# Implementation of the Grover algorithm on IBM NISQ platform 

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#### Abstract

Since the development of quantum information theory, the hopes are to have a device that outperforms present-day classical computers. That might happen due to the quantum properties that classical bits do not have. This thesis will cover Grover's search algorithm that retrieves information from an $N$ size unsorted data set with a number of iterations of order $O(\sqrt{N})$ while classically achieving it in a number of iterations of order $O(N)$ iterations which is more time-consuming. Current quantum processors are imperfect by being vulnerable to noise, so the other part will discuss the physical realization of quantum technologies, particularly superconducting transmon qubits, and how they are built and controlled. The work aims to build quantum circuits that perform Grover's algorithm and then run it on the Qiskit interface to see how it works and then on IBM quantum processors to see how noise affects the results. One circuit will outperform the other. Thus, the composition of the circuit plays a significant role. Also, some IBM processors will perform better than others. Finally, the good results will be subjected to error mitigation methods to improve the results.


## Contents

1 Classical vs Quantum information ..... 2
2 Grover's algorithm ..... 3
2.1 Circuit description ..... 5
2.1.1 Phase Oracle ..... 6
2.1.2 Diffuser ..... 7
2.1.3 Number of iterations ..... 8
2.2 Graphical representation ..... 10
2.3 Results ..... 11
3 State of the art on Quantum devices ..... 12
3.1 IBM superconducting qubits ..... 13
3.1.1 Physical components ..... 13
3.1.2 Qubit control ..... 16
3.2 Error Models ..... 19
3.3 IBM Calibration ..... 21
3.4 Error mitigation ..... 22
3.5 Results ..... 23
4 Discussion ..... 27
5 Conclusion ..... 28
References ..... 30
A Basics of Quantum Information ..... 33
A. 1 Qubit ..... 33
A. 2 Nubits ..... 34
A. 3 Operators ..... 34
A.3.1 Single qubit gates ..... 34
A.3.2 Multi qubit gates ..... 35
B Multi number of solution Grover's Algorithm ..... 37
C Code ..... 38
C. 1 Preparation ..... 38
C. 2 Circuit number 1 ..... 38
C.2.1 Phase Oracle ..... 38
C.2.2 Diffuser ..... 39
C.2.3 Total circuit ..... 41
C. 3 Circuit number 2 ..... 41
C.3.1 Phase Oracle ..... 41
C.3.2 Diffuser ..... 43
C.3.3 Total circuit ..... 44
C. 4 Get the results ..... 45
C.4.1 Qiskit interface ..... 45
C.4.2 IBM cloud ..... 45

## Introduction

Quantum computing employs the ideas of quantum mechanics and information theory to address issues that are difficult or impossible to solve with today's computers. Quantum computing performs data operations by utilizing quantum phenomena such as quantum bits, superposition, and entanglement.

Grover's algorithm [1], commonly known as the quantum search algorithm, is a quantum method for searching an unstructured data set using fewer iteration steps than classical algorithms to locate the unique input to a black box function (Oracle) by amplifying its probability of being measured. Recently this algorithm was implemented by researchers on different quantum machines.

Researchers dedicated time to explaining the algorithm; they developed ways (circuits) that implement the theory [2, 3, 4]. However, few relate their work to the physical system (qubits) that performs this algorithm, such as the source of errors that appear in their results, and fewer try to implement an error correction model to the algorithm to get better results which should rely on the type and the distribution of errors, this makes going to a higher number of qubits infeasible.

This thesis will cover the theory of Grover's algorithm and its implementation on IBM devices, then a general view of how those IBM devices work and how noise arises there. We will be studying two Grover circuits by running them on the Qiskit interface and then on different devices on the IBM cloud, then comparing the circuits on one hand and the IBM devices on the other.

This work will be an introduction for those who want to work in the field of quantum computing in particular on the IBM cloud; this may enable future work in quantum error correction codes or applications of Grover's algorithm in real-life problems.

The number of qubits in this study is not enough to be superior to classical search algorithms, and the study is restricted to circuit model quantum computers, specifically the superconducting qubits.

The thesis will be divided as follows; the first section will be comparing in general classical and quantum computers, then in the second section, there will be a description of the function of Grover's algorithm and the building of Grover circuits and
ends by showing the result of implementing them in an ideal quantum computer on the Qiskit interface. The third section will discuss the physical components of IBM transmon qubits, how they function, and how to control them, then it will discuss some of the noise sources and the errors resulting from them. By the end of that section, the results of implementing both circuits -each on two different devices- will be shown and discussed. Finally, there will be a conclusion summarizing the work and giving prospects for this study.

## 1 Classical vs Quantum information

The computer has become a part of our daily life that facilitates it; it is a programmable device that stores, retrieves, and processes data. Computers have proven capable of solving many problems, including global communication, international commerce, the internet, and breakthrough in sciences such as medicine and aerospace engineering and reaching artificial neural networks. A computer consists of numerous building blocks (bits); an electric transistor can represent a bit. A bit holds binary information $(0,1)$ in the form of two electrical current states on and off. It is possible to use transistors for more than to turn the electrical current on and off and to allow for different levels of current. Why do not we see electronic computers were ternary [5], three states, or more states. It is impossible to go to these levels because the more intermediate states there are, the harder it is to keep them all distinguishable due to the noise at low energy levels or from the environment.

Boolean algebra's mathematical branch deals with these states and sets the necessary operations (gates) for manipulating them. In 1948 Claude Shannon constructed the information theory [6] that underlies digital communications, compression, and information storage. He also was one of the pioneers to digitalize Boolean algebra into an electrical circuit.

Quantum mechanics revolutionized physics and changed our view about the physical world being fundamentally probabilistic rather than deterministic. This theory states that very small or cold systems have wave properties, so they can be found simultaneously in two independent (orthogonal) states until they are measured, caus-
ing them to collapse into an individual state.
Quantum mechanics and information theory combined resulted in a new field called quantum information theory. If it is realized physically in a quantum computer, this device will be superior to a classical computer in some tasks. While a classical bit can hold binary information $(0,1)$, a quantum bit (qubit) can be in a superposition of $|0\rangle$ and $|1\rangle$ and generally represented as

$$
\begin{equation*}
\mid \text { qubit }\rangle=\cos (\theta / 2)|0\rangle+e^{i \Phi} \sin (\theta / 2)|1\rangle \tag{1}
\end{equation*}
$$

More explanation can be found in Appendix A.1, [7] introduces quantum information and quantum computing.

The power of a quantum computer develops exponentially with the number of interacting qubits, while the power of a traditional computer grows linearly with the number of transistors. This superiority is one of the reasons why quantum computers may someday outperform traditional computers in certain types of calculations.

## 2 Grover's algorithm

Search Algorithms are intended to look for and recover an element from any structured data set in which it is stored. Classically, search algorithms were developed, such as Linear Search, where each element is checked (sorted or unsorted data sets) until the desired one is found; this algorithm takes an $N / 2$ average number of iterations to get the result, where $N$ is the number of data elements. Binary Search is a search algorithm that works on sorted data sets, and it goes by getting the average of the first and last element and then taking the interval that contains the wanted data; this algorithm takes the order $\log (N)$ number of steps.

A Quantum search algorithm is a protocol that enables one to get specific data in an unorganized data set. In the quantum realm, taking advantage of quantum parallelism, the algorithm can be performed with less number of iterations -less complexity than classical algorithms- using the superposition and entanglement properties of quantum states.

Let $N=2^{n}$ be the number of possible permutations of $n$ qubit states.

This protocol can be performed in $O(\sqrt{N})$ iterations to get the most probability of measuring the intended result. It seems that Binary Search with complexity $O(\log N)$ is faster than Grover's algorithm with complexity $O(\sqrt{N})$, but we forgot that Binary search works only for sorted data sets, and it needs $O(N * \log (N))$ to sort a data set.
The data set is is defined as a Hilbert space $\mathcal{H}^{\otimes N}$ with an orthonormal basis set $\mathrm{B}=\left\{|x\rangle=\bigotimes_{i}\left|q_{i}\right\rangle| | q_{i}\right\rangle=0$ or 1$\}$.
$f(x): \mathcal{H}^{\otimes N} \rightarrow \mathcal{H}^{\otimes N}$ is a function such that

$$
f(x)= \begin{cases}0 & x \neq x_{\text {sol }}  \tag{2}\\ 1 & x=x_{\text {sol }}\end{cases}
$$

where $x_{\text {sol }}$ is the element wanted in the data set.

