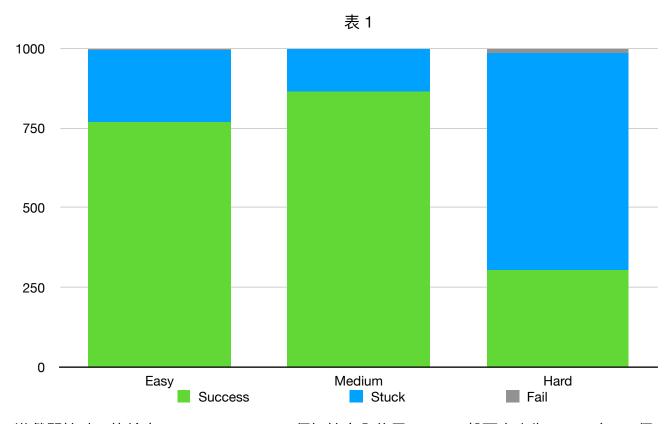
Introduction to Al

Programming Assignment #3

實驗與結果

盤面難易度與結果比較

表 1 為使用 3 種不同難易程度(Easy 、 Medium 、 Hard) 的盤面,測試每種盤面難易度時,均隨機產生 1000 組盤面進行測試,進行遊戲後統計 Success 、 Stuck 、 Fail 的結果 紀錄,表 1 Y 軸為場數,使用線性刻度。



遊戲開始時,均給定 round(sqrt(#cells)) 個初始安全位置, Easy 盤面大小為 9*9,有 10 個地雷;Medium 盤面大小為 16*16,有 25 個地雷;Hard 盤面大小為 30*16,有 75 個地雷(因使用 Spec 的要求而放置 99 個地雷時,遊戲實在太容易 Stuck ,故改為 75 個地雷進行測試)。

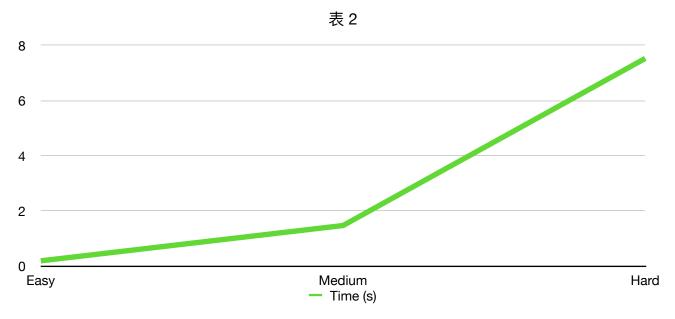
從表 1 可以看出,遊戲在難易程度為 Medium 時,最容易成功解出,其 Success 比率約為 0.86 ,在難易程度為 Easy 時,其 Success 比率約為 0.76 ,難易程度為 Hard 時,最容易 Stuck ,其 Success 比率僅約為 0.3。

表 1 實驗中,若遞迴 3 次仍無法產生新的步數,即判定為 Stuck ,另外,其所發生的極少數 Fail ,大都是因一些並排的地雷相鄰圍繞行成一個封閉區域,使得遊戲時無法探索封閉區域內的 Hints ,也無法對封閉區域中的位置產生相關的 Clause ,導致即便 KB 內已無任何 Clause 時,遊戲仍尚未完成。

以下其他實驗若無特別說明,則其盤面大小及地雷數量皆與表 1 中的實驗配置相同。

盤面難易度與時間比較

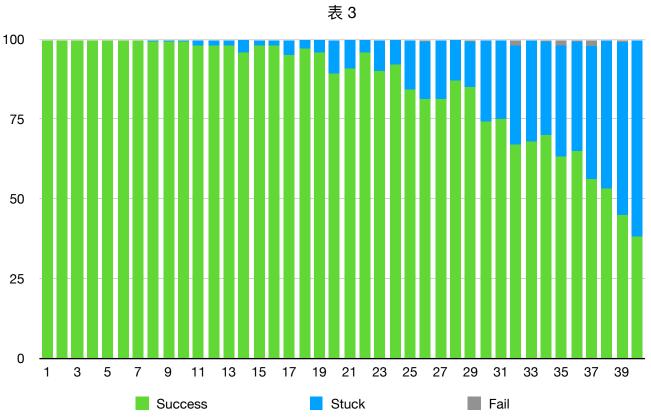
表 2 為在表 1 實驗中,成功解出盤面後,統計其時間,取其結果之平均時間紀錄。表 2 Y 軸為時間,使用線性刻度,單位為秒。



