

# HW3 Project Details Document

## 1. Question 1 Plain Backtracking (BT):

- **Code Details:**

```
#do not modify the function names
#You are given L and M as input
#Each of your functions should return the minimum possible L value alongside the marker positions
#Or return -1,[] if no solution exists for the given L

#Your backtracking function implementation
def BT(L, M):
    """ YOUR CODE HERE """

    # The set of Golomb Rulers

    gRuler = Golomb_Ruler(M, L)
    csp_bt = CSPBackTrack(gRuler)

    print("Implementation of CSP for the problem Golomb Ruler by Gourab Bhattacharyya - 170048888 \n")
    print ("Golomb Ruler - M: " + str(gRuler.M) + ", L: " + str(gRuler.L) + "\n")

    result, pathDict = algoTime(csp_bt)

    if result:
        resultList = []
        for key, value in pathDict.iteritems():
            resultList.append(value)
        print "Final Result", (len(pathDict), resultList)
        return (len(pathDict), resultList)
    else:
        print "Final Result", (-1,[])
        return (-1,[])

#Define Golomb Ruler class and set order M and length L for the CSP
class Golomb_Ruler:
    M = 0 # Order
    L = 0 # Length

    def __init__(self, M, L):
        self.M = M
        self.L = L

def timing(f):
    def wrap(*args):
        time1 = time.time()
        ret = f(*args)
        time2 = time.time()
        print('%s function took %0.3f ms' % (f.__name__, (time2 - time1) * 1000.0))
        print("=====end of trace=====")
        #print('\n')
        return ret
    return wrap

@timing
def algoTime(csp):
    print("=====start of trace=====")
    print("Running " + csp.__class__.__name__ + " algorithm")
    m = backtracking_search(csp)
    print("Number of consistency checks: "+str(csp.counter))
    if m is not False:
        for i in range(len(m)):
            print("M" + str(i) + ": " + str(m[i]))
        return True, m
    else:
        print("No solution")
        return False, m
```

```

def backtrack_search(csp): ..... #This is generic backtrack search
    return backtrack(csp.assignment, csp)

def backtrack(assignment, csp): ..... #This will take assignment and CSP object as input and do a backtrack through all the nodes
    if csp.complete(assignment): #if the assignment is complete and valid, return the result
        return assignment

    var = csp.selectUnassignedVariables()
    domainVals = csp.findDomainValues(var, assignment)

    for value in domainVals:
        csp.counter += 1 ..... # increase the counter for each consistency check

        if csp.consistent(var, value, assignment): ..... #if value is consistent
            assignment[var] = value
            domain = []

            for idx in range(csp.n):
                tempList = []
                for idx in range(csp.d):
                    tempList.append(1)
                domain.append(tempList)

            csp.deepcopyDomain(domain, csp.domain)

            inferences = csp.inference(var, value)

            if inferences is not False: ..... #add inferences to assignment
                for inference in inferences:
                    assignment[inference[0]] = inference[1]

                #print "Count, Assignment", csp.counter, assignment
                result = backtrack(assignment, csp)

                if result:
                    return result

            assignment[var] = None ..... #remove {var = value} and inferences from assignment
            csp.deepcopyDomain(csp.domain, domain) ..... #restore the domain values

            if inferences is not False:
                for inference in inferences:
                    assignment[inference[0]] = None

    return False

```

```

class CSPBackTrack: ..... #This is used for backtrack functionality

    n = 0 ..... #number of variables
    d = 0 ..... #domain of variables
    c=0 ..... #number of constraints
    counter = 0
    consistentDict = dict()

    def __init__(self, ruler):
        self.n = ruler.M
        self.d = ruler.L + 1
        self.domain = []
        self.assignment = dict()

        for order in range(self.n):
            tempList = []
            for item in range(self.d):
                tempList.append(1)
            self.domain.append(tempList)

        for i in range(self.n):
            self.assignment[i] = None

    def complete(self, assignment): ..... #check for assignment completeness

        for i in range(self.n):
            if assignment[i] == None:
                return False

        return True

    def selectUnassignedVariables(self): ..... #Find the index of first any unassigned variable

        for i in range(self.n):
            if self.assignment[i] is None:
                return i