## Preparation step

First let us prepare the total state of qubits in $|s\rangle=|++\ldots+\rangle=|+\rangle^{\otimes n}$.
Let us initialize $n$ qubits to $|0\rangle^{\otimes n}$ state and then apply a Hadamard gate $H^{\otimes n}$ to get $|+\rangle^{\otimes n}$ where the total state is a superposition of $2^{n}$ possible states (compare Appendix A.3).

$$
\begin{equation*}
|s\rangle=|+\rangle^{\otimes n}=\frac{1}{\sqrt{2^{n}}} \sum_{2^{n}}|x\rangle \tag{3}
\end{equation*}
$$

where $|x\rangle \in \mathrm{B}$.
This vector can be decomposed into two basis vectors $|\omega\rangle \equiv\left|x_{\text {sol }}\right\rangle$, the solution searched for, and $\left|s^{\prime}\right\rangle \equiv\left|x_{\text {sol }}^{\perp}\right\rangle$, the combination of the rest of the states (vectors), which is orthogonal to the solution.

$$
\begin{gather*}
|s\rangle=\cos (\theta / 2)\left|s^{\prime}\right\rangle+\sin (\theta / 2)|\omega\rangle  \tag{4}\\
|s\rangle=\frac{1}{\sqrt{N}} \sum_{N}|x\rangle=\frac{1}{\sqrt{N}} \sum_{x \neq \omega}|x\rangle+\frac{1}{\sqrt{N}}|\omega\rangle  \tag{5}\\
|s\rangle=\sqrt{\frac{N-1}{N}} \frac{1}{\sqrt{N-1}} \sum_{x \neq \omega}|x\rangle+\frac{1}{\sqrt{N}}|\omega\rangle=\sqrt{\frac{N-1}{N}}\left|s^{\prime}\right\rangle+\frac{1}{\sqrt{N}}|\omega\rangle \tag{6}
\end{gather*}
$$

The basis chosen is orthonormal. Targeted and the combination of the rest of the
states are the vertical and horizontal vectors, respectively, in Figure 1.
Grover's algorithm is a two-step protocol that is repeated (number of times de-


Figure 1: Geometrical representation of Grover's algorithm
pending on the number of qubits) until we reach the solution $|\omega\rangle$.

## First step

Reflect the initial state $|s\rangle$ about $\left|s^{\prime}\right\rangle$, and this is step denoted by $U_{f}$ and called 'Phase Oracle' since it adds a minus sign (phase) to the $|\omega\rangle$ component.

$$
\begin{equation*}
U_{f}|s\rangle=\cos (\theta / 2)\left|s^{\prime}\right\rangle+e^{i \pi} \sin (\theta / 2)|\omega\rangle=\cos (\theta / 2)\left|s^{\prime}\right\rangle-\sin (\theta / 2)|\omega\rangle \tag{7}
\end{equation*}
$$

## Second step

Reflect the resulting vector $U_{f}|s\rangle$ about the initial vector $|s\rangle$. This transformation is denoted by V and called 'Diffuser'.

## Outcome

The resulting state appears nearer to the solution than the initial state.

### 2.1 Circuit description

This section will describe two different circuits that will do the job described. Let us apply the previously explained steps $U_{f}$ in section 2.1.1 and V in section 2.1.2 in each quantum circuit.

### 2.1.1 Phase Oracle

The first step of Grover's algorithm targets a specific state of the qubits, so we need some multi-control gates to achieve this (compare Appendix A.3.2).

We can formulate $U_{f}$ simply as,

$$
\begin{equation*}
U_{f}=\mathbb{1}-2|\omega\rangle\langle\omega| \tag{8}
\end{equation*}
$$



## Circuit \# 1

In this circuit, the qubits will be classified into three categories

- Control qubits: $n$ qubits that hold the information of the data set (superposition of $2^{n}$ states as in equation (3).
- The target qubit is the last qubit in the circuit shown, and it is responsible for carrying the phase of the state.
- The ancilla qubit is the qubit that we do not care about its final form, but it helps to perform multi-control gates.

Add a target qubit that is prepared in $|-\rangle$, such that if a multi-control gate is applied to this qubit, a minus sign (phase) appears. $X|-\rangle=\frac{|1\rangle-|0\rangle}{\sqrt{2}}=-|-\rangle$ and because



The Toffoli gate activates (flips the target) on $|11\rangle$, however in the circuit before, the addition of an X gate prior to the Toffoli gate made it activates on $\left|q_{0} q_{1}\right\rangle=|01\rangle$. So using the Toffoli and $X$ gate, we can build oracles that any specific state can
activate, and the property of $|-\rangle$ adds a phase to a specific state.
Here, we will present an example of targeting a particular state


In our particular case, we construct an oracle that adds a phase to $q_{4}$ at $\left|q_{0} q_{1} q_{2}\right\rangle=$ $|101\rangle$, where $q_{3}$ is an ancilla qubit that helps to perform a three control gate that is not defined by qiskit. Check Appendix C.2.1 for its code.

## Circuit \# 2

In this circuit, the same idea of applying a NOT gate on the qubit is wanted to be $|0\rangle$. However, instead of having extra qubits (ancilla and target qubits), the targeted state is between the data set qubits (it does not matter which) followed and preceded by a Hadamard gate controlled by the other qubits.


This oracle, for example, targets $|110\rangle$ to invert it. The result measured will be viewed inverted in the form of $\left|q_{2} q_{1} q_{0}\right\rangle$ in general. Check Appendix C.3.1 for its code.

### 2.1.2 Diffuser

In this phase, all the states targeted to be flipped about the initial state $|s\rangle$, as shown in Figure 1.

Let $U_{f 0}=2|0\rangle^{\otimes n}\left\langle\left. 0\right|^{\otimes n}-\mathbb{1}\right.$

$$
\begin{equation*}
V=H^{\otimes n} U_{f 0} H^{\otimes n}=2|+\rangle^{\otimes n}\left\langle+\left.\right|^{\otimes n}-\mathbb{1}=2 \mid s\right\rangle\langle s|-\mathbb{1} \tag{9}
\end{equation*}
$$

This oracle reflects the given state about $|s\rangle$.
A straightforward application of the gates $H^{\otimes n} U_{f 0} H^{\otimes n}$, where $U_{f 0}$ is simply $U_{f}$ from section 2.1.1 targeting $|000\rangle$ state.

## Circuit \# 1

This oracle looks like Circuit \# 1 of section 2.1.1 targeting $|000\rangle$ with a Hadamard gate on each control qubit before and after $U_{f 0}$


Check Appendix C.2.2 for its code.

## Circuit \# 2

This oracle looks like Circuit \# 2 of section 2.1.1 targeting $|000\rangle$ also with a Hadamard gate on each control qubit before and after $U_{f 0}$


Check Appendix C.3.2 for its code.

### 2.1.3 Number of iterations

Circuits \# 1 of sections 2.1.1 and 2.1.2 and Circuits \# 2 of sections 2.1.1 and 2.1.2 should be performed repeatedly to get the desired result. However, is there a limit to the number of times we should do them? Alternatively, as we do it more, and more we approach the result.

The algorithm should should be repeated multiple times. If this was not respected, then the measurement results will not be as wanted.

