

Solving the 4-Coloring Problem using a Quantum Circuit Generator

In this paper, we solve the 4-Coloring problem using a quantum algorithm. We go beyond the theory and implement this using Qiskit and run it on a quantum simulator, and so that it can be run on a future quantum computer with longer decoherence time. As the code gets rather long, to avoid making mistakes in quantum uncomputation, we introduce the SafeCircuit class, which when used properly, takes care of uncomputation.

We import qiskit:

In [49]:

```
1 import numpy as np
2 import matplotlib.pyplot as plt
3 %matplotlib inline
4
5 # importing Qiskit
6 from qiskit import BasicAer, IBMQ
7 from qiskit import QuantumCircuit, ClassicalRegister, QuantumRegister, execute
8 from qiskit.tools.visualization import plot_histogram
```

We need to extend the n-Controlled Z gate provided in the qiskit tutorial at <https://github.com/Qiskit/qiskit-tutorials> (<https://github.com/Qiskit/qiskit-tutorials>) to allow 4 controls. This requires the use of auxiliary qubits.

```

In [51]: 1 def n_controlled_Z(circuit, controls, target, aux2=None):
2         """Implement a Z gate with multiple controls"""
3
4         # considers nothing about the topology.
5         if (len(controls) > 4):
6             raise ValueError('The controlled Z with more than 4 ' +
7                               'controls is not implemented')
8         elif (len(controls) == 1):
9             circuit.h(target)
10            circuit.cx(controls[0], target)
11            circuit.h(target)
12        elif (len(controls) == 2):
13            circuit.h(target)
14            circuit.ccx(controls[0], controls[1], target)
15            circuit.h(target)
16        elif (len(controls) >= 3):
17            if not len(aux2) >= 2: raise Exception("Need auxiliary qubits")
18
19            if (len(controls) == 3):
20                circuit.h(target)
21                circuit.ccx(controls[0], controls[1], aux2[0])
22                circuit.ccx(controls[2], aux2[0], target)
23                circuit.ccx(controls[0], controls[1], aux2[0])
24                circuit.h(target)
25
26            else:
27                raise Exception("This ncZ gate is not implemented")
28

```

```

In [56]: 1 def inversion_about_average(circuit, f_in, n, aux2):
2         """Apply inversion about the average step of Grover's algorithm."""
3         # Hadamards everywhere
4         for j in range(n):
5             circuit.h(f_in[j])
6         # D matrix: flips the sign of the state |000> only
7         for j in range(n):
8             circuit.x(f_in[j])
9         n_controlled_Z(circuit, [f_in[j] for j in range(n-1)], f_in[n-1], aux2)
10        for j in range(n):
11            circuit.x(f_in[j])
12        # Hadamards everywhere again
13        for j in range(n):
14            circuit.h(f_in[j])
15        # -- end function

```

Now, let's write an oracle to 2-color a graph of length 3. The full code for Grover's algorithm is in the last cell of this document; the function to run can be changed by changing `oracle_func`.

```
In [70]: 1 def color_works(circuit, f_in, f_out, aux, n):
2         # see if you can two-color the straight graph of length 3
3
4         circuit.cx(f_in[0], aux[0])
5         circuit.cx(f_in[1], aux[0])
6
7         circuit.cx(f_in[1], aux[1])
8         circuit.cx(f_in[2], aux[1])
9
10        circuit.ccx(aux[0], aux[1], f_out[0])
11
12        # Uncompute
13        circuit.cx(f_in[2], aux[1])
14        circuit.cx(f_in[1], aux[1])
15
16        circuit.cx(f_in[1], aux[0])
17        circuit.cx(f_in[0], aux[0])
```

Here is the SafeCircuit. We provide operations for combining multiple individual circuits.

