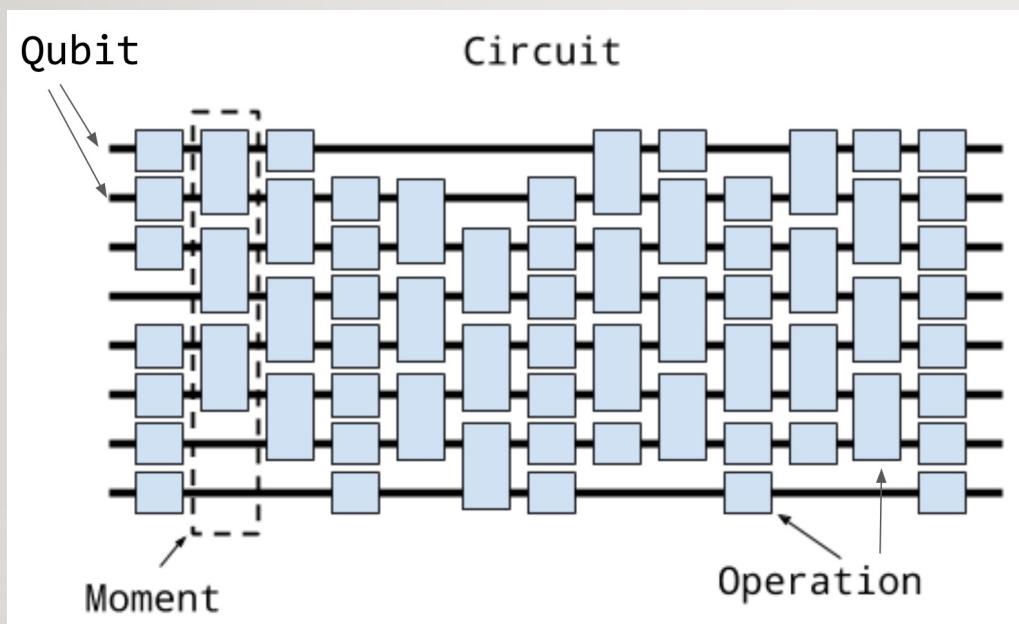
PRACTICAL-I

- Please open the file - **Quantum ML Workshop - Intro to Cirq - I.ipynb** in Google COLAB.
- Download the above file from Github Link:
<https://github.com/prasannavj/QuantumMachineLearning>
- Google COLAB:
 - Search for Google COLAB
 - Click on the result
 - File -> Upload Notebook

REPRESENTING QUBIT IN CIRQ

- 3 type of Qubits
 - Named Qubit
 - `cirq.NamedQubit('target')`
 - Line Qubit
 - `cirq.LineQubit.range(2)`
 - Grid Qubit
 - `cirq.GridQubit(4, 5)`

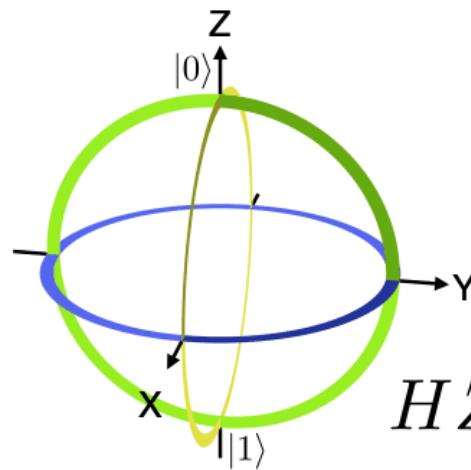
QUBITS, OPERATIONS, MOMENTS AND CIRCUITS



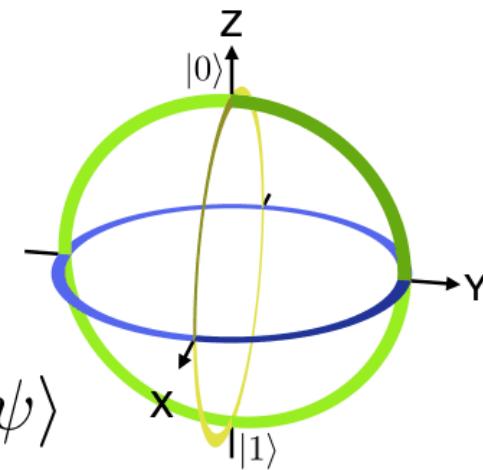
- A **Circuit** is a collection of **Moments**.
- A **Moment** is a collection of **Operations** that all act during the same abstract time slice.
- An **Operation** is an effect that operates on a specific subset of **Qubits**.
 - The most common type of Operation is a Gate applied to several qubits (a "GateOperation").