Lemma 1. The number of iterations to complete the Grover algorithm is of order $O(\sqrt{N})$. [4]

Proof.

$$
\begin{gather*}
V U_{f}|s\rangle=\cos (3 \theta / 2)\left|s^{\prime}\right\rangle+\sin (3 \theta / 2)|\omega\rangle  \tag{10}\\
V U_{f}|s\rangle=\cos (\theta+\theta / 2)\left|s^{\prime}\right\rangle+\sin (\theta+\theta / 2)|\omega\rangle  \tag{11}\\
\left(V U_{f}\right)^{r}|s\rangle=\cos (r \theta+\theta / 2)\left|s^{\prime}\right\rangle+\sin (r \theta+\theta / 2)|\omega\rangle \tag{12}
\end{gather*}
$$

if $\left(V U_{f}\right)^{r}|s\rangle=|\omega\rangle$, then $r \theta+\theta / 2=\pi / 2$ so $r=\pi / 2 \theta-1 / 2$. Knowing that $\theta=$ $\arcsin (1 / \sqrt{N}) \simeq 1 / \sqrt{N}$ then $r=\pi \sqrt{N} / 2-1 / 2 \simeq O(\sqrt{N})$

For three qubits, the algorithm is repeated twice.
Now let us combine everything explained before into a circuit for each case. We get

## Circuit \# 1

Put the Phase oracle and the Diffuser oracle in sequence and repeat that twice, as mentioned after the proof. After preparing ' $q_{0}, q_{1}, q_{2}$ ' in $|+++\rangle$ with Hadamard gates, and ' $q_{4}$ ' the target qubit in $|-\rangle$. Let them pass along ' $q_{3}$ ' the ancilla qubit through the circuit. Furthermore, measure the results at the end.


Check Appendix C.2.3 for its code.

## Circuit \# 2

The same is done for this circuit. But without using ancilla qubit or an extra target qubit since it is one of the qubits representing the input data (data set). Then the results are measured.


Check Appendix C.3.3 for its code.
This algorithm is not exact; there appears to be an angle gap between the wanted state and the actual final state with a maximum value $\theta \ll 1$. This angle represents the probability of not observing the wanted state after applying the algorithm or the error. The probability of that happening is

$$
\begin{equation*}
p_{\text {error }}=\sin ^{2}(\theta) \simeq \theta^{2}=\frac{1}{N} \tag{13}
\end{equation*}
$$

### 2.2 Graphical representation

Another way to look at this algorithm is to visualize it as a reflection of the states' mean.

(a) All states have equal amplitude when we apply the Hadamard gates to initial zero states

(b) After $U_{f}$ is applied, $|\omega\rangle$ is the inverted state, so the mean of the whole state decreases by a bit.

(c) After applying the Diffuser oracle, all the states are flipped around the mean

Figure 2: The X-axis represents the $N$ states of $n$ qubits; the Y-axis represents the probability of each state, taken from [4]

We can observe that we have $|\omega\rangle$ with a higher probability than other states.

### 2.3 Results

After discussing some protocols in this chapter, let us see if we can implement them on the Qiskit interface and then on IBM freely accessible devices. Let us present some of our results; we got the following results that will be explained, compared, and interpreted.

(a) $|010\rangle$ targeted. X -axis represents the (b) $|011\rangle$ targeted. X -axis represents the states measured
states measured

(c) Measuring the number of counts of each state while changing the target state

Figure 3: Performing both of the protocols on Qiskit interface

In Figures 3a and 3b, we target $|010\rangle$ and $|011\rangle$, respectively. As expected for a single solution algorithm, in ideal conditions of a quantum computer, the targeted state will appear with a probability near 1, and we can observe the algorithm's error in equation 13 . We can also observe some small probabilities in other states than the targeted ones in Figures 3a and 3b, that is because of the angle gap expressed in equation 13 . In Figure 3c, we target each state arranged on the vertical axis,
then measure the number of occurrences and display the probabilities of each state on the horizontal axis beside the targeted state. The color intensity represents the probability (represented on the color bar). As predicted, the color map should have a diagonal line indicating the wanted state's high destructibility.

## 3 State of the art on Quantum devices

Quantum computing is usually viewed as a single entity. However, there are several techniques for converting various quantum systems into quantum computers within the domain of quantum computing. There also exist different approaches to manipulating a system of qubits. The circuit model is a common way to get the qubits to reach a wanted state; it is performed by applying a series of unitary gates. The measurement-based model is a particular case of 'quantum circuits happens with intermediary measurements'. One first prepares an entangled resource state then performs single qubit measurements on it of form $M_{X Y}(\theta)=\cos (\theta) X-\sin (\theta) Y$, where $\theta$ determines the basis of measurement. This measurement depends on the measurement of the previous qubit; the adiabatic model is motivated by quantum many-body theory, where a set of qubits are prepared and then subjected to a specific Hamiltonian so the system evolves adiabatically to a state that describes the solution to the problem; there are other models such as topological quantum computing and others. On the other side, the quantum computer can be realized in several quantum systems, such as superconducting transmon qubits that depend on a charge oscillating between two superconducting metals tunneling through a Josephson junction [8, (9, 10]. Trapped ions quantum systems are another kind of implementation of qubits; the system is a line of ions that are cooled in magnetooptical traps using lasers; the ion is controlled by a laser and transitions between two hyperfine components or Zeeman sublevels of the ground state [11, 12]. Photons are quantum systems that can represent a qubit [13]; photonic qubits depend on photon pulses controlled by optical devices such as beam splitters and phase shifters, and the readout can be through photon counters; this system can work at room temperature. Other systems can be mentioned, such as Magnetic Flux qubits that depend
on the direction of the magnetic field induced by a superconducting loop of wire; Quantum Dots can also represent a qubit where electrons are restricted to a small area in the material, and its state depends on the spin or the charge there.

### 3.1 IBM superconducting qubits

For their quantum processors, IBM developed superconducting qubits, also known as transmon qubits. Some processors can exceed a hundred qubits and are accessible via the IBM-Quantum cloud [14]. A transmon qubit is a microwave resonator that stores specific frequencies of electromagnetic waves, the energy of the qubit is confined between the ground state $|0\rangle$ and the first excited state $|1\rangle$. In this section, we will dive into the technology behind these qubits and explain the choice of anharmonic oscillators over harmonic oscillators solved exactly by quantum mechanics. Understanding that will help to identify the noise sources, that in turn helps to figure out the most efficient error correction model for the case we are studying.

### 3.1.1 Physical components

Let us first talk briefly about the superconductivity phenomenon [15]. As the temperature of a regular conductor decreases, the resistance lowers due to the fewer vibrations of the conductor's lattice but still resistants electrons, which is due to the impurity scattering between the electron and the lattice or electron-electron scattering at lower orders. This resistance carries away information about the electrons in the form of phonons, not allowing observing the resonator's quantum behavior. John Bardeen, Leon Cooper, and John Robert Schrieffer were awarded Nobel Prize in physics in 1972 for developing the microscopic theory of superconductivity (BCS theory) [16]. A superconducting material acts as a conductor at room temperature, but below some critical temperature, the electrons passing through the lattice deform it; this deformation attracts the electrons leading to a pairing of opposite spin electrons, called Cooper pairs. These pairs travel without any resistance in the lattice.

