

## TASK - 2

There are three implementations of task-2 in this jupyter notebook.

A: We considered 4 parametrised gates (one layer of R\_x and R\_y gates on each of the qubits).

B: We considered 2 parametrised gates (one layer of R\_x and R\_y gates on the top qubit).

C: BONUS TASK

Optimisers Used: COBYLA and SPSA for implementations A and B, and COBYLA and Classical gradient descent method for C.

Steps:

1. We use a customised noise model.
2. We define the layer/layers of R\_x and R\_y gates.
3. Define a suitable cost-function.
4. Define a random array of parameters for the R\_x and R\_y gates.
5. Use optimisers like COBYLA/SPSA to optimise the cost function.
6. Make another circuit excluding the last two measurements (i.e without the measurement gates on the last measurement).
7. Plot Histogram results to display probabilities.
8. And print the final state-vector from the circuit in 6.

## We attempt A first. (USING COBYLA)

### (I) Importing required libraries

```
In [1]: from qiskit import Aer, execute
        from qiskit.providers import Backend, BasicAer, QasmSimulator
        from qiskit import QASM2BackendConfig, QASM2Backend
        from qiskit.providers.aer.noise import noise
        from qiskit import IBMQ
        from qiskit import QuantumCircuit, QuantumRegister, ClassicalRegister, execute, BasicAer,
        from qiskit.visualization import plot_histogram
        %matplotlib inline

In /home/ibrahav/anaconda3/lib/python3.7/site-packages/matplotlib/mpl-data/stylelib/classic-test.mplstyle:
The text later, preview rcparam was deprecated in Matplotlib 3.3 and will be removed two minor releases later.
In /home/ibrahav/anaconda3/lib/python3.7/site-packages/matplotlib/mpl-data/stylelib/classic-test.mplstyle:
The matplotlib.font_manager.FontManager object was deprecated in Matplotlib 3.3 and will be removed two minor releases later.
In /home/ibrahav/anaconda3/lib/python3.7/site-packages/matplotlib/mpl-data/stylelib/classic-test.mplstyle:
Support for setting the 'matplotlib.fallback_ttc' rcparam is deprecated since 3.3 and will be removed two minor releases later; use 'matplotlib.fallback' instead.
In /home/ibrahav/anaconda3/lib/python3.7/site-packages/matplotlib/mpl-data/stylelib/classic-test.mplstyle:
The validate_bool_maybe_none function was deprecated in Matplotlib 3.3 and will be removed two minor releases later.
In /home/ibrahav/anaconda3/lib/python3.7/site-packages/matplotlib/mpl-data/stylelib/classic-test.mplstyle:
The switch_to_backend function was deprecated in Matplotlib 3.3 and will be removed two minor releases later.
In /home/ibrahav/anaconda3/lib/python3.7/site-packages/matplotlib/mpl-data/stylelib/classic-test.mplstyle:
The keymap.all_axes rcparam was deprecated in Matplotlib 3.3 and will be removed two minor releases later.
In /home/ibrahav/anaconda3/lib/python3.7/site-packages/matplotlib/mpl-data/stylelib/classic-test.mplstyle:
The animation.avconv_path rcparam was deprecated in Matplotlib 3.3 and will be removed two minor releases later.
In /home/ibrahav/anaconda3/lib/python3.7/site-packages/matplotlib/mpl-data/stylelib/classic-test.mplstyle:
The animation.avconv_args rcparam was deprecated in Matplotlib 3.3 and will be removed two minor releases later.
```

### (II) Defining a custom noise model.

As the requirements demand that simulations are to be done in presence of noise, we introduce a customised noise model which includes depolarising error, phase damping error and amplitude damping error.

```
In [2]: def custom_noise_model(qubits_with_errors=[0], dp=0.01, pd=0.091, ad=0.01):
    prob_1 = dp # 1-qubit gate
    phase_damping_param = pd
    amplitude_damping_param = ad
    error_qubits = qubits_with_errors # error only in first k qubits (the encoding/decoding qubits)

    # Depolarizing quantum errors
    error_1 = noise.depolarizing_error(prob_1, 1)

    # Phase Damping Errors
    error_2 = noise.phase_damping_error(phase_damping_param)

    # Amplitude damping errors
    error_3 = noise.amplitude_damping_error(amplitude_damping_param)

    # Add errors to noise model, only to identity gates
    noise_model = noise.NoiseModel({})
    # Add 1 in error qubits:
    noise_model.add_quantum_error(error_1, ['id', 'u3'], [i], warnings=False)
    noise_model.add_quantum_error(error_2, ['id', 'u3'], [i], warnings=False)
    noise_model.add_quantum_error(error_3, ['id', 'u3'], [i], warnings=False)
    return noise_model
```