SAMPLE CIRCUIT FLOW

$$-\boxed{H} - \boxed{Z} - \boxed{H} - = -\boxed{X}-$$



=



$$HZH |\psi\rangle = X |\psi\rangle$$

GATES AND OPERATIONS

- Gates Introduction
 - CNOT gate – to Entangle two qubits.
 - `cirq.CNOT`
 - Hadamar Gate - Take the qubit to the superposition.
 - `Cirq.H`
 - X Gate – to rotate the X axis
 - `Cirq.X`
 - Y gate – to rotate on Y axis
 - `Cirq.Y`
 - Z Gate – to rorate on Z axis
 - `Cirq.Z`

GATES AND OPERATIONS

- Operations
 - Square Root calculation
 - `cirq.X**0.5`
 - Perform Square calculation
 - `cirq.YPowGate(exponent=0.25)`

CIRCUIT AND SIMULATION

- Create circuit
 - `circuit = cirq.Circuit()`
 - `circuit.append()`
- Simulating the result
 - `cirq.Simulator()`
 - `simulator.run()`

ADVANCED SIMULATOR

- Qsim – Quantum simulator – dedicated advanced simulator python open source library for the simulation of the quantum computing
 - !pip install qsimcirq
 - qsimcirq.QSimSimulator()
 - qsim_simulator.simulate(circuit)

PRACTICAL-2

- Please open the file - **Quantum ML Workshop - Advanced Cirq - 2.ipynb** in Google COLAB.
- Download the above file from Github Link:
<https://github.com/prasannavj/QuantumMachineLearning>
- Google COLAB:
 - Search for Google COLAB
 - Click on the result
 - File -> Upload Notebook

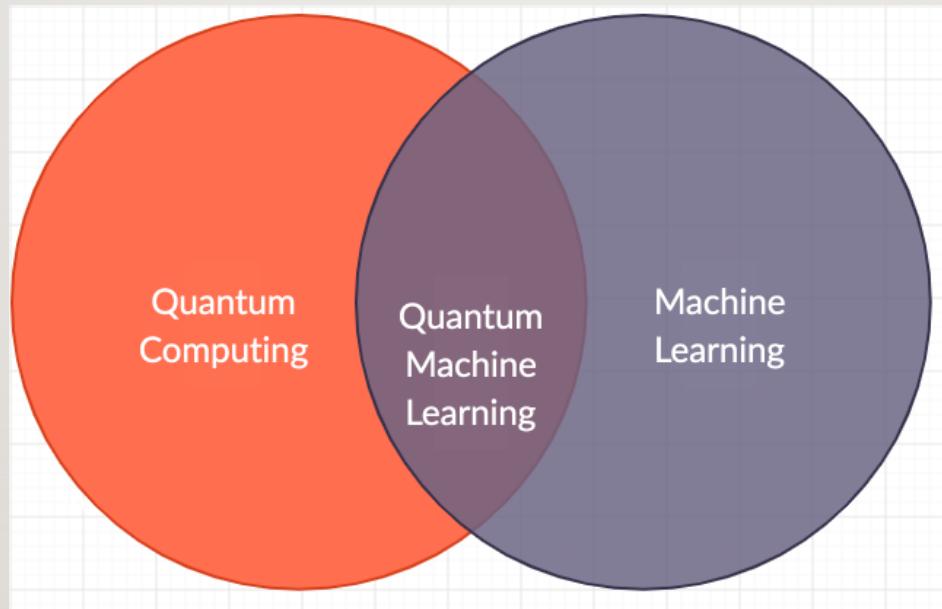
ADVANCED CIRCUITS AND OPERATIONS

- Creating custom gates
 - Python class inherit the details from `cirq.Gate`
 - Define Number of Qubit details.
 - Define Unitary Matrix details
 - Define Circuit diagram information
- Importing and exporting the circuits
 - `cirq.to_json`
 - `cirq.read_json`

INTERACTING WITH THE QUANTUM DEVICE

- Importing device access details
 - `cirq_google.Sycamore` – to get the Sycamore device for our execution.
 - `cirq_google.Sycamore.metadata.gate_durations` – to get duration of an operations
 - `cirq_google.Sycamore.validate_operation`
 - Quantum devices has many device restrictions and the `validate_operation` used to validate whether these operations are valid or not before executing.
 - One of the basic validation is Operation on non-adjacent qubits will raise an error.