A transmon qubit is composed of two superconducting pads that are cooled down to millikelvins and connected by a bridge which is an inductor, as shown in Figure

4 An electric field is applied across the pads creating two (positive and negative) islands of charges, which induces an internal electric field and, as a voltage, the pads act as a capacitor that holds electric energy. If a charge passes (tunnels) from one island to another through the bridge, a magnetic field is formed around it, acting as an inductor of a circuit that holds magnetic energy. The system acts as an LC circuit where electromagnetic energy oscillates with specific frequencies. The derivations shown below in this chapter are presented in more detail in 10
When the system is in a classical regime, we can describe it through a Hamiltonian


Figure 4: False-colored optical microscope image of a transmon qubit reproduced from Ref. [17]

$$
\begin{equation*}
H=\frac{Q^{2}}{2 C}+\frac{\Phi^{2}}{2 L}=\frac{1}{2} \hbar \omega_{r}\left(\alpha^{*} \alpha+\alpha \alpha^{*}\right) \tag{14}
\end{equation*}
$$

$Q$ and $\Phi$ are two variables: the charge of a pad and the magnetic flux, respectively, and the systems $C$ and $L$ parameters are the capacitance and the inductance. $\alpha$ is introduced to simplify the description, such as

$$
\begin{equation*}
\alpha(t)=\sqrt{\frac{1}{2 \hbar \omega_{r} Z}}(\Phi(t)+i Z Q(t)) \tag{15}
\end{equation*}
$$

$Z=L / C$ is the impedance, and $\omega_{r}=1 /(L C)$ is the resonance frequency.
Going to quantum, we convert the variables to operators. $\alpha$ and $\alpha^{*}$ become $\hat{a}$ and $\hat{a}^{\dagger}$, respectively, which will be known as the lowering and raising operators, respectively. $\hat{a}|n\rangle=\sqrt{n}|n-1\rangle$ and $\hat{a}^{\dagger}|n\rangle=\sqrt{n+1}|n+1\rangle \Longrightarrow\langle n| \hat{a}^{\dagger} \hat{a}|n\rangle=n$ and

$$
\begin{equation*}
\hat{H}=\frac{1}{2} \hbar \omega_{r}\left(\hat{a}^{\dagger} \hat{a}+\hat{a} \hat{a}^{\dagger}\right) \tag{16}
\end{equation*}
$$

Here we dropped an additive constant since we measured the energy differences. $\hat{Q}=i Q_{Z P F}\left(\hat{a}^{\dagger}-\hat{a}\right)$ and $\hat{\Phi}=i \Phi_{Z P F}\left(\hat{a}^{\dagger}+\hat{a}\right)$, where $Q_{Z P F}$ and $\Phi_{Z P F}$ are the zeropoint fluctuations of the charge and phase variables respectively, these two constants can be viewed as the variance of the wave-function at the ground state.

This case is valid if the inductor bridge is linear, which results in a harmonic oscillator, as shown in Figure 5a, with equal distancing between the energy levels. That creates a problem in distinguishing the first two states from the rest. This problem pushed introducing anharmonicity through a non-linear bridge or a Josephson junction. A Josephson junction consists of two superconducting pieces separated by an insulator, shown in Figure [6, through which the cooper pairs tunnel [18]. This process results in a Hamiltonian as the following

$$
\begin{equation*}
\hat{H}=\frac{\hat{Q}^{2}}{2 C}-E_{J} \cos \left(\frac{\hat{\phi}}{\phi_{0}}\right) \tag{17}
\end{equation*}
$$

$E_{J}$ being the Josephson energy, $\hat{\phi} / \phi_{0}$ is the reduced magnetic flux with $\phi_{0}=\hbar / 2 e$. Applying Taylor expansion to the equation to the fourth order and rewrite the Hamiltonian in terms of the raising and lowering operators. We get

$$
\begin{equation*}
\hat{H} \simeq \frac{\hat{Q}^{2}}{2 C}+\frac{\hat{\phi}^{2}}{2 L_{J}}-\frac{E_{J}}{4!}\left(\frac{\hat{\phi}}{\phi_{0}}\right)^{4}=\hbar \omega_{r} \hat{a}^{\dagger} \hat{a}-\frac{E_{J} \Phi_{Z P F}^{4}}{4!}\left(\hat{a}+\hat{a}^{\dagger}\right)^{4} \tag{18}
\end{equation*}
$$

Where $\Phi_{Z P F}$ is the zero point fluctuation of $\hat{\Phi}$.
Classically, $\alpha$ from equation 15 evolves with time in phase space as $\alpha(t)=\alpha(0) e^{-i \omega_{0} t}$ in an oscillatory motion with frequency $\omega_{0}$. In the quantum case, the exact evolution of $\hat{a}$ within Heisenberg's picture as $\hat{a}(t)=\hat{a}(0) e^{-i \omega_{0} t}$ and $\hat{a}^{\dagger}(t)=\hat{a} \dagger(0) e^{i \omega_{0} t}$. Expanding equation 20 and using $\left[\hat{a}^{\dagger}, \hat{a}\right]=\mathbb{1}$, we get

$$
\begin{equation*}
H(t)=\sum_{i, n=m} c_{i} \hat{a}^{{ }^{n}}(t) \hat{a}^{m}(t)+\sum_{j, n \neq m} d_{j} \hat{a}^{\dagger^{n}}(t) \hat{a}^{m}(t)=\hat{H}_{0}+\hat{H}_{R}(t) \tag{19}
\end{equation*}
$$

$H_{0}$ is a stationary Hamiltonian where the exponentials cancel each other since $n=$ $m$, while $H_{R}(t)$ is a rotating Hamiltonian. Without going into calculation details and using the Rotating Wave Approximation[19], the rotating term is neglected,


Figure 5: Harmonic and anharmonic oscillators


Figure 6: Schematic diagram of a Josephson junction. 20]
and we get

$$
\begin{equation*}
\hat{H} \simeq \hbar \omega_{0} \hat{a}^{\dagger} \hat{a}-\frac{\hbar \alpha}{2} \hat{a}^{\dagger} \hat{a}\left(\hat{a}^{\dagger} \hat{a}-I\right) \tag{20}
\end{equation*}
$$

The first term is the linear term, and the second is the nonlinear term or the perturbation caused by the Josephson effect.

### 3.1.2 Qubit control

Controlling a qubit is possible by coupling it to an external control such as a microwave drive that detects photons in the form of Rabi oscillations Figure 7. The coupling between it and the qubit will provide a faster control on the qubit, but on the other hand, there is a higher probability of dissipating the qubit information in the form of radiative decay. While a weaker coupling reduces this dissipation, it makes it slower to control the qubit. The Josephson quantum filter can suppress this
decay by reflecting those photons to the qubit [9], but this will not be part of the discussion or calculations. The readout of the information of the qubit is performed through the circuit electrodynamics (cQED) dispersive monitoring technique; this involves coupling the qubit to a quantum LC oscillator. This cavity isolates the qubit from environmental noise and prevents it from leaking out information, and most importantly, it permits to performance of a non-destructive measurement on the qubit. The derivations shown below in this chapter were performed in more detail by 10


Figure 7: Schematic and circuit representation of the qubit and its control and readout

Let us first take the simplest possible circuit by putting the cavity aside. We end up having a drive coupled directly to the qubit; let us see the Hamiltonian of this system.

$$
\begin{equation*}
\hat{H}_{\text {drive }}=-i \Omega(t) / 2\left(\hat{c}^{\dagger}-\hat{c}\right) \tag{21}
\end{equation*}
$$

$\hat{H}_{\text {drive }}$ is the Hamiltonian of the drive with $\Omega(t)=\Omega_{0} \sin \left(\omega_{d} t+\theta_{d}\right)$, with $\omega_{d}$ being the frequency of the drive with phase $\theta_{d} \equiv \theta$. The total Hamiltonian of this system is

$$
\begin{equation*}
\hat{H}_{t}=\hbar \Delta \hat{Z} / 2+\hbar \Omega / 2\left(e^{-i \theta} \hat{\sigma}+e^{i \theta} \hat{\sigma}^{\dagger}\right) \tag{22}
\end{equation*}
$$

The first term is related to the tuning of the qubit. While the second term varies the phase $\sigma$, we can apply simple gates such as $\hat{X}=\frac{1}{2}\left(\hat{\sigma}^{\dagger}-\hat{\sigma}\right)$, and $\hat{Y}=\frac{i}{2}\left(\hat{\sigma}^{\dagger}+\hat{\sigma}\right)$ and then build more complicated gates. $\hat{\sigma}=\left(\begin{array}{ll}0 & 1 \\ 0 & 0\end{array}\right)$