### (III) Defined a function for layers consisting of R\_x, R\_y gates.

```
In [3]: def rx_ry_layer(params=np.ndarray):
    qc = QuantumCircuit(2)
    qc.rx(params[0], 0)
    qc.ry(params[1], 0)
    qc.cx(0, 1)
    qc.ry(np.pi, 1)
    qc.cx(np.pi, 1)
    qc.rx(params[2], 1)
    qc.ry(params[3], 1)
    return qc
```

### (IV) Defined a function for CNOT and measurements.

```
In [4]: def cnot_meas(params=np.ndarray):
    qc = rx_ry_layer(params)
    qc.cx(0, 1)
    qc.measure_all()
    return qc
```

### (V) Defined a function for Cost Function.

1. Tried for number of shots of measurements / iteration = 1 using COBYLA.

```
In [146]: def cost_func(params):
    qc = cirq(params)
    noise_model = custom_noise_model(2)
    backend = Aer.get_backend('qasm_simulator')
    result = execute(qc, backend, shots=1, noise_model=noise_model).result()
    counts = result.get_counts()
    total = sum(counts.values())
    zero_one = counts['01']/total if '01' in counts.keys() else 0
    one_zero = counts['10']/total if '10' in counts.keys() else 0
    return (0.5-zero_one)**2 + (0.5-one_zero)**2
```

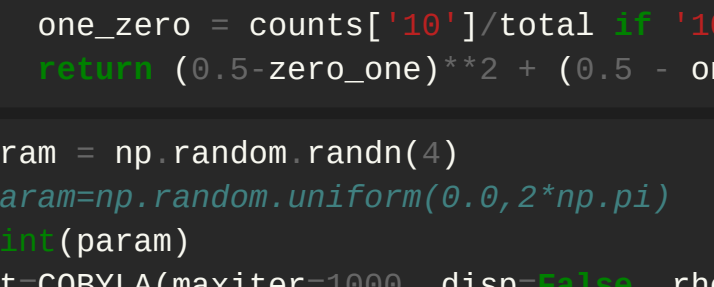
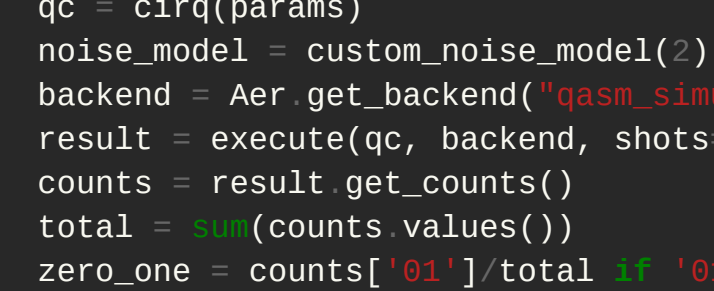
### (VI) Initialised a random array of parameters, optimised using COBYLA and printed the final circuit.

```
In [195]: param = np.random.randn(4)
#param=np.random.uniform(0.0,2*np.pi)
#param = (param)

opt=COBYLA(maxiter=1000, disp=False, rhobeg=1.0, tol=None)
#opt = SPSA(maxiter=1000, save_steps=1, last_avg=1, c0=0.6283185307179586, c1=0.1, c2=0.602, c3=0.101, c4=0, skip_calibration=False, max_trials=None)
#opt=AQGD(maxiter=200, eta=0.01, tol=0.0000001, disp=True, momentum=0.25)
#opt=ADAM(maxiter=10000, tol=0.0001, lr=0.001, beta_1=0.9, beta_2=0.99, noise_factor=1e-08, eps=1e-10, amsgrad=True, snapshot_dir=None)
ret = opt.optimize(num_vars=4, objective_function=cost_func, initial_point=param)
print(ret)

final_param = ret[0]
final_cirq = cirq(final_param)
#final_cirq2 = final_cirq.append(x(1))
final_cirq.draw('mpl')
```