由表 2 可以看出,盤面難易度增加時,所需時間亦增加。

地雷數量與結果比較

表 3 為使用 16*16 的盤面大小,分別測試在盤面上放置 1 個至 40 個地雷,觀察其解出所需時間。測試每個地雷數量時,均隨機產生 100 組盤面進行測試,進行遊戲後統計 Success 、 Stuck 、 Fail 的結果紀錄,表 3 X 軸為地雷數量, Y 軸為場數,使用線性刻度。



在表 3 實驗中,最初均給定 round(sqrt(#cells)) 個初始安全位置,從表 3 可以看出,當地雷數量增加時,遊戲越來越容易發生 Stuck 的情形,我認為這是由於在確定是地雷的位置上,無法得知該位置的 Hints 值,也就是說,當地雷數量越多,所能取得的 Hints 數量就越少,導致越來越容易 Stuck 。

地雷數量與時間比較

表 4 為在表 3 實驗中,成功解出盤面後,統計其時間,取其結果之平均時間紀錄。表 3 X 軸為地雷數量, Y 軸為時間,使用線性刻度,單位為秒。



從表 4 可以看出,即便是盤面大小皆相同,當地雷數量越來越多時,所需時間仍成線性成長。我認為這是由於地雷數量越多,所能取得的 Hints 數量就越少,使得需要做更多的 Pairwise matching 才能產生 Single literal 的原因所導致。

所學

透過本次實驗我所學以下幾點:

- 1. 利用物件導向程式設計,以 Python 實作互動遊戲之 Framework。
- 2. 了解 Propositional logic 、 Resolution 、 Matching 等等技巧的運作原理、特性以及優缺點。
- 3. 透過比較不同的盤面難易程度來體會時間及空間複雜度對於 Propositional logic 的影響。
- 4. 將實驗結果整理、列表並使人易於閱讀。

討論

使用 First order logic

定義 Relations : hint_eq_around_mines(x) 表示 x 的 Hints 和周圍已知的地雷數量相同、adjacent(x, y) 表示 x 、 y 相鄰、mine(x), safe(x), unmarked(x)表示 x 的狀態。

- 1. 對於所有安全的位置 x ,若其 Hints 和周圍已知的地雷數量相同,則與 x 相鄰的所有未知位置為安全。
 - $\forall x \ \forall y \ safe(x) \land hint_eq_around_mines(x) \land adjacent(x, y) \land unmarked(y) \Rightarrow safe(y)$
- 2. 對於所有安全的位置 x ,若其 Hints 和周圍已知的地雷數量不相同,則與 x 相鄰的未知 位置中存在地雷。
 - $\forall x \exists y \ safe(x) \land \neg hint_eq_around_mines(x) \land adjacent(x, y) \land unmarked(y) \Rightarrow mine(y)$

以上為兩個使用 First order logic 的 Sentence 實例,若 Sentence 完整,我推測使用 First order logic 會比使用 Propositional logic 更有效率。

Forward chaining 與 Backward chaining

使用 Forward chaining 時,先將 KB 做成圖,其中每個節點都是一個 Implication ,遞迴計算每個節點當中已被證實的 Fact ,當布標節點被標示為 1 時,即代表目標亦成為 Fact 了,整個過程即為 Horn clause implication 的拆除。