In [52]:

```
1 import copy
2
3 class Operation():
4     #self.op = None
5     #self.dirty = None
6
7     def __init__(self, op, dirty):
8         #TODO add an ID for printing
9         self.op = op
10        self.dirty = dirty
11
12    def __str__(self):
13        return self.op[0]+"("+", ".join(repr(e) for e in self.op[1:])+")"+"
14
15    def write(self, cir):
16        func = self.op[0] # this might not work, might have to pass cir.func
17        getattr(cir, func)(*self.op[1:])
18
19 class SafeCircuit():
20     written = dict()
21
22     #self.cir = None
23
24    def __init__(self, cir):
25        self.cir = cir
26        self.l = []
27        self.oplist = []
28        SafeCircuit.written[self.cir.name] = False # todo some way to hash i
29
30    def __str__(self):
31        self.finalize()
32        return "\n".join(str(e) for e in self.oplist)
33    # could include something if we make sure dirty are not actually used ag
34    # this would work for final ones also, because they are never reset
35
36    def add_op(self, *op, dirty=False): # advanced: isoutput should be set o
37        self.l.append(Operation(op, dirty))
38        # we should be able to get away with only one level, 'dirty'. Other
39
40    def add_cir(self, subcir): # don't carry through dirty. The dirty will
41        subops = subcir.finalize()
42        for op in subops:
43            op2 = copy.deepcopy(op)
44            op2.dirty = False
45            # do these actually need to be uncomputed at the end, or can the
46            # I think they all need to be to reverse the central one that is
47            self.l.append(op2)
48
49    def blind_concat(self, other):
50        raise Exception("Why would you do this?")
51        # self.l += copy.deepcopy(other.l)
52
53    def __iter__(self):
54        for i in range(len(self.oplist)):
55            yield self.oplist[i]
56
```

```

57     def finalize(self): # just builds the necessary list; you can do this mo
58         oplist = []
59
60         for i in range(len(self.l)):
61             op = self.l[i].op
62             oplist.append(self.l[i])
63
64         for i in range(len(self.l)-1, -1, -1):
65             # dirty or not is ignored when executing individually
66             if not self.l[i].dirty:
67                 op = self.l[i].op
68                 oplist.append(self.l[i])
69
70         self.oplist = oplist
71         return oplist
72
73     def dowrite(self):
74         for op in self.oplist:
75             op.write(self.cir)
76
77     def write(self):
78         #TODO check if the self.cir is empty before writing
79
80         if SafeCircuit.written[self.cir.name]:
81             raise Exception("You have already written a SafeCircuit to this
82
83         self.finalize()
84
85         SafeCircuit.written[self.cir.name] = True
86         self.dowrite()
87
88

```

We write various functions, working our way up to 4-coloring a graph.

```

In [54]: 1 def color2_works_safe_old(circuit, f_in, f_out, aux, n):
2         # see if you can two-color the straight graph of length 4
3         # make sure color 0 is vertex 0
4
5         # check connection 0-1
6
7         sc = SafeCircuit(circuit)
8         sc.add_op('cx', f_in[0], aux[0])
9         sc.add_op('cx', f_in[1], aux[0])
10
11
12        inv2 = SafeCircuit(circuit)
13        inv2.add_op('x', f_in[2])
14        inv2.add_op('cx', f_in[2], aux[1], dirty=True)
15
16
17        print("this is inv2: \n" + "\n".join(str(e) for e in inv2.l))
18
19        sc.add_op('cx', f_in[1], aux[1])
20        sc.add_cir(inv2)
21
22        sc.add_op('ccx', aux[0], aux[1], f_out[0], dirty=True) # !
23
24        print("Executing: \n" + "\n".join(str(e) for e in sc.oplist))
25
26        sc.write()

```

```

In [55]: 1 def color2_works_safe(circuit, f_in, f_out, aux, n):
2         # see if you can two-color the straight graph of length 4
3         # make sure color 0 is vertex 0
4
5         # check connection 0-1
6
7         sc = SafeCircuit(circuit)
8         sc.add_op('cx', f_in[0], aux[0])
9         sc.add_op('cx', f_in[1], aux[0])
10
11        sc.add_op('cx', f_in[1], aux[1])
12        sc.add_op('cx', f_in[2], aux[1])
13        #print("this is inv2: \n" + "\n".join(str(e) for e in inv2.l))
14
15        sc.add_op('ccx', aux[0], aux[1], f_out[0], dirty=True) # !
16
17        print("Executing: \n" + str(sc) + "\n".join(str(e) for e in sc.oplist))
18
19        sc.write()