```

```

def findDomainValues(self, item, assignment):.....#find possible values in the domain

    possibleValues = []

    if item is not None:
        for i in range(len(self.domain[item])):
            if self.domain[item][i] != 0:
                possibleValues.append(i)

    return possibleValues

def consistent(self, item, value, sourceAssignment):.....#check is the new assignment is consistent

    assignment = {}
    distance = []

    for i in range(0, len(sourceAssignment)):
        if i == item:
            assignment[i] = value
        else:
            assignment[i] = sourceAssignment[i]

    if tuple(assignment.items()) in self.consistentDict:
        return self.consistentDict[tuple(assignment.items())]

    for i in range(1, len(assignment)):
        if assignment[i] is None or assignment[i-1] is None:
            continue

        if not (assignment[i] > assignment[i-1]):
            self.consistentDict[tuple(assignment.items())] = False
            return False

    for i in range(self.n):
        for j in range(self.n - 1 - i):
            b = assignment[self.n - 1 - i]
            a = assignment[(self.n - 1 - i) - (j + 1)]
            if b is None or a is None:
                continue

            distance.append(b-a)

    distance.sort()
    temp = None

    for i in range(len(distance)):
        if distance[i] == temp:
            self.consistentDict[tuple(assignment.items())] = False
            return False
        temp = distance[i]

    self.consistentDict[tuple(assignment.items())] = True

    return True

def inference(self, item, value):.....#find out the inference for the new assignment

    newVal = set()
    return newVal

def deepcopyDomain(self, domain, values):

    for i in range(len(values)):
        for j in range(len(values[i])):
            domain[i][j] = values[i][j]

```

- The 3 main modules of this Backtracking implementation are as BT(), backtracking\_search() and CSPBackTrack.
- BT() module:
  - The first module BT() is the actual thread where the call will begin and move forward.
  - Here, I am first creating a golomb ruler object with the input parameters length and marks.
  - Then calling algoTime() module which in turn calls backtracking module.
  - This method returns pathDict dictionary which holds the path from the initial variable to the end variable is there is no failure.

- Return the output as expected format [(len(pathDict), resultList)] from this module.
- Backtracking\_search():
  - In this module I am using the CSP assignment and the CSP problem itself to identify the variables that can be assigned with legal values.
  - If CSP is complete and consistent then return the assignment else continue.
  - Get all the unassigned variables.
  - For each value in the domain check for consistency of the assignment.
  - If the new value is consistent then add the same in assignment dictionary.
  - Call the same module recursively to find out all the valid assignments for the variables.
  - Once all the values are identified then set this new value as the domain of the values of the input variables.
  - At any point if the assignment is not consistent then return a failure message
- CSPBackTrack:
  - This is a class module which is getting instantiated with the golomb ruler object.
  - For all the new assignment, this module checks for the completeness of the values
  - Finds the index of the next unassigned variables
  - Find all the possible values that can be available in the domain of a variable
  - For a newly assigned variable value this module checks for the consistency and if it's find any issue then returns a failure
  - This also check for conflicts of a variable value with its neighbor variable values
  - Finally, once a value is found then add that value in the domain