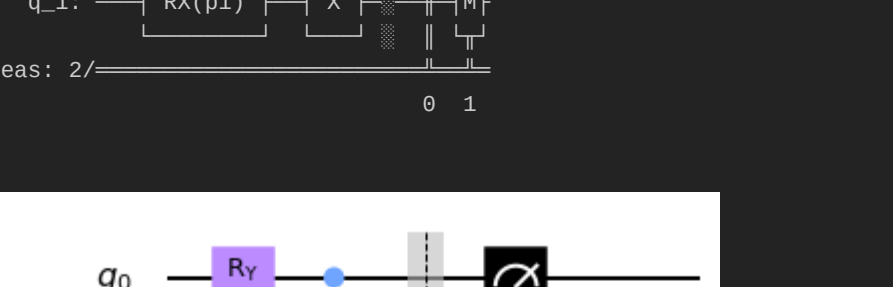
```
[ 0.3838924 -0.2912560 -0.25588319 0.97582075]
(array([[ 1.41788085, 0.70765772, -0.0076275, 0.96145162]], 0.022099999999999995, 47))
```



### (VII) Plotted the histogram results.

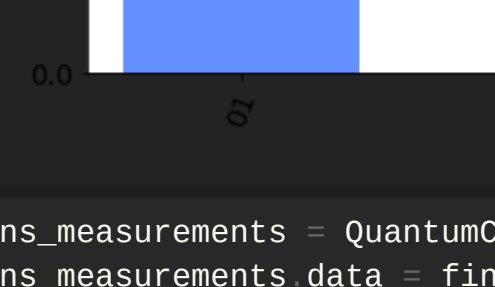
Used 1 as the no. of shots.

```
In [198]: backend = BasicAer.get_backend('qasm_simulator')
counts = execute(final_cirq, backend, shots=1).result().get_counts()
plot_histogram(counts)
```



### (VIII) Created a circuit without the measurement gates (for the very last two measurements of the two qubits) to obtain the final state vector.

```
In [197]: sans_measurements = QuantumCircuit(2)
sans_measurements.data = final_cirq.data[1:-2]
sans_measurements.draw('mpl')
```



### (IX) Printed the statevector just before the last two measurements.

```
In [196]: simulator = Aer.get_backend('statevector_simulator')
result = execute(sans_measurements, backend=simulator).result()
statevector = result.get_statevector()
print(statevector)
```

```
[ 4.6494791e-17+0.j, 3.98454874e-17+0.65972619j
 4.6494791e-17+0.75931247j 3.98454874e-17+0.j
]
```

Above tried using COBYLA for 1 shot of measurement per iteration.

Below for 10 shots below.

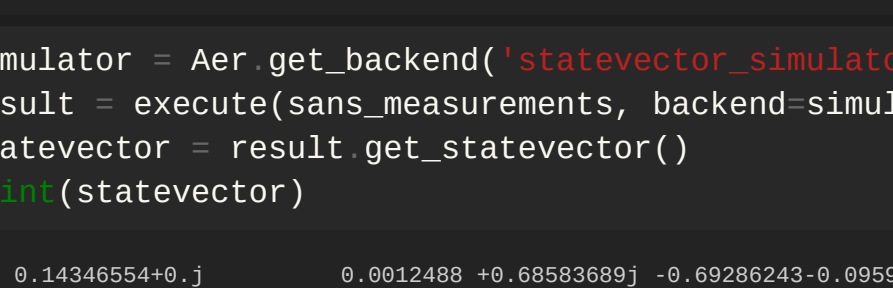
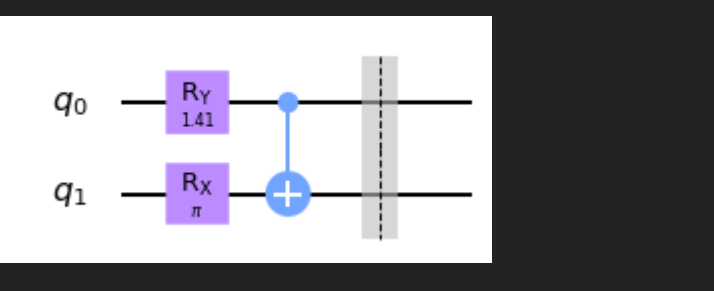
```
In [199]: def cost_func(params):
    qc = cirq(params)
    noise_model = custom_noise_model(2)
    backend = Aer.get_backend('qasm_simulator')
    result = execute(qc, backend, shots=10, noise_model=noise_model).result()
    counts = result.get_counts()
    total = sum(counts.values())
    zero_one = counts['01']/total if '01' in counts.keys() else 0
    one_zero = counts['10']/total if '10' in counts.keys() else 0
    return (0.5-zero_one)**2 + (0.5-one_zero)**2
```

```
In [200]: param = np.random.randn(4)
#param=np.random.uniform(0.0,2*np.pi)
#param = (param)

opt=COBYLA(maxiter=1000, disp=False, rhobeg=1.0, tol=None)
#opt = SPSA(maxiter=1000, save_steps=1, last_avg=1, c0=0.6283185307179586, c1=0.1, c2=0.602, c3=0.101, c4=0, skip_calibration=False, max_trials=None)
#opt=AQGD(maxiter=200, eta=0.01, tol=0.0000001, disp=True, momentum=0.25)
#opt=ADAM(maxiter=10000, tol=0.0001, lr=0.001, beta_1=0.9, beta_2=0.99, noise_factor=1e-08, eps=1e-10, amsgrad=True, snapshot_dir=None)
ret = opt.optimize(num_vars=4, objective_function=cost_func, initial_point=param)
print(ret)

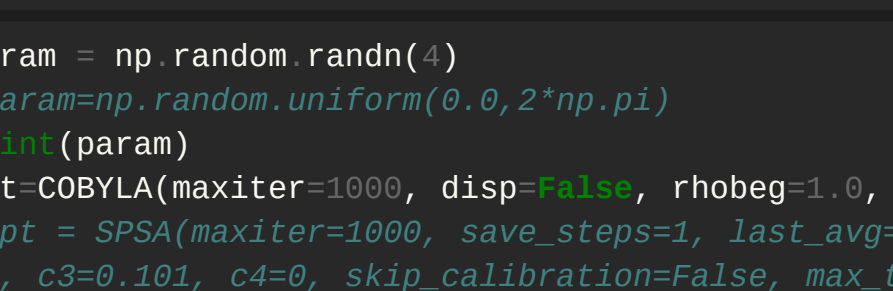
final_param = ret[0]
final_cirq = cirq(final_param)
#final_cirq2 = final_cirq.append(x(1))
final_cirq.draw('mpl')
```

```
[ 0.94591404 -0.38599445 1.08433085 -1.21049775]
(array([[ 0.94584985, 0.38599155, 1.08433061, -0.21090461]], 0.32200000000000006, 42))
```