使用從目標節點出發,遞迴檢視可以 Imply 目標的 Horn clause, 直到沒有 Horn clause 之後,再檢查實際是否能推到目標。

Backward chaining 中的 Goal-driven 特性使得其與 Forward chaining 相比更有效率。

Stuck 時的猜測

如果剩餘未解位置不多,可以嘗試加入 Global constraint 進入 KB ,使用地雷數量與剩餘為標記的位置來增加線索。

若無法使用 Global constraint 或使用後無效,可使用表決機制,即用 KB 中的 Clause 裡每個 Literal 來投票,假如一個 Literal 指出位置 A 為安全,則 A 加 1 票,若不安全則減 1 票,最後統計票高者進行猜測並選擇。

使用 Search

我認為邏輯和搜尋可以同時並進,也就是每次遞回時先使用邏輯標示出已經確定的位置,然後避開這些位置進行搜尋。如此一來,搜尋時會減少搜索不必要的、已被推定為安全或是地雷的位置,可以減少搜尋所需的時間和空間,同時也可避免在遊戲初始時,無意義的產生很多 Clause 進行無用的 Matching。

疑問與探討

- 1. 在盤面難易度為 Hard 時, Spec 所要求的地雷數量為 99 ,但當我使用這項配置時,遊戲非常容易進入 Stuck 狀態,雖然不排除是我的程式有錯誤,但我有將盤面狀態印出並逐一比對,也確認真的是 Stuck ,因此很疑惑為何會有這樣的狀況發生。此外,即便是將原本 99 個地雷的配置修改為 75個地雷,成功率依然只有如表 1 所標示的三成左右,遠遠不如難易度 Medium 近九成的成功率。
- 2. 在 Spec 中有提到可以將 round(sqrt(#cells)) 個初始安全位置的數量加以改變,觀察遊戲成功機率的變化。而我認為:其實初始位置最重要的是要有 0 的 Hints ,如果初始位置完全沒有 Hints 為 0 ,則遊戲有極高的可能性會一開局就進入 Stuck 裝態。然而,round(sqrt(#cells)) 因涉及根號,因此不好改變與掌握,所以我稍作變形,改做了表 3 和表 4 的實驗,我認為其原理相當,都是在於探討為 0 的 Hints 在初始安全位置中出現的機率,機率越大,越不容易 Stuck,反之就越容易。

未來發想

在實驗的過程中,如果印出 KB 來做觀察,會發現單純使用 Propositional logic 時,其所產生的很多 Clause 其實是無用的,但是這個 Clause 會一直存在 KB 當中,不斷的與其他 Clause 進行毫無用處的 Matching ,最後才被移除。而這樣的狀況往往是因為有一個不為 0 的 Hints ,其位置的周圍完全沒有其他 Hints 或已被標示為地雷的位置,則此 Hints 在這樣的情形之下,對於整個遊戲來說是毫無用處的。因此,為來可考慮先暫時排除將這樣的 Hints 所產生的 Clause 列入 KB ,直到其周圍有位置被解出,如此一來可以免去很多不必要的 Matching ,我認為或許可以增加遊戲的效率。