QUANTUM MACHINE LEARNING



GOOGLE TENSORFLOW QUANTUM

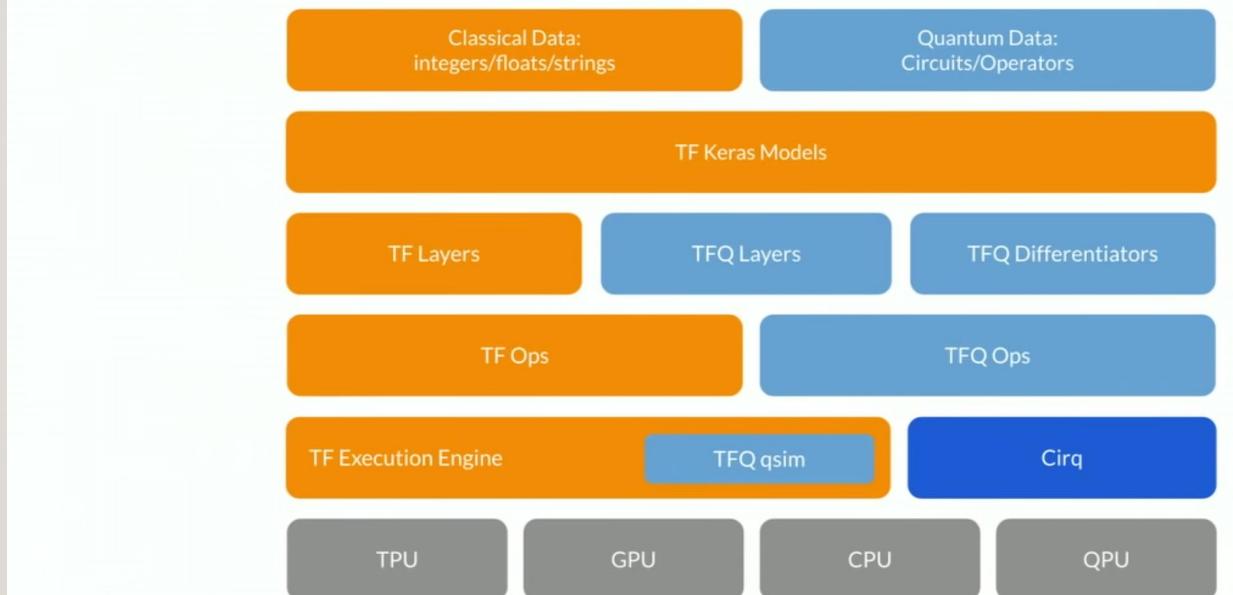
- Quantum machine learning library from google
- Open source library
- Released in 2020
- In collaboration with Univ of Waterloo and Voswaggon team
- TensorflowQuantum(TFQ)
- Under the hood “Cirq” integrates “Tensorflow”

UNDERSTAND TENSORFLOW QUANTUM(TFQ)

- Quantum Data
 - *Quantum data* exhibits superposition and entanglement, leading to joint probability distributions that could require an exponential amount of classical computational resources to represent or store.
- Hybrid Quantum classical models
 - Tensorflow extended to support the quantum hybrid quantum classical algorithms