### (X) Plotted the histogram results.

```
In [201]: backend = BasicAer.get_backend('qasm_simulator')
counts = execute(final_cirq, backend, shots=10).result().get_counts()
plot_histogram(counts)
```



```
In [202]: sans_measurements = QuantumCircuit(2)
sans_measurements.data = final_cirq.data[1:-2]
sans_measurements.draw('mpl')
simulator = Aer.get_backend('statevector_simulator')
result = execute(sans_measurements, backend=simulator).result()
statevector = result.get_statevector()
print(statevector)
```

```
[ 5.45114072e-17+0.j, 2.78998479e-17+0.45549211j
 5.45114072e-17+0.80023082j 2.78998479e-17+0.j
]
```

Above tried using COBYLA for 10 shots of measurement per iteration.

Below for 100 shots

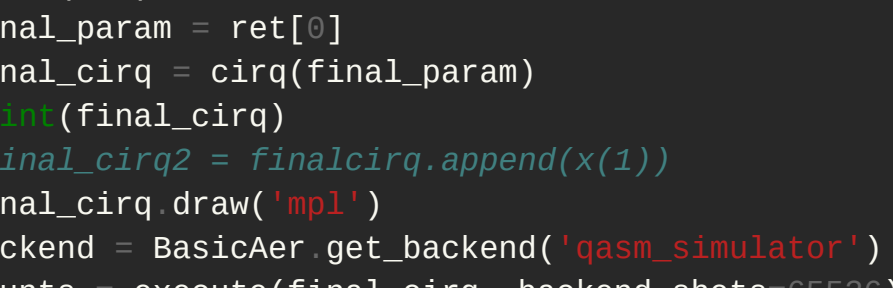
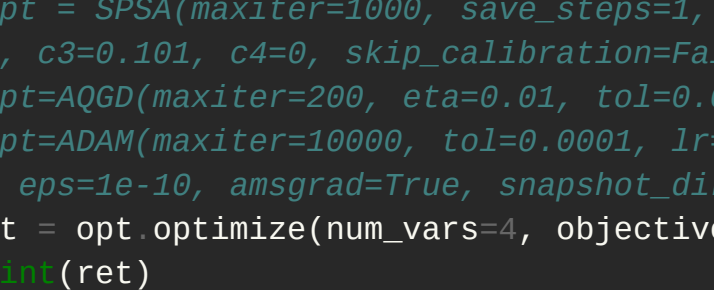
```
In [203]: def cost_func(params):
    qc = cirq(params)
    noise_model = custom_noise_model(2)
    backend = Aer.get_backend('qasm_simulator')
    result = execute(qc, backend, shots=100, noise_model=noise_model).result()
    counts = result.get_counts()
    total = sum(counts.values())
    zero_one = counts['01']/total if '01' in counts.keys() else 0
    one_zero = counts['10']/total if '10' in counts.keys() else 0
    return (0.5-zero_one)**2 + (0.5-one_zero)**2
```

```
In [205]: param = np.random.randn(4)
#param=np.random.uniform(0.0,2*np.pi)
#param = (param)

opt=COBYLA(maxiter=1000, disp=False, rhobeg=1.0, tol=None)
#opt = SPSA(maxiter=1000, save_steps=1, last_avg=1, c0=0.6283185307179586, c1=0.1, c2=0.602, c3=0.101, c4=0, skip_calibration=False, max_trials=None)
#opt=AQGD(maxiter=200, eta=0.01, tol=0.0000001, disp=True, momentum=0.25)
#opt=ADAM(maxiter=10000, tol=0.0001, lr=0.001, beta_1=0.9, beta_2=0.99, noise_factor=1e-08, eps=1e-10, amsgrad=True, snapshot_dir=None)
ret = opt.optimize(num_vars=4, objective_function=cost_func, initial_point=param)
print(ret)

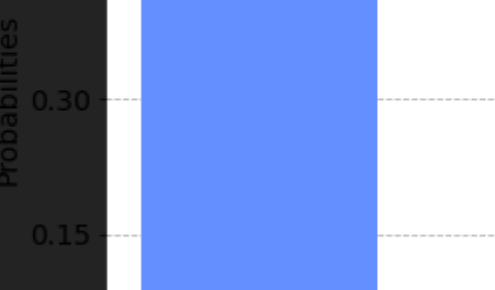
final_param = ret[0]
final_cirq = cirq(final_param)
#final_cirq2 = final_cirq.append(x(1))
final_cirq.draw('mpl')
backend = BasicAer.get_backend('qasm_simulator')
counts = execute(final_cirq, backend, shots=100).result().get_counts()
plot_histogram(counts)
```

```