Appendix

Structure

- · minesweeper.py
- agent.py
- · logic.py
- · board.py
- test.py

minesweeper.py

```
import time
from board import Board, Action
from logic import Literal, Clause
from agent import Agent
class Result():
    def init (self, status, stuck, play time):
        self.status = status
        self.stuck = stuck
        self.play_time = play_time
class MineSweeper():
    def __init__(self, difficulty, mines = None):
        self.board = Board(difficulty, mines)
        self.agent = Agent()
        self.debug = False
    def play(self, debug = None):
        if debug is not None:
            self.debug = debug
        start time = time.time()
        stucked = False
        status = ''
        # Initial game
        for pos in self.board.init safe pos:
            new clause = Clause( [-Literal(pos)] )
            self.agent.add clause to KB(new clause)
        while True:
            # Print current board
            if self.debug:
                self.board.print current board()
                print()
            # Take action
            action = self.agent.take action(self.board)
```

```
# Game flow
            if 'query' == action.action:
                new hint = self.board.query(action.position)
                if new hint == -3:
                    if self.debug:
                        print('Fail on', action.position)
                        break
                self.agent.new hint(action.position, new hint,
self.board)
            elif 'mark mine' == action.action:
                self.board.mark mine(action.position)
            elif 'done' == action.action:
                break
            elif 'give up' == action.action:
                stucked = True
                if self.debug:
                    print(self.agent.KB0)
                    for c in self.agent.KB:
                        print(c)
                    print('Stucked')
                break
        # Statistics
        play time = (time.time() - start time)
        if self.board.check success():
            status = 'Success'
        else:
            status = 'Fail'
        if self.debug:
            # Results
            print('====Result====')
            self.board.print current board()
            print()
            print('====Answer====')
            self.board.print answer board()
            print('====Status====')
            print(status)
            print('Duration:', play time, 'sec')
        return Result(status, stucked, play time)
if __name__ == '__main__':
    # Examples
    game = MineSweeper('easy')
    game.play(debug = True)
```