## 2. Question 2 BT + Forward Checking (FC):

- **Code Details:**

```
#Your backtracking+Forward checking function implementation
def FC(L, M):
    """ YOUR CODE HERE """

    gRuler = Golomb_Ruler(M, L)
    csp_bt_fc = CSPBTForwardCheck(gRuler)

    print("Implementation of CSP for the problem Golomb Ruler by Gourab Bhattacharyya - 170048888 \n")
    print ("Golomb Ruler - M: " + str(gRuler.M) + ", L: " + str(gRuler.L) + "\n")

    result, pathDict = algoTime(csp_bt_fc)

    if result:
        resultList = []
        for key, value in pathDict.items():
            resultList.append(value)
        print "Final Result", (len(pathDict), resultList)
        return (len(pathDict), resultList)
    else:
        print "Final Result", (-1, [])
        return (-1, [])
```

```

#Define Golomb Ruler class and set order M and length L for the CSP
class Golomb_Ruler:
    M = 0 # Order
    L = 0 # Length

    def __init__(self, M, L):
        self.M = M
        self.L = L

def timing(f):
    def wrap(*args):
        time1 = time.time()
        ret = f(*args)
        time2 = time.time()
        print('%s function took %.3f ms' % (f.__name__, (time2 - time1) * 1000.0))
        print("=====end of trace=====")
        #print('\n')
        return ret
    return wrap

@timing
def algoTime(csp):
    print("=====start of trace=====")
    print("Running " + csp.__class__.__name__ + " algorithm")
    m = backtrack_search(csp)
    print("Number of consistency checks: "+str(csp.counter))
    if m is not False:
        for i in range(len(m)):
            print("M" + str(i) + ": " + str(m[i]))
        return True, m
    else:
        print("No solution")
        return False, m

def backtrack_search(csp):
    #This is generic backtrack search
    return backtrack(csp.assignment, csp)

def backtrack(assignment, csp):
    #This will take assignment and CSP object as input and do a backtrack through all the nodes
    if csp.complete(assignment): #if the assignment is complete and valid, return the result
        return assignment

    var = csp.selectUnassignedVariables()
    domainVals = csp.findDomainValues(var, assignment)

    for value in domainVals:
        csp.counter += 1 # increase the counter for each consistency check

        if csp.consistent(var, value, assignment): #if value is consistent
            assignment[var] = value
            domain = [0]

            for idx in range(csp.n):
                tempList = []
                for idx in range(csp.d):
                    tempList.append(1)
                domain.append(tempList)

            csp.deepcopyDomain(domain, csp.domain)
            inferences = csp.inference(var, value)

            if inferences is not False: #add inferences to assignment
                for inference in inferences:
                    assignment[inference[0]] = inference[1]

                #print "Count, Assignment", csp.counter, assignment
                result = backtrack(assignment, csp)

                if result:
                    return result

            assignment[var] = None #remove {var = value} and inferences from assignment
            csp.deepcopyDomain(csp.domain, domain) #restore the domain values

            if inferences is not False:
                for inference in inferences:
                    assignment[inference[0]] = None

    return False

```

```

class CSPBTForwardCheck(CSPBackTrack): #This is used for Backtrack with Forward Check

    def init(self, ruler):
        self.n = ruler.M
        self.d = ruler.L + 1
        self.domain = []
        self.assignment = dict()

        for order in range(self.n):
            tempList = []
            for item in range(self.d):
                tempList.append(1)
            self.domain.append(tempList)

        # node consistency
        for i in range(self.n):
            temp_list = []
            if i == 0:
                for x in range(self.d):
                    temp_list.append(0)
                temp_list[0] = 1
                self.domain[i] = temp_list

            elif i == self.n - 1:
                for x in range(self.d):
                    temp_list.append(0)
                temp_list[self.d - 1] = 1
                self.domain[i] = temp_list

            else:
                for x in range(self.d):
                    temp_list.append(1)

                for j in range(i + 1, self.n):
                    temp_list[self.d - self.n + j] = 0
                self.domain[i] = temp_list

        # initialize the assignment
        for i in range(self.n):
            self.assignment[i] = None

    def inference(self, item, value):
        inferred = set()

        for i in range(len(self.domain)):
            if i == item or self.assignment[i] is not None:
                continue

            for j in range(len(self.domain[i])):
                if self.domain[i][j] == 0:
                    continue

                if not (self.consistent(i, j, self.assignment)):
                    self.domain[i][j] = 0

            if self.domain[i].count(1) == 0:
                return False
            elif self.domain[i].count(1) == 1:
                inferred.add((i, self.domain[i].index(1)))

        return inferred

```

- The 3 main modules of this Backtracking implementation are as FC(), backtracking\_search() and CSPBTForwardCheck.
- FC() module:

- The first module FC() is the actual thread where the call will begin and move forward.
  - Here, I am first creating a golomb ruler object with the input parameters length and marks.
  - Then calling algoTime() module which in turn calls backtracking module.
  - This method returns pathDict dictionary which holds the path from the initial variable to the end variable if there is no failure.
  - Return the output as expected format [(len(pathDict), resultList)] from this module.
- Backtracking\_search():
- In this module I am using the CSP assignment and the CSP problem itself to identify the variables that can be assigned with legal values.
  - If CSP is complete and consistent then return the assignment else continue.
  - Get all the unassigned variables.
  - For each value in the domain check for consistency of the assignment.
  - If the new value is consistent then add the same in assignment dictionary.
  - Call the same module recursively to find out all the valid assignments for the variables.
  - Once all the values are identified then set this new value as the domain of the values of the input variables.
  - At any point if the assignment is not consistent then return a failure message
- CSPBTForwardCheck:
- This is a class module which is getting instantiated with the golomb ruler object.
  - First, I am specifying a domain for the variables with all 1's
  - Then checking for consistency and updating the domain accordingly.
  - Initializing the assignment dictionary.
  - Initialize a new set for inference values
  - If a new value found which is consistent then add the same in the assignment and then in the domain of values.
  - This module will finally return the final domain of the valid variable values

### 3. Question 3 BT + Constraint Propagation (CP):

- **Code Details:**

```
#Bonus: backtracking + constraint propagation
def CP(L, M):
    """ YOUR CODE HERE """
    gRuler = Golomb_Ruler(M, L)
    csp_bt_cp = CSPBTConsProp(gRuler)

    print("Implementation of CSP for the problem Golomb Ruler by Gourab Bhattacharyya - 170048888 \n")
    print("Golomb Ruler - M: " + str(gRuler.M) + ", L: " + str(gRuler.L) + "\n")

    result, pathDict = algoTime(csp_bt_cp)

    if result:
        resultList = []
        for key, value in pathDict.items():
            resultList.append(value)
        print("Final Result", (len(pathDict), resultList))
        return (len(pathDict), resultList)
    else:
        print("Final Result", (-1, []))
        return (-1, [])
```

```

#Define Golomb Ruler class and set order M and length L for the CSP
class Golomb_Ruler:
    M = 0 # Order
    L = 0 # Length

    def __init__(self, M, L):
        self.M = M
        self.L = L

def timing(f):
    def wrap(*args):
        time1 = time.time()
        ret = f(*args)
        time2 = time.time()
        print('%s function took %0.3f ms' % (f.__name__, (time2 - time1) * 1000.0))
        print("=====end of trace=====")
        #print('\n')
        return ret
    return wrap

@timing
def algoTime(csp):
    print("=====start of trace=====")
    print("Running " + csp.__class__.__name__ + " algorithm")
    m = backtracking_search(csp)
    print("Number of consistency checks: "+str(csp.counter))
    if m is not False:
        for i in range(len(m)):
            print("M" + str(i) + ": " + str(m[i]))
        return True, m
    else:
        print("No solution")
        return False, m

def backtracking_search(csp): #This is generic backtrack search
    return backtrack(csp.assignment, csp)

def backtrack(assignment, csp): #This will take assignment and CSP object as input and do a backtrack through all the nodes
    if csp.complete(assignment): #if the assignment is complete and valid, return the result
        return assignment

    var = csp.selectUnassignedVariables()
    domainVals = csp.findDomainValues(var, assignment)

    for value in domainVals:
        csp.counter += 1 # increase the counter for each consistency check

        if csp.consistent(var, value, assignment): #if value is consistent
            assignment[var] = value
            domain = [0]

            for idx in range(csp.n):
                tempList = []
                for idx in range(csp.d):
                    tempList.append(1)
                domain.append(tempList)

            csp.deepcopyDomain(domain, csp.domain)

            inferences = csp.inference(var, value)

            if inferences is not False: #add inferences to assignment
                for inference in inferences:
                    assignment[inference[0]] = inference[1]

                #print "Count, Assignment", csp.counter, assignment
                result = backtrack(assignment, csp)

                if result:
                    return result

            assignment[var] = None #remove {var = value} and inferences from assignment
            csp.deepcopyDomain(csp.domain, domain) #restore the domain values

            if inferences is not False:
                for inference in inferences:
                    assignment[inference[0]] = None

    return False