TENSORFLOW QUANTUM

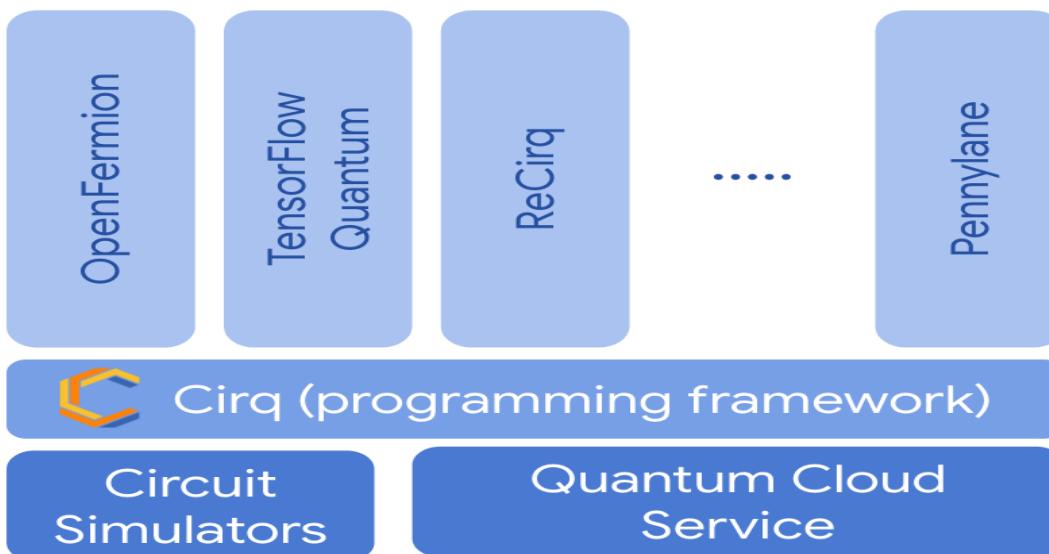
Software stack



prasannavj@gmail.com

TENSORFLOW QUANTUM

Research
libraries &
Tools



SUPPORTED QUANTUM CLOUD SERVICES

Company	Type of Quantum Computer
<u>Alpine Quantum Technologies</u>	Trapped ions
<u>IonQ</u>	Trapped ions
<u>Microsoft Azure Quantum</u>	Trapped ions (Honeywell and IonQ)
<u>Pasqal</u>	Neutral atoms
<u>Rigetti</u>	Superconducting qubits

prasannavj@gmail.com

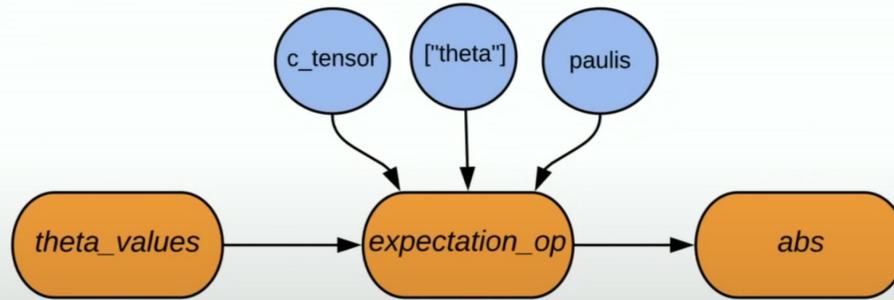
TENSORFLOW QUANTUM – DESIGN PRINCIPLES

1. **Differentiability:** Must support differentiation of quantum circuits and hybrid backpropagation.
2. **Circuit Batching:** Quantum data loaded as quantum circuits, training over many different quantum circuits in parallel.
3. **Execution Backend Agnostic:** Switch from a simulator to a real device easily with few changes.
4. **Minimalism:** A bridge between Cirq and TF; does not require users to re-learn how interface with quantum computers or solve problems using machine learning.

