



Shri Vile Parle Kelavani Mandal's

DWARKADAS J. SANGHVI COLLEGE OF ENGINEERING

(Autonomous College Affiliated to the University of Mumbai)

NAAC Accredited with "A" Grade (CGPA : 3.18)



Department of Computer Science and Engineering (Data Science)

Subject: Artificial Intelligence (DJ19DSC502)

AY: 2023-24

Experiment 4

(Solution Space)

Name: Bhuvi Ghosh

Sap ID: 60009210191

Batch: D22

Aim: Find the solution of a SAT (Satisfiability) problem using Variable Neighborhood Descent.

Theory:

The SAT problem

Given a Boolean formula made up of a set of propositional variables $V = \{a, b, c, d, e, \dots\}$ each of which can be *true* or *false*, or 1 or 0, to find an assignment for the variables such that the given formula evaluates to *true* or 1.

For example, $F = ((a \vee \neg e) \wedge (e \vee \neg c)) \supset (\neg c \vee \neg d)$ can be made *true* by the assignment $\{a=true, c=true, d=false, e=false\}$ amongst others.

Very often SAT problems are studied in the *Conjunctive Normal Form (CNF)*. For example, the following formula has five variables (a,b,c,d,e) and six clauses.

$$(b \vee \neg c) \wedge (c \vee \neg d) \wedge (\neg b) \wedge (\neg a \vee \neg e) \wedge (e \vee \neg c) \wedge (\neg c \vee \neg d)$$



Shri Vile Parle Kelavani Mandal's

DWARKADAS J. SANGHVI COLLEGE OF ENGINEERING

(Autonomous College Affiliated to the University of Mumbai)

NAAC Accredited with "A" Grade (CGPA : 3.18)



Department of Computer Science and Engineering (Data Science)

Solution Space Search and Perturbative methods

The Solution Space is the space of candidate solutions.

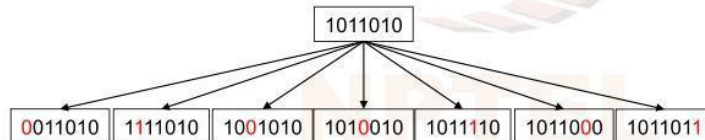
A local search method generates the neighbours of a candidate by applying some perturbation to the given candidate

MoveGen function = neighbourhood function

A SAT problem with N variables has 2^N candidates

- where each candidate is a N bit string

When $N = 7$, a *neighbourhood function* may change **one** bit.



Variable Neighbourhood Descent

```
VariableNeighbourhoodDescent()
```

```
1   node ← start
```

```
2   for i ← 1 to n
```

```
3       do moveGen ← MoveGen(i)
```

```
4         node ← HillClimbing(node, moveGen)
```

```
5   return node
```

The algorithm assumes that the function *moveGen* can be passed as a parameter. It assumes that there are N *moveGen* functions sorted according to the density of the neighbourhoods produced.

Lab Assignment to do:

Solve the following SAT problems using VND

1. $F = (A \vee \sim B) \wedge (B \vee \sim C) \wedge (\sim B) \wedge (\sim C \vee E) \wedge (A \vee C) \wedge (\sim C \vee \sim D)$
2. $F = (A \vee B) \wedge (A \wedge \sim C) \wedge (B \wedge D) \wedge (A \vee \sim E)$



Shri Vile Parle Kelavani Mandal's

DWARKADAS J. SANGHVI COLLEGE OF ENGINEERING

(Autonomous College Affiliated to the University of Mumbai)

NAAC Accredited with "A" Grade (CGPA : 3.18)