```



```

class CSPBTConsProp(CSPBTForwardCheck):
    #This is used for Backtrack with Constraint Propagation

    def inference(self, item, value):
        queue = Queue.Queue()

        for i in range(len(self.domain)):
            if i != item and self.assignment[i] is None:
                queue.put((i, item))

        return ac_3(self, queue)

def ac_3(csp, queue):
    #This is used for Constraint Propagation

    while not(queue.empty()):
        (x_i, x_j) = queue.get()
        # If the variable x_i is assigned, we can skip the tuple with certainty
        # because we don't need to change the domain of an assigned variable
        if csp.assignment[x_i] is not None:
            continue
        if _revise(csp, x_i, x_j):
            if csp.domain[x_i].count(1) == 0:
                return False
            s = _neighbors(x_i, csp)
            if x_j in s:
                s.remove(x_j)
            for x_k in s:
                queue.put((x_k, x_i))
        return set()

def _revise(csp, x_i, x_j):
    #if an variable is present in a domain the returns true
    revised = False
    for x in range(len(csp.domain[x_i])):
        #ignore the impossible value
        if csp.domain[x_i][x] == 0:
            continue
        satisfy = False

        #construct the right assignment
        assignment = copy.deepcopy(csp.assignment)
        assignment[x_i] = x
        if csp.assignment[x_j] is not None:
            if csp.consistent(x_j, csp.assignment[x_j], assignment):
                satisfy = True
        else:
            for y in range(len(csp.domain[x_j])):
                # there is some y in D_x_j that satisfy the constraint
                if csp.consistent(x_j, y, assignment):
                    satisfy = True

        if not satisfy:
            #if no value in y in D_j allow (x,y) to satisfy the constraint between X_i and X_j
            csp.domain[x_i][x] = 0
            revised = True

    return revised

```

- The 3 main modules of this Backtracking implementation are as CP(), backtracking\_search() and CSPBTConsProp.
- CP() module:
  - The first module CP() is the actual thread where the call will begin and move forward.
  - Here, I am first creating a golomb ruler object with the input parameters length and marks.
  - Then calling algoTime() module which in turn calls backtracking module.
  - This method returns pathDict dictionary which holds the path from the initial variable to the end variable is there is no failure.
  - Return the output as expected format [(len(pathDict), resultList)] from this module.
- Backtracking\_search():
  - In this module I am using the CSP assignment and the CSP problem itself to identify the variables that can be assigned with legal values.
  - If CSP is complete and consistent then return the assignment else continue.
  - Get all the unassigned variables.
  - For each value in the domain check for consistency of the assignment.
  - If the new value is consistent then add the same in assignment dictionary.
  - Call the same module recursively to find out all the valid assignments for the variables.

- Once all the values are identified then set this new value as the domain of the values of the input variables.
- At any point if the assignment is not consistent then return a failure message

➤ CSPBTConsProp:

- This is a class module which is getting instantiated with the golomb ruler object.
- Here I am using a FIFO queue to insert all the item in a queue first and then check for inconsistency and completeness for each variable value.
- This is calling ac\_3 module which is actually performing this check.
- ac\_3() module:
  - for each element in the queue if a value is already assigned to a variable then we will skip that variable and go to the next element.
  - For each variable, we will check the constraint satisfaction with its neighbor.
  - We will ignore the impossible values
  - Construct the correct assignment of variable value
  - If there is some value that satisfy all the constraint then add that value in the domain values.
  - If the value is inconsistent then remove that value from the queue.
  - Finally, this module as a whole will return a set of domain values which are the legal and valid values for the input variables.