TENSORFLOW QUANTUM

Software architecture

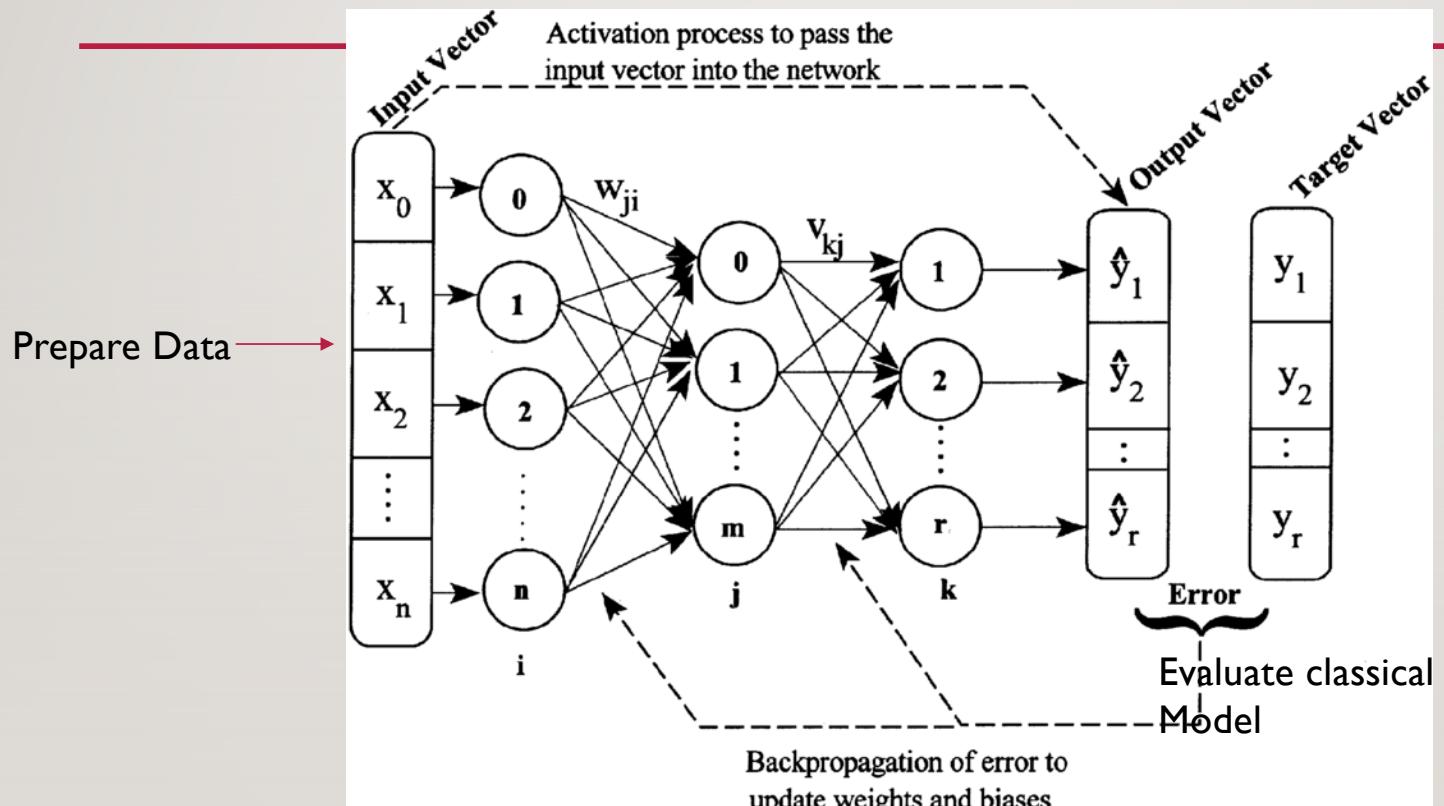
- Circuits are **TENSORS**, use Cirq constructs to generate these tensors
- Converting circuits to classical data (aka running or simulating them) can be done by **OPs**