Department of Computer Science and Engineering (Data Science)

```
from itertools import product

def problem_1_formula(A, B, C, D, E):
    return (A or not B) and (B or not C) and (not B) and (not C or E) and (A or C) and (not C or not D)

def problem_2_formula(A, B, C, D, E):
    return (A or B) and (A and not C) and (B and D) and (A or not E)

[ ] def satisfiability(formula):
    variables = ['A', 'B', 'C', 'D', 'E']
    solutions = []

    for assignment in product([True, False], repeat=len(variables)):
        if formula(*assignment):
            solutions.append({variables[i]: assignment[i] for i in range(len(variables))})

    return solutions

def satisfiability(formula):
    variables = ['A', 'B', 'C', 'D', 'E']
    solutions = []

    for assignment in product([True, False], repeat=len(variables)):
        if formula(*assignment):
            solutions.append({variables[i]: assignment[i] for i in range(len(variables))})

    return solutions

[ ] problem_1_solutions = satisfiability(problem_1_formula)
print("Solutions for Problem 1:")
for solution in problem_1_solutions:
    print(solution)

Solutions for Problem 1:
{'A': True, 'B': False, 'C': False, 'D': True, 'E': True}
{'A': True, 'B': False, 'C': False, 'D': True, 'E': False}
{'A': True, 'B': False, 'C': False, 'D': False, 'E': True}
{'A': True, 'B': False, 'C': False, 'D': False, 'E': False}
CPU times: user 167 µs, sys: 23 µs, total: 190 µs
Wall time: 197 µs
```



Shri Vile Parle Kelavani Mandal's

DWARKADAS J. SANGHVI COLLEGE OF ENGINEERING

(Autonomous College Affiliated to the University of Mumbai)

NAAC Accredited with "A" Grade (CGPA : 3.18)



Department of Computer Science and Engineering (Data Science)

```
▶ problem_2_solutions = satisfiability(problem_2_formula)
print("Solutions for Problem 2:")
for solution in problem_2_solutions:
    print(solution)
```

```
⇒ Solutions for Problem 2:
{'A': True, 'B': True, 'C': False, 'D': True, 'E': True}
{'A': True, 'B': True, 'C': False, 'D': True, 'E': False}
CPU times: user 120 µs, sys: 0 ns, total: 120 µs
Wall time: 124 µs
```

```
[ ] from itertools import product

def satisfiability_vnd(formula):
    variables = ['A', 'B', 'C', 'D', 'E']
    solutions = []
    initial_assignment = [True] * len(variables)

    def flip(assignment, index):
        new_assignment = assignment.copy()
        new_assignment[index] = not assignment[index]
        return new_assignment

    def vnd_search(assignment, index):
        if index == len(variables):
            if formula(*assignment):
                solutions.append({variables[i]: assignment[i] for i in range(len(variables))})
            return

        vnd_search(assignment, index + 1)
        vnd_search(flip(assignment, index), index + 1)

    vnd_search(initial_assignment, 0)
    return solutions
```



Shri Vile Parle Kelavani Mandal's

DWARKADAS J. SANGHVI COLLEGE OF ENGINEERING

(Autonomous College Affiliated to the University of Mumbai)

NAAC Accredited with "A" Grade (CGPA : 3.18)



Department of Computer Science and Engineering (Data Science)

```
▶ problem_1_solutions = satisfiability_vnd(problem_1_formula)
print("Solutions for Problem 1:")
for solution in problem_1_solutions:
    print(solution)
```

```
⇒ Solutions for Problem 1:
{'A': True, 'B': False, 'C': False, 'D': True, 'E': True}
{'A': True, 'B': False, 'C': False, 'D': True, 'E': False}
{'A': True, 'B': False, 'C': False, 'D': False, 'E': True}
{'A': True, 'B': False, 'C': False, 'D': False, 'E': False}
```

```
[ ] problem_2_solutions = satisfiability_vnd(problem_2_formula)
print("Solutions for Problem 2:")
for solution in problem_2_solutions:
    print(solution)
```

```
Solutions for Problem 2:
{'A': True, 'B': True, 'C': False, 'D': True, 'E': True}
{'A': True, 'B': True, 'C': False, 'D': True, 'E': False}
```



Shri Vile Parle Kelavani Mandal's

DWARKADAS J. SANGHVI COLLEGE OF ENGINEERING

(Autonomous College Affiliated to the University of Mumbai)

NAAC Accredited with "A" Grade (CGPA : 3.18)