In quantum mechanics, if a measurement is performed on a qubit, it collapses in one state. Check AppendixA.1. Now, let us explain how to measure the qubit's
state without destroying it. Consider the cavity while calculating the Hamiltonian to see how the non-destructive measurement can happen. The total Hamiltonian is

$$
\begin{equation*}
\hat{H}_{\text {total }}=\hat{H}_{\text {lin }}+\hat{H}_{\text {nonlin }} \tag{23}
\end{equation*}
$$

where $\hat{H}_{\text {lin }}=\hbar \omega_{c} \hat{b}^{\dagger} \hat{b}+\hbar \omega_{q} \hat{a}^{\dagger} \hat{a}$ and $\hat{H}_{\text {nonlin }}=-\frac{E_{a}}{4!}\left[\Phi_{1 a}^{Z P F}\left(\hat{a}^{\dagger}+\hat{a}\right)+\Phi_{1 b}^{Z P F}\left(\hat{b}^{\dagger}+\hat{b}\right)\right]^{4}$ $\hat{a}^{\dagger}$ and $\hat{a}$ are the raising and lowering operators of the qubit, respectively. $\hat{b}^{\dagger}$ and $\hat{b}$ are the raising and lowering operators of the cavity, respectively. $E_{a}$ is the Josephson energy, and $\omega_{c}$ and $\omega_{q}$ are the cavity frequencies and the qubit, respectively. Applying the Rotating Wave approximation, the effective Hamiltonian of the cavity is

$$
\begin{equation*}
\hat{H}_{c a v}^{e f f}=\hbar\left(\omega_{c}-\chi \hat{a}^{\dagger} \hat{a}\right) \hat{b}^{\dagger} \hat{b} \tag{24}
\end{equation*}
$$

As seen, it depends on the state of the qubit $\hat{a}^{\dagger} \hat{a}$. Preparing the oscillator of the cavity in the first excited state gives an effective energy

$$
\begin{equation*}
E_{e f f}=\hbar\left(\omega_{c}-\chi n_{q u b i t}\right) \tag{25}
\end{equation*}
$$

Knowing How the transmon qubit functions, let us investigate some of the noise


Figure 8: Predict the state of the qubit through the effective energy of the cavity
sources.
As seen in Figure 8, to predict the qubit's state, we need to measure the effective energy of the cavity, and it will be probabilistic to guess the qubit's state, which causes errors. According to [8], we can find different sources in the system;

- Charge noise can be induced by the presence of charged particles in the defects or charge traps in the dielectric that sit in the junction tunnel barrier; it mainly causes energy relaxation of the qubit, check section3.2.
- Magnetic flux noise forms due to random polarization flipping on the surfaces of the superconductors; this contributes to the phase shifting error; check section3.2.
- The residual photons in the resonator, which come from higher temperature stages of the dilution refrigerator, might cause photon number changes.
- Unpaired electrons (Quasi-particles) tunnel through the Josephson junction can cause relaxation and pure dephasing, check section 3.2 this will reduce as the temperature decreases.


### 3.2 Error Models

From previous chapters, it is clear that the implementation of qubits is not ideal, leading to errors in the results. In this section, we will be listing theoretical error models. Errors can be classified into stochastic and coherent noises. In application, it is impossible to isolate a system, especially a quantum bit (qubit), from its environment; there will always be a random interaction or coupling between those two systems, which leads to the decoherence of the qubit or its loss of irretrievable information, this is called a stochastic noise. On the other side, coherent or systematic noise forms due to the imperfection of the device used, such as cross-talk (unwanted interaction between qubits) or imperfect unitary operators applied, such as miscalibrations drift (over or under rotate the state of the qubit slightly from the needed state). These transformations do not affect the coherence of the qubit; in fact, these errors might be controlled to interfere with each other destructively.

We can realize quantum errors in noise channels such as bit-flip, phase-flip, depolarization, amplitude, gate, and readout channels. The binary symmetric channel can describe bit flip error with probability $p$ of flipping a state from $|0\rangle$ to $|1\rangle$ and vice versa $1-p$ probability to preserve the state, check Figurf9, $p$ will increase with time $p=\frac{1}{2}\left(1-e^{-\frac{t}{T}}\right)$ where $T$ is the bit flip coherence time of the qubit. For example, let us see the pure $|0\rangle\langle 0|$ state transformation in a binary asymmetric channel

$$
\begin{equation*}
|0\rangle\langle 0| \rightarrow(1-p)|0\rangle\langle 0|+p|1\rangle\langle 1| \tag{26}
\end{equation*}
$$



Figure 9: Scheme of a binary symmetric channel.

We can also build a binary asymmetric channel where the probability of flipping from $|0\rangle$ to $|1\rangle$ is not equal to that from $|1\rangle$ to $|0\rangle$. In the phase-flip channel, we lose a well-defined relative phase between $|0\rangle$ and $|1\rangle$. This phenomenon is an exclusive quantum error not observed in classical bits. Check Appendiy A. 3 for a basic explanation of the operators used here. We can describe bit-flip and phase-flip errors through Pauli operators, $\sigma_{X}$ as a bit-flip error, $\sigma_{Z}$ as a phase-flip error, and $\sigma_{Y}$ as a combination of those two errors.

A general representation of the transformations caused by these errors was given by [3] as follows: Let $p_{\sigma}$ be the probability of occurrence of each error, where $\sigma=$ $\sigma_{X}, \sigma_{Y}, \sigma_{Z}$. Consider 2 operators $E_{0}=\sqrt{1-p_{\sigma}} \mathbb{1}$ (where no error occurs, acts as an identity) and $E_{1}=\sqrt{p_{\sigma}} \sigma$ (where error occurs). The general transformation on the density matrix $\rho$ is as follows:

$$
\begin{equation*}
\rho \rightarrow \rho^{\prime}=\epsilon(\rho)=E_{0} \rho E_{0}^{\dagger}+E_{1} \rho E_{1}^{\dagger} \tag{27}
\end{equation*}
$$

In the previous noise channels, the state of the qubit $\rho$ becomes a mixed state. These transformations can be described as one transformation that we can call a depolarization channel. It can be represented in Kraus form [3.

$$
\begin{equation*}
\epsilon(\rho)=\sum_{i=0}^{3} E_{i} \rho E_{i}^{\dagger} \tag{28}
\end{equation*}
$$

with $E_{0}=\sqrt{1-\frac{3 p}{4}} \mathbb{1}, E_{1}=\sqrt{\frac{p}{4}} X, E_{2}=\sqrt{\frac{p}{4}} Y_{1}, E_{3}=\sqrt{\frac{p}{4}} Z$ and $\mathrm{p} / 4$ is the probability of getting at least an error.

In the depolarization channel, the qubit loses information; on the other hand, there is an amplitude damping channel where the qubit loses energy in the form of deex-
citation from $|1\rangle$ to $|0\rangle$. Its transformation can be described as in 27 , but with

$$
E_{0}=\left(\begin{array}{cc}
1 & 0  \tag{29}\\
0 & \sqrt{1-p}
\end{array}\right) ; E_{1}=\left(\begin{array}{cc}
0 & \sqrt{p} \\
0 & 0
\end{array}\right)
$$

All the previous equations satisfy

$$
\begin{equation*}
\sum_{i} E_{i} E_{i}^{\dagger}=\mathbb{1} \tag{30}
\end{equation*}
$$

That preserves the normalization of the state of the qubit.

### 3.3 IBM Calibration

IBM processors differ in terms of the number of qubits and performance. IBM allows its users to identify that through some parameters.

- 'T1' $[\mu s]$ and 'T2' $[\mu s]$ are the qubit relaxation and the dephasing times, respectively.
- 'Frequency' $[G H z]$ refers to the one to excite the qubit $w_{12}$ (eigenvalue of $\omega_{0} \hat{a}^{\dagger} \hat{a}$ of the first term of equation 20 .
- 'Anharmonicity' $[G H z]$ refers to the frequency difference between $w_{12}$ and $w_{23}$ (eigenvalue of $-\frac{\alpha}{2} \hat{a}^{\dagger} \hat{a}\left(\hat{a}^{\dagger} \hat{a}-I\right)$ of the secon term of equation 20 ).
- 'Readout assignment error' is the probability of a measurement returning the wrong value.
- 'Prob meas0 prep 1 ' is the probability of measuring $|0\rangle$ after preparing the $|1\rangle$ state and vice versa for 'Prob meas1 prep0'.
- 'Readout length' $[n s]$ is the time it takes to perform a measurement.
- 'ID error' is the probability of the error induced by having an inactive qubit.
- ' $\sqrt{X}$ error' and 'Single-qubit Pauli $X$ error' probability of getting an error induced by applying the gate.
- 'CNOT error' is the probability two-qubit gate error.
- 'Gate time' $[n s]$ is the time it takes to perform a two-qubit gate.