[ -0.22975138 -0.46685142 -0.46547462 -0.488809147]
(array([[ 1.45079362, 2.64660892, 0.78257993, 1.49608403]], 0.018099999999999999, 49))
```



### (X) Plotted the histogram results.

```
In [206]: sans_measurements = QuantumCircuit(2)
sans_measurements.data = final_cirq.data[1:-2]
sans_measurements.draw('mpl')
```



```
In [177]: simulator = Aer.get_backend('statevector_simulator')
result = execute(sans_measurements, backend=simulator).result()
statevector = result.get_statevector()
print(statevector)
```

```
[ 0.14346554+0.j, 0.0012488 +0.68536891j
 0.12545048+0.129308085j ]
```

Above tried using COBYLA for 100 shot of measurement per iteration.

Below for 1000 shots below.

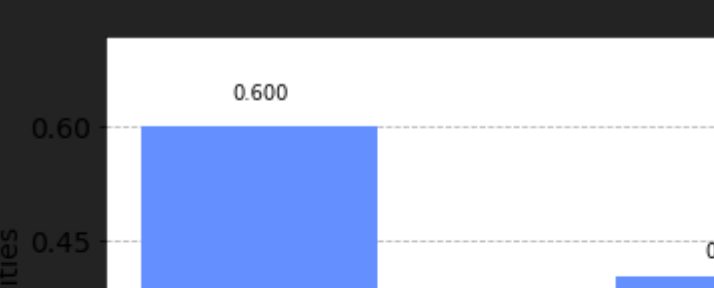
```
In [187]: def cost_func(params):
    qc = cirq(params)
    noise_model = custom_noise_model(2)
    backend = Aer.get_backend('qasm_simulator')
    result = execute(qc, backend, shots=1000, noise_model=noise_model).result()
    counts = result.get_counts()
    total = sum(counts.values())
    zero_one = counts['01']/total if '01' in counts.keys() else 0
    one_zero = counts['10']/total if '10' in counts.keys() else 0
    return (0.5-zero_one)**2 + (0.5-one_zero)**2
```

```
In [189]: param = np.random.randn(4)
#param=np.random.uniform(0.0,2*np.pi)
#param = (param)

opt=COBYLA(maxiter=1000, disp=False, rhobeg=1.0, tol=None)
#opt = SPSA(maxiter=1000, save_steps=1, last_avg=1, c0=0.6283185307179586, c1=0.1, c2=0.602, c3=0.101, c4=0, skip_calibration=False, max_trials=None)
#opt=AQGD(maxiter=200, eta=0.01, tol=0.0000001, disp=True, momentum=0.25)
#opt=ADAM(maxiter=10000, tol=0.0001, lr=0.001, beta_1=0.9, beta_2=0.99, noise_factor=1e-08, eps=1e-10, amsgrad=True, snapshot_dir=None)
ret = opt.optimize(num_vars=4, objective_function=cost_func, initial_point=param)
print(ret)

final_param = ret[0]
final_cirq = cirq(final_param)
#final_cirq2 = final_cirq.append(x(1))
final_cirq.draw('mpl')
backend = BasicAer.get_backend('qasm_simulator')
counts = execute(final_cirq, backend, shots=1000).result().get_counts()
plot_histogram(counts)
```

```
[ 0.75080346 1.46767832 -2.57681328 -2.63202550]
(array([[ 1.58833482, 1.16201415, -0.13341685, -0.99561441]], 0.0803300000000000000056, 55))
```