agent.py

```
import time
import copy, itertools
from board import Action, Board
from logic import Literal, Clause
class Agent():
    def __init__(self):
        self.KB0 = []
        self.KB = []
    def add clause to KB(self, new clause):
        if not new clause.is empty():
            # Do resolution of the new clause with all the clauses
in KB0
            for c in self.KB0:
                tmp clause, co literal count =
self.resolution(new clause, c)
                if tmp_clause > new_clause:
                    new clause = tmp clause
            # Check for identication and subsumption with all the
clauses in KB
            is useable = not (new clause.is empty())
            reduntents = []
            for c in self.KB:
                if not is useable:
                    break
                if new clause <= c:</pre>
                    is useable = False
                if new clause > c:
                    reduntents.append(c)
            if is useable:
                self.KB.append(new clause)
            for r in reduntents:
                self.remove clause from KB(r)
    def remove clause from KB(self, clause):
            self.KB.remove(clause)
        except:
            pass
    def global constraint(self, b):
        unmarked, marked mine = b.global constraint check()
        self.gen_clause(unmarked, marked_mine, b.mines)
    def new hint(self, position, hint, b):
        around unmarked = b.around unmarked position(position)
```

```
around marked mine =
b.around marked mine position(position)
        self.gen clause(around unmarked, around marked mine, hint)
    def gen_clause(self, unmarked, marked mine, hint):
        m = len(unmarked)
        n = hint - len(marked mine)
        if n == m:
            # Insert the m single-literal positive clauses to KB
            for au in unmarked:
                new_clause = Clause( [Literal(au)] )
                self.add clause_to_KB(new_clause)
        elif n == 0:
            # Insert the m single-literal negative clauses to KB
            for au in unmarked:
                new clause = Clause( [-Literal(au)] )
                self.add clause to KB(new clause)
        elif m > n > 0:
            # General cases
            # Generate CNF clauses and add them to the KB
            all positive = list(itertools.combinations(unmarked,
m-n+1)
            all negative = list(itertools.combinations(unmarked,
n+1))
            for comb in all positive:
                literals = []
                for au in comb:
                    literals.append(Literal(au))
                new clause = Clause(literals)
                self.add clause to KB(new clause)
            for comb in all negative:
                literals = []
                for au in comb:
                    literals.append(-Literal(au))
                new clause = Clause(literals)
                self.add clause to KB(new clause)
        else:
            # For debugging
            # print('Something is wrong')
            # print(position, hint, m, n, len(unmarked),
len(marked mine))
            pass
    def resolution(self, clause_a, clause_b):
        co literal count = 0
        new clause = Clause([])
        for 1 in clause a.literals:
            literal = 1
```

```
new clause.literals.append(literal)
        for l in clause b.literals:
            literal = 1
            co literal = -1
            if co literal in new clause.literals:
                new clause.literals.remove(co literal)
                co literal count += 1
            elif literal not in new clause.literals:
                new clause.literals.append(literal)
        return new clause, co_literal_count
    def remain literals matching(self, moved clause,
remain clause):
        reduntent clause = None
        add clause = None
        literal = moved clause.literals[0]
        co literal = -moved clause.literals[0]
        if co literal in remain clause.literals:
            new clause = copy.deepcopy(remain clause)
            reduntent clause = remain clause
            new clause.literals.remove(co literal)
            add clause = new clause
        elif literal in remain clause.literals:
            reduntent_clause = remain_clause
        return reduntent clause, add clause
    def pairwise matching(self, clause a, clause b):
        # Check for duplication or subsumption first
        # Keep only the more strict clause.
        if len(clause a.literals) > 2 and len(clause b.literals) >
2:
            return
        if not (clause a in self.KB and clause b in self.KB):
            return
        if clause a <= clause b:</pre>
            self.remove clause from KB(clause a)
            return
        elif clause a >= clause b:
            self.remove clause from KB(clause b)
            return
        # Do resolution
        new clause, co literal count = self.resolution(clause a,
clause b)
        if co literal count == 1:
            # Only one pair of complementary literals:
            self.remove clause from KB(clause a)
```

```
self.remove clause from KB(clause b)
            self.add clause to KB(new clause)
        else:
            # No or more than one pairs of complementary literals
            # Do nothing
            pass
    def take action(self, b):
        # Make a query
        no action count = 0
        while len(self.KB):
            if no action count == 3:
                return Action('give_up')
            has single literal = False
            for c in self.KB:
                if c.is single literal():
                    # Single-lateral clause in the KB
                    # Mark this cell as safe or mined
                    clause = c
                    # Move that clause to KB0
                    self.remove clause from KB(clause)
                    self.KB0.append(clause)
                    # Process the matching of that clause to all
the remaining clauses in the KB
                    reduntents = []
                    adds = []
                    for remain c in self.KB:
                        reduntent clause, add clause =
self.remain literals matching(clause, remain c)
                        if reduntent clause:
                            reduntents.append(reduntent clause)
                        if add clause:
                            adds.append(add clause)
                    for r in reduntents:
                        self.remove clause from KB(r)
                    for a in adds:
                        self.add clause to KB(a)
                    if clause.is safe():
                        return Action('query',
clause.literals[0].position)
                        no action count = 0
                    else:
                        return Action('mark mine',
clause.literals[0].position)
                        no action count = 0
```

```
has single literal = True
            if not has single literal:
                no action count += 1
                # tmp KB = list(self.KB)
                # Apply pairwise matching of the clauses in the KB
                # Only match clause pairs where one clause has
only at most two literals
                for comb in list(itertools.combinations(self.KB,
2)):
                    if comb[0] in self.KB and comb[1] in self.KB:
                        self.pairwise matching(comb[0], comb[1])
                # if tmp KB == self.KB:
                      # self.global constraint(b)
                      if tmp KB == self.KB:
                          return Action('give up')
            # if len(self.KB) == 0:
                  unmarked, marked mine = global constraint check
            #
                  if len(unmarked):
                      self.global constraint(b)
        return Action('done')
logic.py
class Literal():
    def init (self, position, positive = True):
        self.positive = positive
        self.position = position