Figure 10 is an example that shows the calibrations of $i b m_{-}$manila.


Figure 10: Table of calibration of $i b m$ _manila

This table shows the parameters defined in section 3.3 of each qubit in the system. This calibration changes temporally.
Quantum volume is a parameter set by IBM to determine how good is the performance of the quantum processor; it takes into account the number of qubits, gate and measurement errors, crosstalk, and the connectivity of the qubits.

### 3.4 Error mitigation

With an ultimate goal to reach fault-tolerant quantum computers by performing fault-tolerant error correction, the systems have an insufficient number of qubits to do that. Quantum error mitigation QEM is a path to get improved results of a quantum computation in the NISQ (Noisy Intermediate Scale quantum) era.
This technique involves preparing the qubits and repeatedly executing them into a particular circuit. Then by comparing the counts (probabilities) of the outcome and the expected outcomes, the errors that occurred can be considered in some way
correlated such that they are related in a matrix transformation of the qubit. This matrix can be reversed every time a circuit is applied. The QEM method will work efficiently in low Noise to Signal Ratio cases. Otherwise, it is useless.

### 3.5 Results

After describing the processors that will be worked on, the noise generated by the processor, and the kind of errors produced, let us run both circuits (Circuit \# 1 and Circuit \# 2), each on two different processors, to see those effects.

After running Circuit \# 1 on ibm_manila and ibm_santiago processors, we get the following results

(a) $|001\rangle$ targeted. X -axis represents the (b) $|011\rangle$ targeted. X -axis represents the states measured
states measured

(c) Measuring the number of counts of each state while changing the target state

Figure 11: Performing Circuit \# 1 on ibm_manila

In Figure 11, Circuit \# 1 is run on ibm_manila. Figure11a shows the counts
of each state resulting from running the circuit on several shots and presented as a probability on the Y-axis; on the X-axis, we observe the states measured on each shot $(|000\rangle,|001\rangle$, Etc); this result is after targeting $|001\rangle$. The same can be said about Figure 11b, but this results after targeting $|011\rangle$. In Figure 11 c , each state is targeted individually; targeted states are listed on the Y-axis; beside each state, we list the counts (probabilities) in the outcome, which are listed on the X-axis. The probabilities are visualized as the color of each pixel and defined on the color bar on the right. The probabilities of all states seem to be close to each other, with some fluctuations in Figure11a and Figure11b. Figure11clooks somewhat varying around the middle of the color bar; on $|011\rangle$, it seems random.


Figure 12: Performing Circuit \# 1 on ibm_santiago. Same as in Figure 11

In Figure 12, Circuit \# 1 is now run on $i b m$ _santiago. The same comments as on Figure11a can be made about Figures 12a and 12b. Figure12a shows the
result after targeting $|011\rangle$. Figure 11 b shows the result after targeting $|011\rangle$. A detailed description of Figure11c can be said in Figure 12c. In general most of the sub-Figures in Figures 11 and Figure 12 show almost equal probability distributions in all the states. Figure 12 c looks like a random distribution of colors in the upper pixels and is somewhat smeared out in the lower pixels.

Let us see the results of Circuit \# 2 on ibm_oslo and ibm_nairobi processors too. The results are as follows


Figure 13: Performing Circuit \# 2 on ibm_oslo. Same as in Figures 11 , and 12

In Figure13, we execute Circuit \# 2 on ibm_oslo. Figures 13a and 13b can be the same described as Figur@11a, but they are the result of targeting Circuit \# 2 on $|001\rangle$ and $|110\rangle$, respectively. Figure 13 c same described as Figure 11c. In Figures 13 a and 13 b , we can see that probability is mostly in one state, Figure 13a in 0001$\rangle$ and Figure 13 b in $|110\rangle$, with smaller probabilities in the rest of the states. Figure

13c shows a pattern in the color map, and it looks like such a diagonal line that its elements(pixels) have high probabilities.


Figure 14: Performing Circuit \# 2 on ibm_nairobi. Same as in Figures 11, 12, and 13

The same explanations of Figure 13 can be said for all sub Figures in Figure 14.In Figure 14a, we can see that probability is concentrated mainly in $|001\rangle$ with smaller probabilities in the rest of the states. While in Figure $14 \mathrm{~b}|010\rangle$ is seen to have the highest probability, the other states have higher probabilities than Figure 14a. Figure 14 c also shows a diagonal line, but a bit more faded than in Figure 13 c Finally, let us try to implement a quantum error mitigation on Circuit \# 2, which targeted one of the states. We got the following results Figure 15 shows the probability distribution on the whole states in noisy (original) form (in blue) and mitigated form (in red). The probability can be seen accumulated in both cases in $|110\rangle$.


Figure 15: $|110\rangle$ is targeted by Circuit \# 2 and executed on $i b m q$ _quito

## 4 Discussion

The results in Figures 11a 11b 12a, and 12b do not contain any valuable information for not getting information about the targeted states. That is due to high noise that we can not distinguish the targeted states, and that is clear in Figures 11c and 12c, which look random, the change of errors between targeted states can be explained by needing different number of gates in different cases (X gates, for example, see section 2.1.1 and these noises are either random or pseudo-random processes that will change even running the same circuit at different times. In the color map, the probabilities are distributed randomly such that there is no trace of a diagonal line. We might need several error correction models to start seeing results to solve that. Moreover, since the results are so poor, we cannot even compare the two different devices, $i b m_{-}$manila and ibm_santiago, and this shows that the cause of the poor results is not a particular processor but the circuit construction itself.

Figures 13a 13b, and 14a show that the probabilities mostly accumulate in the targeted states. That indicates that Grover's algorithm has succeeded when implementing Circuit \# 2 in this case. We can see that also in Figures 13c and 14c, where a diagonal line appears as in Figur 3 c in the ideal case. We can frequently distinguish target states in Circuit \# 2. However, in Figure14b, we observe relatively high errors compared to before; this takes us to compare ibm_oslo and ibm_nairobi, simply comparing between Figures 13 c and 14 c , we can see that Figure 13 c has a
more apparent diagonal line than in Figure14c. We can say then $i b m_{\text {_ }}$ oslo performs better than ibm_nairobi in Circuit \# 2.

We can see that Quantum Error Mitigation improves the results, as seen in Figure15. We observe that the probability increased after QEM, and most other states decreased their probability (decrease of errors).

To quantify how good or bad the device distinguished a targeted state in a circuit, [3] proposed a parameter $S$ and called it the sensitivity.

$$
\begin{equation*}
S=10 \log _{10}\left(\frac{P_{t}}{P_{h n}}\right) \tag{31}
\end{equation*}
$$

Where $P_{t}$ is the probability of the target state and $P_{h n}$ is the probability of the highest noisy state. Where $S \geqslant 3$ is the critical point where the device starts to be sensitive to the target state.

The average sensitivity of each device is as follows $S_{i b m_{-} \text {oslo }}=6.7, S_{i b m_{-} \text {nairobi }}=3.27$, further showing the advantage of $i b m_{\text {_ }}$ oslo and $i b m_{-}$nairobi on the edge of the critical point.
The sensitivity in Figur 15 before QEM is $S_{\text {before }}=4.25$, and after QEM is $S_{\text {after }}=$ 5.7. We can see here how QEM improved the sensitivity of the measurement.

## 5 Conclusion

Let us conclude this study by summarizing of the fundamental results concerning to our initial aims on the topic. We will also review the study's limitations and propose opportunities for future research.