Department of Computer Science and Engineering (Data Science)

```
def satisfiability_vnd(formula):
    variables = ['A', 'B', 'C', 'D', 'E']
    solutions = []
    initial_assignment = [True] * len(variables)

    def flip(assignment, index):
        new_assignment = assignment.copy()
        new_assignment[index] = not assignment[index]
        return new_assignment

    def vnd_search(assignment, index):
        if index == len(variables):
            if formula(*assignment):
                solutions.append({variables[i]: assignment[i] for i in range(len(variables))})
            return
        print(f"Iteration {index + 1}: Assignment = {assignment}")
        vnd_search(assignment, index + 1)

        flipped_assignment = flip(assignment, index)
        print(f"Iteration {index + 1}: Flipping variable {variables[index]}")
        vnd_search(flipped_assignment, index + 1)

    vnd_search(initial_assignment, 0)
    return solutions

solutions = satisfiability_vnd(problem_2_formula)
```




Shri Vile Parle Kelavani Mandal's

DWARKADAS J. SANGHVI COLLEGE OF ENGINEERING

(Autonomous College Affiliated to the University of Mumbai)

NAAC Accredited with "A" Grade (CGPA : 3.18)



Department of Computer Science and Engineering (Data Science)

```
Iteration 1: Assignment = [True, True, True, True, True]
Iteration 2: Assignment = [True, True, True, True, True]
Iteration 3: Assignment = [True, True, True, True, True]
Iteration 4: Assignment = [True, True, True, True, True]
Iteration 5: Assignment = [True, True, True, True, True]
Iteration 5: Flipping variable E
Iteration 4: Flipping variable D
Iteration 5: Assignment = [True, True, True, False, True]
Iteration 5: Flipping variable E
Iteration 3: Flipping variable C
Iteration 4: Assignment = [True, True, False, True, True]
Iteration 5: Assignment = [True, True, False, True, True]
Iteration 5: Flipping variable E
Iteration 4: Flipping variable D
Iteration 5: Assignment = [True, True, False, False, True]
Iteration 5: Flipping variable E
Iteration 2: Flipping variable B
Iteration 3: Assignment = [True, False, True, True, True]
Iteration 4: Assignment = [True, False, True, True, True]
Iteration 5: Assignment = [True, False, True, True, True]
Iteration 5: Flipping variable E
Iteration 4: Flipping variable D
Iteration 5: Assignment = [True, False, True, False, True]
Iteration 5: Flipping variable E
Iteration 3: Flipping variable C
Iteration 4: Assignment = [True, False, False, True, True]
Iteration 5: Assignment = [True, False, False, True, True]
```



Shri Vile Parle Kelavani Mandal's

DWARKADAS J. SANGHVI COLLEGE OF ENGINEERING

(Autonomous College Affiliated to the University of Mumbai)

NAAC Accredited with "A" Grade (CGPA : 3.18)



Department of Computer Science and Engineering (Data Science)

```
Iteration 4: Flipping variable D
Iteration 5: Assignment = [False, True, True, False, True]
Iteration 5: Flipping variable E
Iteration 3: Flipping variable C
Iteration 4: Assignment = [False, True, False, True, True]
Iteration 5: Assignment = [False, True, False, True, True]
Iteration 5: Flipping variable E
Iteration 4: Flipping variable D
Iteration 5: Assignment = [False, True, False, False, True]
Iteration 5: Flipping variable E
Iteration 2: Flipping variable B
Iteration 3: Assignment = [False, False, True, True, True]
Iteration 4: Assignment = [False, False, True, True, True]
Iteration 5: Assignment = [False, False, True, True, True]
Iteration 5: Flipping variable E
Iteration 4: Flipping variable D
Iteration 5: Assignment = [False, False, True, False, True]
Iteration 5: Flipping variable E
Iteration 3: Flipping variable C
Iteration 4: Assignment = [False, False, False, True, True]
Iteration 5: Assignment = [False, False, False, True, True]
Iteration 5: Flipping variable E
Iteration 4: Flipping variable D
Iteration 5: Assignment = [False, False, False, False, True]
Iteration 5: Flipping variable E
```