### (X) Plotted the histogram results.

```
In [207]: sans_measurements = QuantumCircuit(2)
sans_measurements.data = final_cirq.data[1:-2]
sans_measurements.draw('mpl')
simulator = Aer.get_backend('statevector_simulator')
result = execute(sans_measurements, backend=simulator).result()
statevector = result.get_statevector()
print(statevector)
```

```
[ 0.84973981+0.j, 0.07246963+0.22158751j
 -0.86887154+0.04971287j ]
```

### Optional : Above tried using COBYLA for 1000 shot of measurement per iteration.

Tried for 65536 shots below.

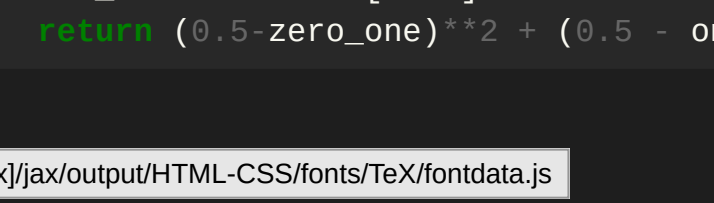
```
In [143]: def cost_func(params):
    qc = cirq(params)
    noise_model = custom_noise_model(2)
    backend = Aer.get_backend('qasm_simulator')
    result = execute(qc, backend, shots=65536, noise_model=noise_model).result()
    counts = result.get_counts()
    total = sum(counts.values())
    zero_one = counts['01']/total if '01' in counts.keys() else 0
    one_zero = counts['10']/total if '10' in counts.keys() else 0
    return (0.5-zero_one)**2 + (0.5-one_zero)**2
```

```
In [144]: param = np.random.randn(4)
#param=np.random.uniform(0.0,2*np.pi)
#param = (param)

opt=COBYLA(maxiter=1000, disp=False, rhobeg=1.0, tol=None)
#opt = SPSA(maxiter=1000, save_steps=1, last_avg=1, c0=0.6283185307179586, c1=0.1, c2=0.602, c3=0.101, c4=0, skip_calibration=False, max_trials=None)
#opt=AQGD(maxiter=200, eta=0.01, tol=0.0000001, disp=True, momentum=0.25)
#opt=ADAM(maxiter=10000, tol=0.0001, lr=0.001, beta_1=0.9, beta_2=0.99, noise_factor=1e-08, eps=1e-10, amsgrad=True, snapshot_dir=None)
ret = opt.optimize(num_vars=4, objective_function=cost_func, initial_point=param)
print(ret)

final_param = ret[0]
final_cirq = cirq(final_param)
#final_cirq2 = final_cirq.append(x(1))
final_cirq.draw('mpl')
backend = BasicAer.get_backend('qasm_simulator')
counts = execute(final_cirq, backend, shots=65536).result().get_counts()
plot_histogram(counts)
```

```
[ 0.53274249 -0.28849664 -0.9971442 -0.25313205]
(array([[ 1.7844717, 0.00383908, -1.00515946, -0.25239541]], 0.00019000225527346344, 51))
```