    def __neg__(self):
        return Literal(self.position, not self.positive)
    def __eq_ (self, other):
        return self.positive == other.positive and self.position
== other.position
    def __ne__(self, other):
        return not self. eq (other)
    def repr (self):
        return ('' if self.positive else '-') + str(self.position)
class Clause():
    def __init__(self, literals):
        self.literals = literals
```

```
def __eq__(self, other):
    if not len(self.literals) == len(other.literals):
        return False
    for l in self.literals:
        if 1 not in other.literals:
            return False
    return True
def gt (self, other):
    # Return True when self is stricter than other
    if not len(self.literals) < len(other.literals):</pre>
        return False
    for l in self.literals:
        if 1 not in other.literals:
            return False
    return True
def ge (self, other):
    if not len(self.literals) <= len(other.literals):</pre>
        return False
    for l in self.literals:
        if 1 not in other.literals:
            return False
    return True
def lt (self, other):
    if not len(other.literals) < len(self.literals):</pre>
        return False
    for l in other.literals:
        if 1 not in self.literals:
            return False
    return True
def le (self, other):
    if not len(other.literals) <= len(self.literals):</pre>
        return False
    for l in other.literals:
        if 1 not in self.literals:
            return False
    return True
def __repr__(self):
    ret = ''
    for l in self.literals:
        ret += (' v ' + str(l)) if ret else str(l)
    return '(' + ret + ')'
def is empty(self):
    return len(self.literals) == 0
def is single literal(self):
    if len(self.literals) == 1:
```

```
return True
        return False
    def is safe(self):
        if len(self.literals) == 1:
            return not self.literals[0].positive
        return False
if __name__ == '__main__':
    # Examples
    a = Literal((5, 3))
    b = -Literal((2, 4))
    c = Literal((6, 13))
    d = -Literal((2, 1))
    e = Literal((7, 0))
    clause1 = Clause([a, b, c])
    clause2 = Clause([a, b, c, d])
    clause3 = Clause([a, b, c, d, e])
    clause4 = Clause([a, b, c, d, e])
    print(clause1 < clause2)</pre>
    print(clause3 < clause1)</pre>
    print(clause1 < clause2)</pre>
    print(clause1 < clause4)</pre>
    print(clause1 > clause4)
board.pv
import copy, math, random
class Action:
    def _init__(self, action, position = None):
        self.action = action
        self.position = position
class Board():
    def __init__(self, difficulty, mines = None):
        init param = {}
        if 'easy' == difficulty:
            init_param = {'size': (9, 9), 'mines': mines if mines
else 10}
        elif 'medium' == difficulty:
            init param = {'size': (16, 16), 'mines': mines if
mines else 25}
        elif 'hard' == difficulty:
            init param = {'size': (30, 16), 'mines': mines if
mines else 75}
```

```
self.x = init_param['size'][0]
        self.y = init param['size'][1]
        self.mines = init param['mines']
        self.hints = []
        self.marked = []
        # Randomly generate a new board
        positions = []
        for j in range(self.y):
            for i in range(self.x):
                positions.append((i, j))
        # Select mine and initial safe positions
        init safe cells = round(math.sqrt(self.x * self.y))
        sltd pos = random.sample(positions, self.mines +
init safe cells)
        mine pos = sltd pos[0:self.mines]
        self.init safe pos = sltd pos[self.mines:]
        # print(mine pos)
        # print(self.init safe pos)
        # Generate hints
        for i in range(self.x):
            for j in range(self.y):
                if j == 0:
                    self.hints.append([])
                    self.marked.append([])
                if (i, j) in mine pos:
                    self.hints[i].append(-3)
                else:
                    around = self.around position((i, j))
                    mines count = 0
                    for a in around:
                        if a in mine pos:
                            mines count += 1
                    self.hints[i].append(mines count)
                self.marked[i].append(0)
    def query(self, position):
        x = position[0]
        y = position[1]
        self.marked[x][y] = -2
        return self.hints[x][y]
   def mark mine(self, position):
        x = position[0]
        y = position[1]
        self.marked[x][y] = -3
   def available position(self, position):
```

```
# Returns true if the given position is available on this
board
        return 0 <= position[0] < self.x and 0 <= position[1] <</pre>
self.y
    def around position(self, position):
        # Returns a list of available postions around the given
position
        x = position[0]
        y = position[1]
        psb pos = [(x-1, y-1), (x, y-1), (x+1, y-1),
                   (x-1, y),
                                          (x+1, y),
                   (x-1, y+1), (x, y+1), (x+1, y+1)]
        around = []
        for pos in psb pos:
            if self.available position(pos):
                around.append(pos)
        return around
    def around unmarked position(self, position):
        # Returns a list of unmarked postions around the given
position
        around = self.around position(position)
        around unmarked = []
        for a in around:
            if self.marked[a[0]][a[1]] == 0:
                around unmarked.append(a)
        return around unmarked
    def around marked mine position(self, position):
        # Returns a list of marked mine postions around the given
position
        around = self.around position(position)
        around marked mine = []
        for a in around:
            if self.marked[a[0]][a[1]] == -3:
                around marked mine.append(a)
        return around marked mine
    def check success(self):
        marked count = 0
        marked mine count = 0
        current = copy.deepcopy(self.marked)
        for j in range(self.y):
            for i in range(self.x):
                if current[i][j] != 0:
                    marked count += 1
                if current[i][j] == -3:
                    marked mine count += 1
        return marked count == self.x*self.y and marked mine count
== self.mines
```

```
def global constraint check(self):
        unmarked = []
        marked mine = []
        current = copy.deepcopy(self.marked)
        for j in range(self.y):
            for i in range(self.x):
                if current[i][j] == 0:
                    unmarked.append((i, j))
                elif current[i][j] == -3:
                    marked mine.append((i, j))
        return unmarked, marked mine
    def print current board(self):
        # Print the current board status
             : Unassigned
               : Assigned no mine
        # * : Assigned mine
        # [0-8] : Hint
        current = copy.deepcopy(self.marked)
        for j in range(self.y):
            for i in range(self.x):
                current[i][j] = ' ' if current[i][j] == 0 else
current[i][j]
                current[i][j] = self.hints[i][j] if current[i][j]
== -2 else current[i][j]
                current[i][j] = '*' if current[i][j] == -3 else
current[i][j]
                print(current[i][j], end=" ")
            print()
    def print answer board(self):
        # Print the answer board
        # * : Mine
        # [0-8] : Hint
        board = copy.deepcopy(self.hints)
        for j in range(self.y):
            for i in range(self.x):
                board[i][j] = '*' if board[i][j] == -3 else
board[i][j]
                print(board[i][j], end=" ")
            print()
if __name__ == '__main__':
    # Examples
    b = Board('easy')
    b.print answer board()
```