```

```

In [57]: 1 def color2_works_safe_force0(circuit, f_in, f_out, aux, n):
2         # see if you can two-color the straight graph of length 4
3         # make sure color 0 is vertex 0
4
5         # check connection 0-1
6
7         sc = SafeCircuit(circuit)
8         sc.add_op('cx', f_in[0], aux[0])
9         sc.add_op('cx', f_in[1], aux[0])
10
11        sc.add_op('cx', f_in[1], aux[1])
12        sc.add_op('cx', f_in[2], aux[1])
13
14        inv2 = SafeCircuit(circuit)
15        inv2.add_op('x', f_in[2])
16        inv2.add_op('cx', f_in[2], aux[2], dirty=True)
17        sc.add_cir(inv2)
18
19        #print("this is inv2: \n" + "\n".join(str(e) for e in inv2.L))
20
21        sc.add_op('ccx', aux[0], aux[1], aux[3])
22        sc.add_op('ccx', aux[3], aux[2], f_out[0], dirty=True) # !
23
24        #print("Executing: \n" + str(sc)) # "\n".join(str(e) for e in sc.oplist))
25
26        sc.write()

```

```

In [58]: 1 def color2_works_safe_forcenot1(circuit, f_in, f_out, aux, n):
2         # see if you can two-color the straight graph of length 4
3         # make sure color 0 is vertex 0
4
5         # check connection 0-1
6
7         sc = SafeCircuit(circuit)
8         sc.add_op('cx', f_in[0], aux[0])
9         sc.add_op('cx', f_in[1], aux[0])
10
11        sc.add_op('cx', f_in[1], aux[1])
12        sc.add_op('cx', f_in[2], aux[1])
13
14        inv2 = SafeCircuit(circuit)
15        inv2.add_op('cx', f_in[2], aux[2])
16        inv2.add_op('x', aux[2], dirty=True)
17        sc.add_cir(inv2)
18
19        #print("this is inv2: \n" + "\n".join(str(e) for e in inv2.L))
20
21        sc.add_op('ccx', aux[0], aux[1], aux[3])
22        sc.add_op('ccx', aux[3], aux[2], f_out[0], dirty=True) # !
23
24        #print("Executing: \n" + str(sc)) # "\n".join(str(e) for e in sc.oplist))
25
26        sc.write()

```

In [53]:

```
1 def twocolor_sample(circuit, f_in, f_out, aux, n):
2     # see if you can two-color the straight graph of length 4
3     # make sure color 0 is vertex 0
4
5     # check connection 0-1
6
7     sc = SafeCircuit(circuit)
8
9
10    s1 = SafeCircuit(circuit)
11
12    s1.add_op('cx', f_in[0], aux[0])
13    s1.add_op('cx', f_in[2], aux[0])
14    s1.add_op('x', aux[0])
15
16    s1.add_op('cx', f_in[1], aux[1])
17    s1.add_op('cx', f_in[3], aux[1])
18    s1.add_op('x', aux[1])
19
20    s1.add_op('ccx', aux[0], aux[1], aux[8], dirty=True)
21    s1.add_op('x', aux[8], dirty=True)
22
23    sc.add_cir(s1) # now can we reuse 0 and 1?
24
25
26    s2 = SafeCircuit(circuit)
27
28    s2.add_op('cx', f_in[2], aux[0])
29    s2.add_op('cx', f_in[4], aux[0])
30    s2.add_op('x', aux[0])
31
32    s2.add_op('cx', f_in[3], aux[1])
33    s2.add_op('cx', f_in[5], aux[1])
34    s2.add_op('x', aux[1])
35
36    s2.add_op('ccx', aux[0], aux[1], aux[7], dirty=True)
37    s2.add_op('x', aux[7], dirty=True)
38
39    sc.add_cir(s2) # now can we reuse 0 and 1?
40
41
42    sc.add_op('ccx', aux[8], aux[7], f_out[0], dirty=True)
43
44    sc.write()
45
```