As we have seen in the results, Circuit \# 2 outperformed Circuit \# 1 in distinguishing the targeted states, and that is quantified by calculating the average sensitivity of where $S_{i b m_{-} \text {manila }} \simeq-0.1$ is the average sensitivity of Circuit $\# 1$ on ibm_manila, which is incomparable to the one of Circuit \# 2. Circuit \# 1 has more qubits involved in the computation than Circuit \# 2; in turn, the number of gates used in the circuit is defined as the depth of the circuit. We can conclude that optimizing the circuit (decreasing its depth) improves the results, especially in such a noisy
channel. On the other hand, comparing the performance of Circuit \# 2 on two different IBM processors, ibm_oslo and ibm_nairobi, showed that ibm_oslo shows less error (better performance) than ibm_nairobi, and that was confirmed by comparing their average sensitivities. Furthermore, at the end, the result in Figure 15 shows that quantum error mitigation can make a difference in the results by improving them. This study was limited to three qubits ( $2^{3}$ states), but to make sense of the study, we have to go to a higher number of qubits, which may result in more errors due to the need to use more gates. Then we will need some error correction models to get more reliable results. The study may also be extended to target more qubits, which will struggle with the same problems of more qubits circuit, which is the high depth of the circuit. Finally, we can suggest an application of Grover's algorithm, Quantum Random Access Memory (QRAM) [21, by introducing a new kind of qubit representing the address the code will get after finding the data.

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## A Basics of Quantum Information

## A. 1 Qubit

A qubit as any quantum system can be in multiple states instantaneously, that phenomenon is called superposition and it is a wave property from classical mechanics. Here the states will be represented in Dirac notations, $|x\rangle \equiv \mathrm{x}$ state. Compare Appendix A (195-214) in [22] for a more detailed explanation.

The total state of a qubit can be in a general form as in equation 1

$$
|q u b i t\rangle=\cos (\theta / 2)|0\rangle+e^{i \Phi} \sin (\theta / 2)|1\rangle
$$

$\theta$ determines the probability distribution on the states. $p_{|0\rangle}=\cos ^{2}(\theta / 2)$ and $p_{|1\rangle}=$ $\sin ^{2}(\theta / 2) . \Phi$ is a phase between the states.

When the qubit is measured, as for any quantum system it collapses into one of the superposed states.

The state of the qubit can be also represented in a vector form in a unit radius sphere where $\theta$ and $\Phi$ are the Euclidean angles Figure 16 ,


Figure 16: Bloch sphere representation of the qubit state

In Figure 16, a vector pointing along the positive and negative Z-axis represent $|0\rangle$ and $|1\rangle$ respectively and any vector in between -with an angle $\theta$ with the Zaxis - represent a superposition of $|0\rangle$ and $|1\rangle$. At the X-Y plane there is an equal
probability of $|0\rangle$ and $|1\rangle$, where a vector pointing with the positive and negative X -axis represent $|+\rangle=\frac{|0\rangle+|1\rangle}{\sqrt{2}}$ and $|-\rangle=\frac{|0\rangle-|1\rangle}{\sqrt{2}}$ respectively, those states differ by a phase and any state between them -with an angle $\Phi$ with the X-axis - have different phases.

## A. 2 N qubits

We can represent a system of $N$ qubits in the form of

$$
\begin{equation*}
\mid N \text { qubits }\rangle=\bigotimes_{i}^{N}\left|q_{i}\right\rangle \tag{32}
\end{equation*}
$$

where $\otimes$ is the Kronecker multiplication.

## A. 3 Operators

## A.3.1 Single qubit gates

These gates are a unitary transformation of a single qubit.
Let's define some of the useful basic operators that will be used in this thesis.
A Hadamard or as represented by the symbol $H$ is a rotation by $90^{\circ}$ of the state in the $\theta$ direction, or in other words changes the basis from $\{|0\rangle,|1\rangle\}$ to $\{|+\rangle,|-\rangle\}$ and its matrix representation is as follows

$$
H=\left(\begin{array}{cc}
1 & 1  \tag{33}\\
1 & -1
\end{array}\right)
$$

Pauli operators can be also seen as rotation operators in different directions. There are three of them $\sigma_{X}, \sigma_{Y}, \sigma_{Z}$ or $\mathrm{X}, \mathrm{Y}, \mathrm{Z}$. X is a NOT and gate flips the state about the $\mathrm{X}-\mathrm{Y}$ plane. The Z changes the phase in the state by flipping it about the $\mathrm{Y}-\mathrm{Z}$ plane. The Y gate is a combination of X and Z gates that flips the state about the $\mathrm{X}-\mathrm{Z}$ plane. The matrix representation of these gates is as follows

$$
X=\left(\begin{array}{cc}
0 & 1  \tag{34}\\
1 & 0
\end{array}\right) ; Y=\left(\begin{array}{cc}
0 & -i \\
i & 0
\end{array}\right) ; Z=\left(\begin{array}{cc}
1 & 0 \\
0 & -1
\end{array}\right)
$$

Those operators are hermitian (self-inverse) $U^{\dagger}=U$, unitary $U^{\dagger} U=\mathbb{1}$ and reversible $\left(\exists U^{-1}\right)$.

## A.3.2 Multi qubit gates

As in classical computing, in quantum computing there are gates that take more than one input to process them, these operations as in single qubit gates should be reversible, so the one of the final states remain unchanged but the other change according to the first, as shown in the figure below


We will introduce here the CNOT and the Toffoli gate.
A CNOT gate as in classical case changes the target bit according to the control bit. In the quantum case if there was a superposition of states in the control then the target changes differently according to each state (Kronecker sum). It is of the form

where
represents the control qubit and

represents the target qubit (same symbol as the Kronecker sum $\oplus$ ).
A Toffoli gate is a multi-control operation that changes the targeted qubit according to both control qubits (AND / $\otimes$ ).


The Toffoli gate activates only one state $\left|q_{0} q_{1}\right\rangle=|11\rangle$.
Using Toffoli gates, we can build a more than two control, gates as following


## B Multi number of solution Grover's Algorithm

Previously we investigated a one-solution Grover search algorithm. This work can be generalized to many targeted states, which will be discussed in this section.

Let us consider $M$ number of solutions where $M<N$. The set of $M$ number of solutions is $W=\left\{\omega_{i} \mid i \in[1, M]\right\}$.

$$
g(x)= \begin{cases}1 & x \in W  \tag{35}\\ 0 & \text { otherwise }\end{cases}
$$

Doing a similar derivation as in equations 4, 5, 6,

$$
\begin{gather*}
|s\rangle=\frac{1}{\sqrt{N}} \sum_{x \notin W}|x\rangle+\frac{1}{\sqrt{N}} \sum_{x \in W}|x\rangle  \tag{36}\\
|s\rangle=\sqrt{\frac{N-M}{N}} \frac{1}{\sqrt{N-M}} \sum_{x \notin W}|x\rangle+\sqrt{\frac{M}{N}} \sum_{x \in W}|x\rangle=\sqrt{\frac{N-M}{N}}\left|s^{\prime}\right\rangle+\sqrt{\frac{M}{N}}|\omega\rangle \tag{37}
\end{gather*}
$$

For the number of iterations, the same calculation as in 1 solution case can be done except when replacing $\theta$, where here logically $\theta$ should depend on both $N$ and $M$.

Lemma 2. The number of iterations to complete the Grover algorithm of $M$ targeted states is of order $O(\sqrt{N / M})$. 4

Proof. Repeat equations 10, 11 and 12 .

$$
\begin{gather*}
V U_{f}|s\rangle=\cos (3 \theta / 2)\left|s^{\prime}\right\rangle+\sin (3 \theta / 2)|\omega\rangle  \tag{38}\\
V U_{f}|s\rangle=\cos (\theta+\theta / 2)\left|s^{\prime}\right\rangle+\sin (\theta+\theta / 2)|\omega\rangle  \tag{39}\\
\left(V U_{f}\right)^{r}|s\rangle=\cos (r \theta+\theta / 2)\left|s^{\prime}\right\rangle+\sin (r \theta+\theta / 2)|\omega\rangle \tag{40}
\end{gather*}
$$

So $r=\pi / 2 \theta-1 / 2$. Instead here $\theta=\arcsin (\sqrt{M / N}) \simeq \sqrt{M / N}$ then $r=$ $\pi \sqrt{N / 4 M}-1 / 2 \simeq O(\sqrt{N / M)}$

We can see that the number of iterations increases with the decrease of $M$ and vice versa since it is easier to find a more significant chunk of data than a more specific one.