### (X) Plotted the histogram results.

```
In [145]: sans_measurements = QuantumCircuit(2)
sans_measurements.data = final_cirq.data[1:-2]
sans_measurements.draw('mpl')
simulator = Aer.get_backend('statevector_simulator')
result = execute(sans_measurements, backend=simulator).result()
statevector = result.get_statevector()
print(statevector)
```

```
[ 4.32100044e-17+0.j, 4.33854275e-17+0.7885378j
 4.32100044e-17+0.78607286j 4.33854275e-17+0.j
]
```

### RESULTS 1:

We observe that as we increase the no. of shots from 1 to 10 to 100 and eventually to 1000 and 65536, the desired probabilities (equal prob for |01> and |10>) occurred more accurately even in presence of noise. As we observed for 1 shot, we just get the state |0> (with 100% prob), and when we increased it to 10 shots, the probabilities became 20% and 80% respectively (better than 1 shot). And upon increasing it to 100 and ultimately to 1000 and 65536 shots, we observed the probabilities improved significantly (almost 50 percent each for |01> and |10>) as required. Also, the statevectors have relative phases in them, i.e. the statevectors we get for 1000 shots (where our desired probabilities are achieved) are of the form  $|01\rangle + e^{i\phi}|10\rangle$ , where  $\phi$  is non-zero.

## We Attempt A again using SPSA optimiser now

For 10 shots below:

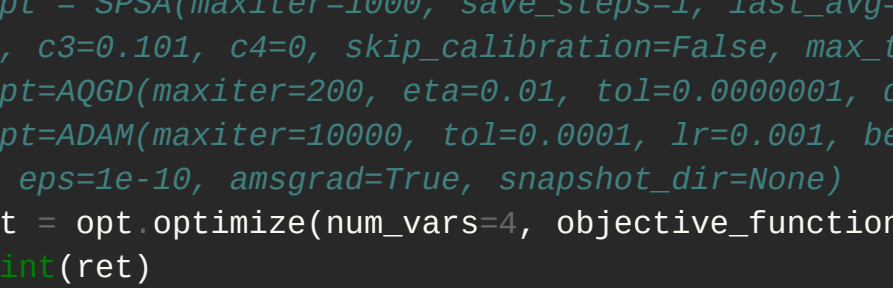
```
In [24]: def cost_func(params):
    qc = cirq(params)
    noise_model = custom_noise_model(2)
    backend = Aer.get_backend('qasm_simulator')
    result = execute(qc, backend, shots=10, noise_model=noise_model).result()
    counts = result.get_counts()
    total = sum(counts.values())
    zero_one = counts['01']/total if '01' in counts.keys() else 0
    one_zero = counts['10']/total if '10' in counts.keys() else 0
    return (0.5-zero_one)**2 + (0.5-one_zero)**2
```

```
In [25]: param = np.random.randn(4)
#param=np.random.uniform(0.0,2*np.pi)
#param = (param)

opt=COBYLA(maxiter=1000, disp=False, rhobeg=1.0, tol=None)
#opt = SPSA(maxiter=1000, save_steps=1, last_avg=1, c0=0.6283185307179586, c1=0.1, c2=0.602, c3=0.101, c4=0, skip_calibration=False, max_trials=None)
#opt=AQGD(maxiter=200, eta=0.01, tol=0.0000001, disp=True, momentum=0.25)
#opt=ADAM(maxiter=10000, tol=0.0001, lr=0.001, beta_1=0.9, beta_2=0.99, noise_factor=1e-08, eps=1e-10, amsgrad=True, snapshot_dir=None)
ret = opt.optimize(num_vars=4, objective_function=cost_func, initial_point=param)
print(ret)

final_param = ret[0]
final_cirq = cirq(final_param)
#final_cirq2 = final_cirq.append(x(1))
final_cirq.draw('mpl')
```

```
[ -1.81745228 0.17393514 -0.64516695 0.38927822]
(array([[ 1.40797862, 0.76200862, 2.68191469, 0.90536135]], 0.089999999999999995, None))
```