In [71]:

```
1
2 def color4_works_safe(circuit, f_in, f_out, aux, n):
3     # see if you can four-color the straight graph of length 2 with some cor
4
5     # check connection 0-1
6
7     #sc = SafeCircuit(circuit)
8
9
10    s1 = SafeCircuit(circuit)
11
12    s1.add_op('cx', f_in[0], aux[0])
13    s1.add_op('cx', f_in[2], aux[0])
14    s1.add_op('x', aux[0])
15
16    s1.add_op('cx', f_in[1], aux[1])
17    s1.add_op('cx', f_in[3], aux[1])
18    s1.add_op('x', aux[1])
19
20    s1.add_op('ccx', aux[0], aux[1], aux[8], dirty=True)
21    s1.add_op('x', aux[8], dirty=True)
22
23    # now can we reuse 0 and 1
24
25    #curation = 2
26    ## simulate a fixed 1 connected to point 2 of the graph
27
28    desired_colors=[3,0]
29
30    for node,color in enumerate(desired_colors):
31        curation = 2+node
32        print("curation", curation)
33        assert 2 <= curation < 7
34
35        for term in range(4):
36            if term != color: # and (node == 0 or term != desired_colors[nod
37                s3_i = SafeCircuit(circuit)
38                bs = bin(term)[2:].zfill(2)
39                for i in range(len(bs)):
40                    print("node", node, "color", color, "term", term, "bs",
41                        if bs[i] == '0':
42                            s3_i.add_op('cx', f_in[2*node+i], aux[i])
43                            s3_i.add_op('x', aux[i])
44                        elif bs[i] == '1':
45                            rev5into1 = SafeCircuit(circuit)
46                            rev5into1.add_op('x', f_in[2*node+i])
47                            rev5into1.add_op('cx', f_in[2*node+i], aux[i], dirty
48                            s3_i.add_cir(rev5into1)
49                            #print("rev5into1",rev5into1)
50                            s3_i.add_op('x', aux[i])
51
52                else:
53                    raise Exception("Internal error converting to binary
54
55                #s3_i.add_op('x', aux[i])
56
```

```

57         s3_i.add_op('ccx', aux[0], aux[1], aux[curaux], dirty=True)
58         s3_i.add_op('x', aux[curaux], dirty=True)
59
60         print("node", node, "color", color, "term", term)# "s3_i:\n"
61         s1.add_cir(s3_i)
62
63
64
65         #finalcir1 = SafeCircuit(circuit)
66         #finalcir1.add_op('ccx', aux[8], aux[7], aux[1])
67         #finalcir1.add_op('ccx', aux[1], aux[2], aux[0])
68         #finalcir1.add_op('ccx', aux[8], aux[7], aux[1])
69         s1.add_op('ccx', aux[8], aux[2], aux[5])
70         s1.add_op('ccx', aux[5], aux[3], f_out[0], dirty=True)
71         #sc.add_cir(finalcir1)
72
73         '''
74         finalcir2 = SafeCircuit(circuit)
75         finalcir2.add_op('ccx', aux[0], aux[3], aux[1])
76         finalcir2.add_op('ccx', aux[1], aux[4], f_out[0], dirty=True)
77         sc.add_cir(finalcir2)
78         '''
79
80
81         s1.write()
82
83
84
85         '''
86         circuit.cx(f_in[2], aux[2]) # f_in[2] should be 1, or 0 if x'd. As if c
87
88
89         circuit.cx(f_in[0], aux[4]) # f_in[0] should be 1, or 0 if x'd.
90         '''
91
92         '''
93         circuit.ccx(aux[0], aux[1], aux[3])
94         circuit.ccx(aux[3], aux[2], aux[5])
95
96         circuit.ccx(aux[5], aux[4], f_out[0]) # !
97
98         circuit.ccx(aux[3], aux[2], aux[5])
99         circuit.ccx(aux[0], aux[1], aux[3])
100         '''
101
102
103         #sc.add_op('ccx', aux[0], aux[1], f_out[0], dirty=True) # !
104
105
106         #print("Executing: \n" + "\n".join(str(e) for e in s1.opList))
107
108
109         '''
110         circuit.cx(f_in[0], aux[4]) # f_in[0] should be 1, or 0 if x'd.
111
112         circuit.cx(f_in[2], aux[2]) # f_in[2] should be 1, or 0 if x'd.
113         '''

```

```

114
115
116     #circuit.cx(f_in[2], aux[1])
117     #circuit.cx(f_in[1], aux[1])
118
119
120     #circuit.cx(f_in[1], aux[0])
121     #circuit.cx(f_in[0], aux[0])
122