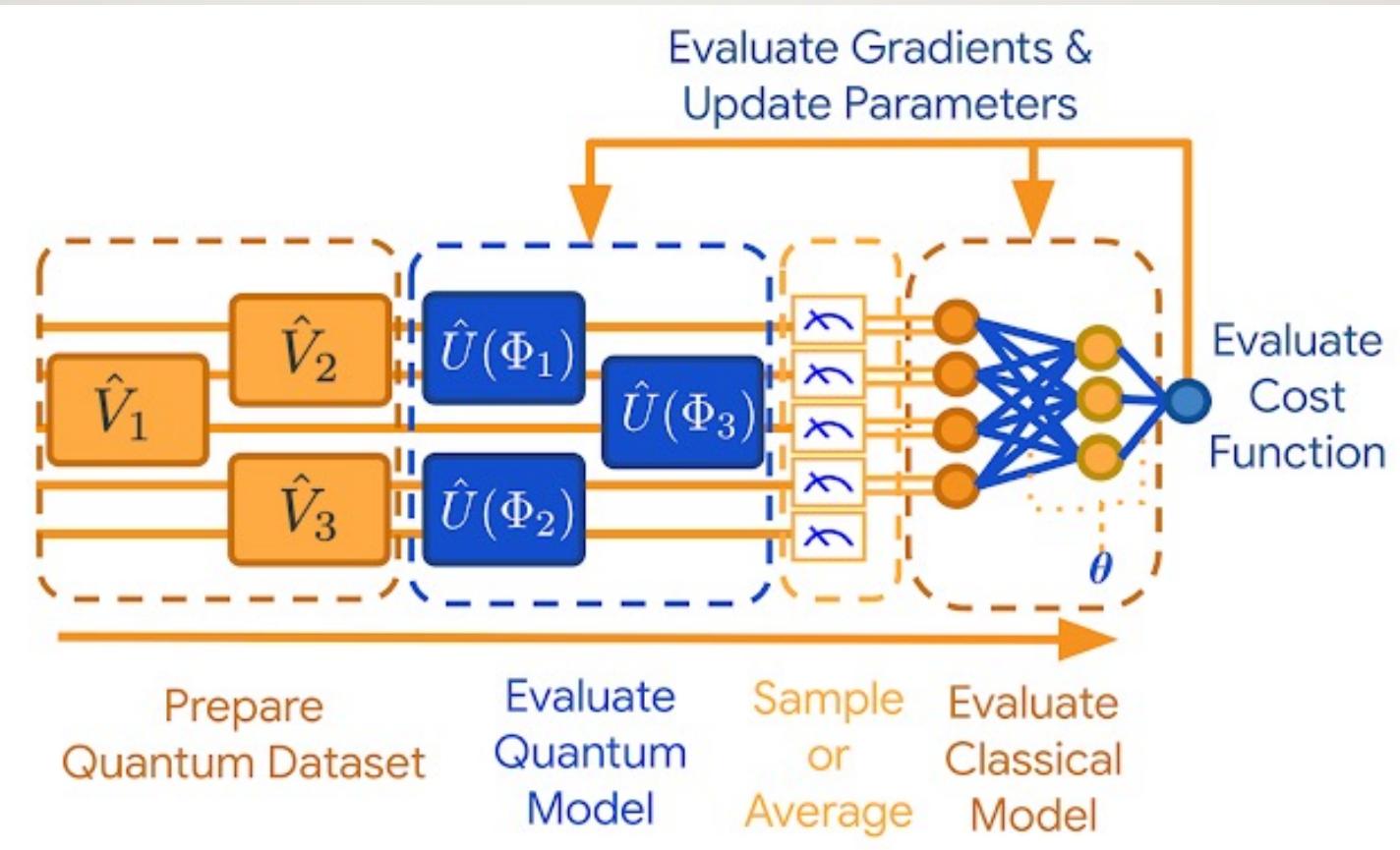
PRACTICAL-3

- Please open the file - **Quantum ML Workshop - Quantum Machine Learning Basics - 3.ipynb** in Google COLAB.
- Download the above file from Github Link:
<https://github.com/prasannavj/QuantumMachineLearning>
- Google COLAB:
 - Search for Google COLAB
 - Click on the result
 - File -> Upload Notebook

TYPICAL NEURAL NETWORK

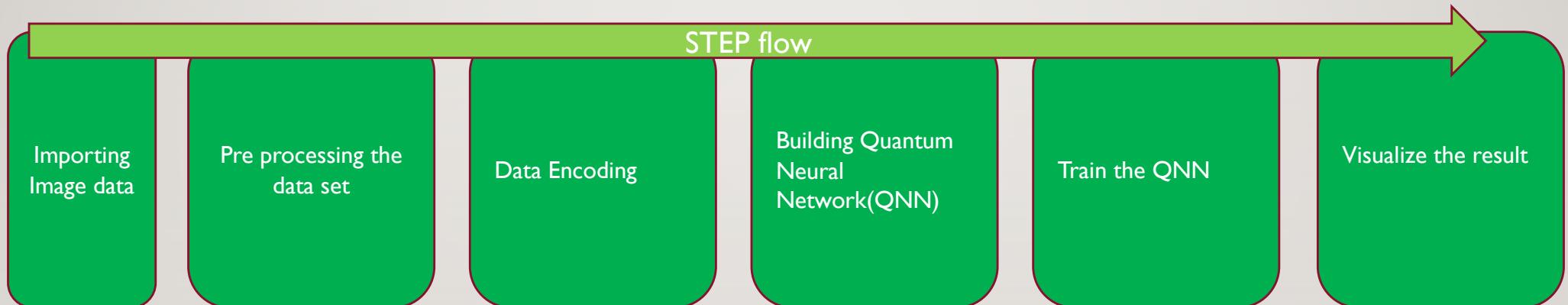


USING TENSORFLOW QUANTUM



HYBRID QUANTUM MACHINE LEARNING APPROACH

- Image Classification on Fashion MNIST with TensorFlow-Quantum and Cirq



SYMPY AND CIRQ

- SYMPY – Symbolic parameters to the circuit can be added using the SYMPY library
- SVGCircuit - for better visual representation of the Circuits (A Custom Circuit Visualizer)
- QNN – Quantum Neural Network
- Cirq.xx – tensor product of two x gate
- Cirq.yy – tensor product of two y gate

PRACTICALS - 4

- Please Download the file from GitHub Repo:
 - <https://github.com/prasannayj/QuantumMachineLearning>
- Quantum ML Workshop - Quantum Machine Learning Advanced - 4 -
Image_Classification_on_Fashion_MNIST_with_TensorFlow_Quantum_and_Cirq.ipynb

GOOGLE QUANTUM SUMMER SYMPOSIUM

- 19-22-Jul – Register for Free –
- <https://eventsonair.withgoogle.com/events/qss-2022>

prasannavj@gmail.com