test.py

from minesweeper import MineSweeper, Result

```
def simple test(rounds, difficulty, show = False):
    success = 0
    fail = 0
    stuck = 0
    success duration = 0
    for i in range(rounds):
        game = MineSweeper(difficulty)
        result = game.play(show)
        if result.status == 'Success':
            success += 1
            success duration += result.play time
        elif result.status == 'Fail':
            fail += 1
        if result.stuck:
            stuck += 1
    print()
    print('=======')
    print('Tested:\t\t\t', rounds, difficulty, 'games')
    print('Success:\t\t', success, 'games')
    print('Success duration:\t', success duration/success, 'sec
per game')
    print('Fail (Stuck):\t\t {} ({}) games'.format(fail, stuck))
def mines count test(rounds, difficulty, mines, show = False):
    print('=======')
    print('Tested:', rounds, difficulty, 'games per mines counts')
    print('Mines\tSuccess\tStuck\tFail\tFail-Stuck\tSuccess
duration')
    for m in range(1, mines+1):
        success = 0
        fail = 0
        stuck = 0
        success duration = 0
        for i in range(rounds):
            game = MineSweeper(difficulty, m)
            result = game.play(show)
            if result.status == 'Success':
                success += 1
                success duration += result.play_time
            elif result.status == 'Fail':
                fail += 1
            if result.stuck:
                stuck += 1
        print('{}\t{}\t{}\t{}\t\t{}'.format(m, success, stuck,
fail, fail-stuck, success duration/success))
```

```
if __name__ == '__main__':
    simple_test(1000, 'easy')
    simple_test(1000, 'medium')
    simple_test(1000, 'hard')
    mines_count_test(100, 'medium', 40)
```