```

In [72]:

```

1  def color4_works_safe_force0(circuit, f_in, f_out, aux, n):
2      # see if you can two-color the straight graph of length 4
3      # make sure color 0 is vertex 0
4
5      # check connection 0-1
6
7      sc = SafeCircuit(circuit)
8
9
10     s1 = SafeCircuit(circuit)
11
12     s1.add_op('cx', f_in[0], aux[0])
13     s1.add_op('cx', f_in[2], aux[0])
14     s1.add_op('x', aux[0])
15
16     s1.add_op('cx', f_in[1], aux[1])
17     s1.add_op('cx', f_in[3], aux[1])
18     s1.add_op('x', aux[1])
19
20     s1.add_op('ccx', aux[0], aux[1], aux[8])
21     s1.add_op('x', aux[8])
22
23     s1.add_op('cx', f_in[0], aux[2])
24     s1.add_op('cx', f_in[1], aux[3])
25
26     finalcir1.add_op('ccx', aux[8], aux[2], aux[5])
27     finalcir1.add_op('ccx', aux[5], aux[3], f_out[0], dirty=True)
28
29     sc.add_cir(s1) # now can we reuse 0 and 1?

```

Here is the code for Grover's Algorithm, based on the Qiskit code. To change the function, change `oracle_func` and change `T` to change the number of iterations of Grover's Algorithm.

In [75]:

```
1  # Them
2
3  """
4  Grover search implemented in Qiskit.
5
6  This module contains the code necessary to run Grover search on 3
7  qubits, both with a simulator and with a real quantum computing
8  device. This code is the companion for the paper
9  "An introduction to quantum computing, without the physics",
10  Giacomo Nannicini, https://arxiv.org/abs/1708.03684.
11  """
12
13  def input_state(circuit, f_in, f_out, n):
14      """(n+1)-qubit input state for Grover search."""
15      for j in range(n):
16          circuit.h(f_in[j])
17          circuit.x(f_out)
18          circuit.h(f_out)
19  # -- end function
20
21  # Make a quantum program for the n-bit Grover search.
22
23
24  funcstonumqubits = {color4_works_safe: 4, color2_works_safe: 3}
25
26
27  oracle_func = color4_works_safe #color2_works_safe_force0 #color4_oneseg_saf
28  n = 3
29
30  if oracle_func in funcstonumqubits:
31      n = funcstonumqubits[oracle_func]
32
33  # n = 4 # remove!
34
35  # Exactly-1 3-SAT formula to be satisfied, in conjunctive
36  # normal form. We represent literals with integers, positive or
37  # negative, to indicate a Boolean variable or its negation.
38  exactly_1_3_sat_formula = [[1, 2, -3], [-1, -2, -3], [-1, 2, 3], [1, 2, -3]]
39
40  # Define three quantum registers: 'f_in' is the search space (input
41  # to the function f), 'f_out' is bit used for the output of function
42  # f, aux are the auxiliary bits used by f to perform its
43  # computation.
44  f_in = QuantumRegister(n)
45  f_out = QuantumRegister(1)
46  aux = QuantumRegister(9) #len(exactly_1_3_sat_formula) + 1)
47  aux2 = QuantumRegister(2)
48
49  # Define classical register for algorithm result
50  ans = ClassicalRegister(n)
51
52
53
54  # Define quantum circuit with above registers
55  grover = QuantumCircuit()
56  print(grover.name)
```

```

57 grover.add_register(f_in)
58 grover.add_register(f_out)
59 grover.add_register(aux)
60 grover.add_register(aux2)
61 grover.add_register(ans)
62
63 input_state(grover, f_in, f_out, n)
64
65 NUMSHOTS = 50
66
67 import math
68 T = int(math.pi/4.0 * math.sqrt(2**n))
69 print(n, "qubits")
70 T = 2
71 print("Performing", T, "iterations of the Grover's Algorithm", "with", repr(
72
73
74 for t in range(T):
75     # Apply T full iterations
76     #black_box_u_f(grover, f_in, f_out, aux, n, exactly_1_3_sat_formula)
77     #example_is010_v0(grover, f_in, f_out, aux, n)
78     #color4_works_safe(grover, f_in, f_out, aux, n)
79     '''inversion_about_average(grover, f_in, n, aux2)
80     oracle_func(grover, f_in, f_out, aux, n)
81     '''
82
83     oracle_func(grover, f_in, f_out, aux, n)
84     inversion_about_average(grover, f_in, n, aux2)
85
86
87
88 # Measure the output register in the computational basis
89 for j in range(n):
90     grover.measure(f_in[j], ans[j])
91
92 # Execute circuit
93 backend = BasicAer.get_backend('qasm_simulator')
94 job = execute([grover], backend=backend, shots=NUMSHOTS)
95 result = job.result()
96
97 # Get counts and plot histogram
98 counts = result.get_counts(grover)
99 print(counts)
100 plot_histogram(counts)