## C Code

Compare [23] for further explanation about coding on Qiskit.

## C. 1 Preparation

from qiskit import * \#import everything from qiskit library
import numpy as $n p$
import matplotlib.pyplot as plt
from qiskit import IBMQ
\#Import the IBMQ interface
from qiskit.tools.visualization import plot_histogram
\#import a library to plot the histograms of the results
from qiskit.visualization import latex as _latex
\#import the library that writes the circuits in Latex form

## C. 2 Circuit number 1

## C.2.1 Phase Oracle

def phase_oracle(n,input_str, name='uf'):
\#A function that takes an input string of the targeted \#state and adds a phase to it
\#This is the phase operator
qc = QuantumCircuit(n, name = name)
\#Create a quantum circuit named by name $=$ 'uf' labeled as qc
$\# n$ is the number of qubits
for i in range ( 0,3 ):
\#go all over the string elements
if input_str[i] == '0':
qc. $\mathrm{x}(2-\mathrm{i})$
\#apply $X$ gate in (2-i)th qubit
\#since the results are presented in the opposite way
\#apply $X$ gate only on the 0 substates

```
qc.ccx(0,1,3)
#ccx is a Toffoli applied on qc as qc.ccx
#ccx(control qubit, control qubit, target qubit)
qc.ccx(2,3,4)
qc.ccx(0,1,3)
#Build a 3 control gate of three Toffoli gates
for j in range (0,3):
    if input_str[j] == '0':
        qc.x(2-j)
#apply again X gate to the same substates to return it back as it
#Return the circuit
return qc
```


## C.2.2 Diffuser

```
def diffuser(n,name='v'):
```

\#A function as the diffuser
\#flips the state around the initial state

```
qc = QuantumCircuit(n, name = name)
#Create a quantum circuit
#apply Hadamard gate on all qubits
for qb in range(n-2):
    qc.h(qb)
    #apply a Hadamard gate on qubit number qb
#control phase on 000 state
#apply X on all qubits
for i in range(n-2):
    qc.x(i)
    #apply X on qubit number i
qc.ccx(0,1,3)
qc.ccx (2,3,4)
qc.ccx(0,1,3)
#Build a 3 control gate of three Toffoli gates
#apply X on all qubits
for i in range(n-2):
    qc.x(i)
#apply again Hadamard gate on all qubits
for qb in range(n-2):
    qc.h(qb)
#Return the quntum circuit
return qc
```


## C.2.3 Total circuit

Combine the previous circuits into one after repeating certain number of times.

```
n = 5 #total number of qubits
gr = QuantumCircuit(n,n-2)#Create a Grover Circuit
m=1 #number of solutions are searched for
```

$\mathrm{r}=\operatorname{int}(\mathrm{np} . \mathrm{floor}(\mathrm{np} . \mathrm{pi} / 4 * \mathrm{np} . \operatorname{sqrt}(2 * *(\mathrm{n}-2) / \mathrm{m}))$ )
\#number of times we need to apply the algorithm according to the theore
gr.h(range ( $\mathrm{n}-2$ ) )
\#prepare the first 3 qubit into $1+++>$
\#prepare the last qubit in $\mid->$ being target qubit
gr. $\mathbf{x}(\mathrm{n}-1)$ \#apply $X$
gr.h(n-1) \#apply Hadamard
\#Combine the phase oracle and the diffuser and repeat $r$ times
for j in range( $r$ ):
gr.append (phase_oracle(n,'011'), range(n)) \#target $/ 011>$ state
gr.append (diffuser ( $n$ ), range ( $n$ ) )
gr.measure (range ( $n-2$ ), range ( $n-2$ ) )
\#Measurement of first three qubits
gr.draw('mpl')\#draw the circuit

## C. 3 Circuit number 2

## C.3.1 Phase Oracle

def phase_oracle(n,input_str, name='uf'):
\#A function that takes an input string of the targeted \#state and adds a phase to it
\#This is the phase operator
qc = QuantumCircuit(n, name = name)
\#Create a quantum circuit named by name $=$ 'uf' labeled as qc $\# n$ is the number of qubits
for i in range ( 0,3 ):
\#go all over the string elements
if input_str[i] == '0':
qc. $\mathrm{x}(2-\mathrm{i})$
\#apply $X$ gate in (2-i)th qubit
\#since the results are presented in the opposite way
\#apply $X$ gate only on the 0 substates
qc. $\operatorname{ccx}(0,1,3)$
\#ccx is a Toffoli applied on qc as qc.ccx
\#ccx (control qubit, control qubit, target qubit)
qc.ccx $(2,3,4)$
qc. $\operatorname{ccx}(0,1,3)$
\#Build a 3 control gate of three Toffoli gates
for j in range ( 0,3 ):
if input_str[j] == '0':
qc. $\mathrm{x}(2-\mathrm{j})$
\#apply again $X$ gate to the same substates to return it back as it
\#Return the circuit
return qc

## C.3.2 Diffuser

```
def diffuser(n,name='v'):
    #A function as the diffuser
    #flips the state around the initial state
    qc = QuantumCircuit(n, name = name)
    #Create a quantum circuit
#apply Hadamard gate on all qubits
    for qb in range(n-2):
        qc.h(qb)
        #apply a Hadamard gate on qubit number qb
    #control phase on 000 state
#apply X on all qubits
    for i in range(n-2):
        qc.x(i)
        #apply X on qubit number i
    qc.ccx(0,1,3)
    qc.ccx (2,3,4)
    qc.ccx(0,1,3)
    #Build a 3 control gate of three Toffoli gates
    #apply X on all qubits
    for i in range(n-2):
        qc.x(i)
#apply again Hadamard gate on all qubits
```

```
for qb in range(n-2):
    qc.h(qb)
    #Return the quntum circuit
    return qc
```


## C.3.3 Total circuit

Combine the previous circuits into one after repeating certain number of times.
$\mathrm{n}=5$ \#total number of qubits
gr $=$ QuantumCircuit(n, $\mathrm{n}-2) \#$ Create a Grover Circuit
$\mathrm{m}=1$ \#number of solutions are searched for
r= int(np.floor(np.pi/4*np.sqrt(2**(n-2)/m)))
\#number of times we need to apply the algorithm according to the theore
gr.h (range ( $\mathrm{n}-2$ ) )
\#prepare the first 3 qubit into $1+++>$
\#prepare the last qubit in $1->$ being target qubit
gr.x(n-1) \#apply X
gr.h(n-1) \#apply Hadamard
\#Combine the phase oracle and the diffuser and repeat $r$ times
for $j$ in range( $r$ ):
gr. append (phase_oracle(n,'011'), range(n)) \#target /011> state gr.append (diffuser ( $n$ ), range ( $n$ ) )
gr.measure (range ( $n-2$ ), range ( $n-2$ ) )
\#Measurement of first three qubits

```
gr.draw('mpl')#draw the circuit
```


## C. 4 Get the results

## C.4.1 Qiskit interface

```
simulator = Aer.get_backend('qasm_simulator')
job=execute(gr,backend = simulator,shots=1000)
#Run/execute the circuit on
#qasm_simulator (provided by Qiskit) 1000 times
```

result=job.result()
counts = result.get_counts()
\#count how many times each state show in the measurement
plot_histogram(counts)
\#plot the result in a histogram

## C.4.2 IBM cloud

from qiskit.tools.monitor import job_monitor

IBMQ.load_account()
\#load my account
\#link account to ibm-q provider
provider = IBMQ.get_provider('ibm-q')
\#Choose which processor to be the backend
qcomp = provider.get_backend('ibm_oslo')
\#execute the circuit gr
job = execute(gr, backend=qcomp)
job_monitor (job)
\#job_monitor will display status information regarding the circuit \#such as queue times and viewing the results queues
result = job.result()
\#get the result
plot_histogram(result.get_counts(gr))
\#plot the result