### FOR 1000 shots below:

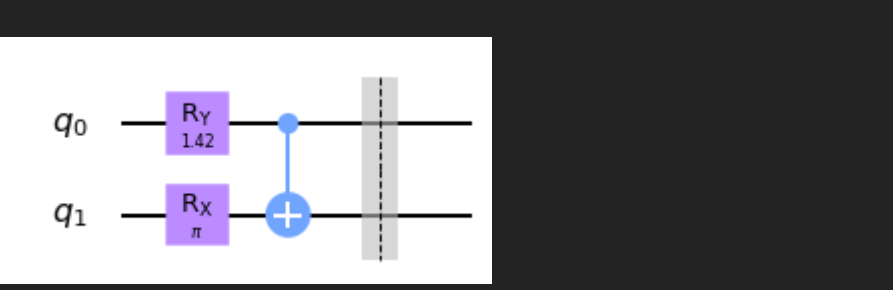
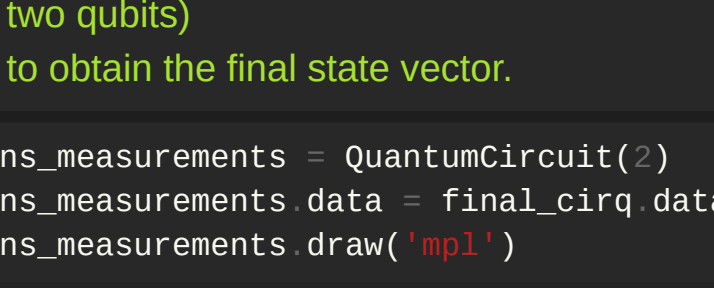
```
In [28]: def cost_func(params):
    qc = cirq(params)
    noise_model = custom_noise_model(2)
    backend = Aer.get_backend('qasm_simulator')
    result = execute(qc, backend, shots=1000, noise_model=noise_model).result()
    counts = result.get_counts()
    total = sum(counts.values())
    zero_one = counts['01']/total if '01' in counts.keys() else 0
    one_zero = counts['10']/total if '10' in counts.keys() else 0
    return (0.5-zero_one)**2 + (0.5-one_zero)**2
```

```
In [28]: param = np.random.randn(4)
#param=np.random.uniform(0.0,2*np.pi)
#param = (param)

opt=COBYLA(maxiter=1000, disp=False, rhobeg=1.0, tol=None)
#opt = SPSA(maxiter=1000, save_steps=1, last_avg=1, c0=0.6283185307179586, c1=0.1, c2=0.602, c3=0.101, c4=0, skip_calibration=False, max_trials=None)
#opt=AQGD(maxiter=200, eta=0.01, tol=0.0000001, disp=True, momentum=0.25)
#opt=ADAM(maxiter=10000, tol=0.0001, lr=0.001, beta_1=0.9, beta_2=0.99, noise_factor=1e-08, eps=1e-10, amsgrad=True, snapshot_dir=None)
ret = opt.optimize(num_vars=4, objective_function=cost_func, initial_point=param)
print(ret)

final_param = ret[0]
final_cirq = cirq(final_param)
#final_cirq2 = final_cirq.append(x(1))
final_cirq.draw('mpl')
```

```
[ 0.63744351 -1.38891198 -2.80146029 0.43202250]
(array([[ 1.59289894, 1.16201415, -0.13341685, -0.99561441]], 0.0162, None))
```



### FOR 1000 shots below:

```
In [32]: def cost_func(params):
    qc = cirq(params)
    noise_model = custom_noise_model(2)
    backend = Aer.get_backend('qasm_simulator')
    result = execute(qc, backend, shots=1000, noise_model=noise_model).result()
    counts = result.get_counts()
    total = sum(counts.values())
    zero_one = counts['01']/total if '01' in counts.keys() else 0
    one_zero = counts['10']/total if '10' in counts.keys() else 0
    return (0.5-zero_one)**2 + (0.5-one_zero)**2
```

```
In [32]: param = np.random.randn(4)
#param=np.random.uniform(0.0,2*np.pi)
#param = (param)

opt=COBYLA(maxiter=1000, disp=False, rhobeg=1.0, tol=None)
#opt = SPSA(maxiter=1000, save_steps=1, last_avg=1, c0=0.6283185307179586, c1=0.1, c2=0.602, c3=0.101, c4=0, skip_calibration=False, max_trials=None)
#opt=AQGD(maxiter=200, eta=0.01, tol=0.0000001, disp=True, momentum=0.25)
#opt=ADAM(maxiter=10000, tol=0.0001, lr=0.001, beta_1=0.9, beta_2=0.99, noise_factor=1e-08, eps=1e-10, amsgrad=True, snapshot_dir=None)
ret = opt.optimize(num_vars=4, objective_function=cost_func, initial_point=param)
print(ret)

final_param = ret[0]
final_cirq = cirq(final_param)
#final_cirq2 = final_cirq.append(x(1))
final_cirq.draw('mpl')
```

```
[ 0.63744351 -1.38891198 -2.80146029 0.43202250]
(array([[ 1.59289894, 1.16201415, -0.13341685, -0.99561441]], 0.0162, None))
```