```

circuit32

4 qubits

Performing 2 iterations of the Grover's Algorithm with <function color4_works_s
afe at 0x135C1E88> 50 times

curaux 2

node 0 color 3 term 0 bs 00 bs[i] 0

node 0 color 3 term 0 bs 00 bs[i] 0

node 0 color 3 term 0

node 0 color 3 term 1 bs 01 bs[i] 0

node 0 color 3 term 1 bs 01 bs[i] 1

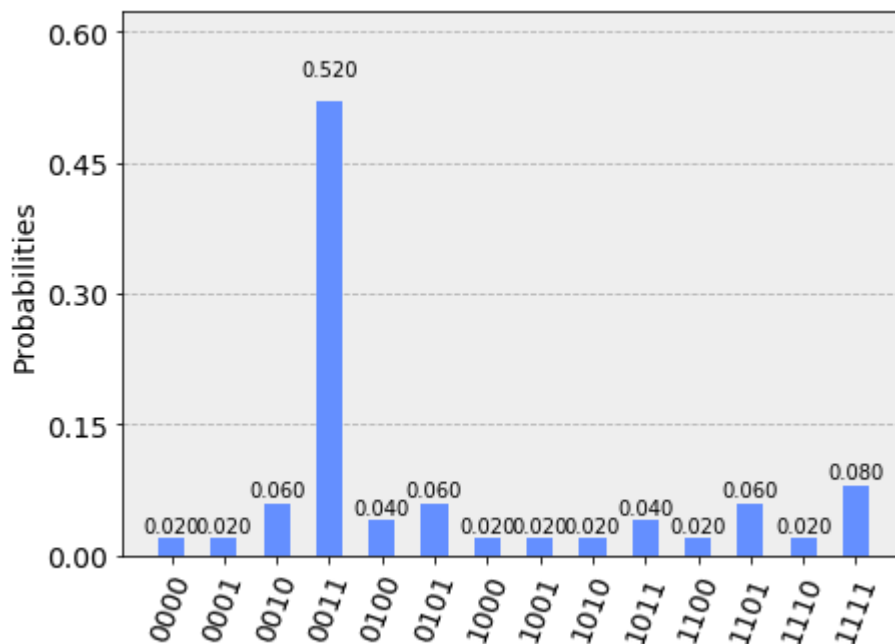
node 0 color 3 term 1

```

node 0 color 3 term 2 bs 10 bs[i] 1
node 0 color 3 term 2 bs 10 bs[i] 0
node 0 color 3 term 2
curaux 3
node 1 color 0 term 1 bs 01 bs[i] 0
node 1 color 0 term 1 bs 01 bs[i] 1
node 1 color 0 term 1
node 1 color 0 term 2 bs 10 bs[i] 1
node 1 color 0 term 2 bs 10 bs[i] 0
node 1 color 0 term 2
node 1 color 0 term 3 bs 11 bs[i] 1
node 1 color 0 term 3 bs 11 bs[i] 1
node 1 color 0 term 3
curaux 2
node 0 color 3 term 0 bs 00 bs[i] 0
node 0 color 3 term 0 bs 00 bs[i] 0
node 0 color 3 term 0
node 0 color 3 term 1 bs 01 bs[i] 0
node 0 color 3 term 1 bs 01 bs[i] 1
node 0 color 3 term 1
node 0 color 3 term 2 bs 10 bs[i] 1
node 0 color 3 term 2 bs 10 bs[i] 0
node 0 color 3 term 2
curaux 3
node 1 color 0 term 1 bs 01 bs[i] 0
node 1 color 0 term 1 bs 01 bs[i] 1
node 1 color 0 term 1
node 1 color 0 term 2 bs 10 bs[i] 1
node 1 color 0 term 2 bs 10 bs[i] 0
node 1 color 0 term 2
node 1 color 0 term 3 bs 11 bs[i] 1
node 1 color 0 term 3 bs 11 bs[i] 1
node 1 color 0 term 3
{'0100': 2, '1010': 1, '0101': 3, '1001': 1, '1111': 4, '0001': 1, '1101': 3,
'0010': 3, '1000': 1, '1110': 1, '1011': 2, '1100': 1, '0011': 26, '0000': 1}

```

Out[75]:



In []:

1