■ Show your autograder results and describe each algorithm:

• Q1. Reflex Agent

首先在最基本的 Reflex Agent,演算法僅僅考慮了與食物之間的距離、考慮鬼魂的位置與驚嚇狀態,並且根據食物的遠近給予分數上的權重、根據和鬼魂的距離來給予分數上的懲罰,最後結合計算的評分和遊戲的基本分數來進行決策。

• O2. Minimax

首先 Pacman 的策略是要極大化自己的分數效益;而相反地 Ghost 的策略是要極小化 Pacman 的效益。根據投影片上提供的 pseudo-code 來進行修改,透過遞迴關係來看 Pacman 的下一步應該要如何行動。修改完 max-value, min-value 後,加上一個啟動步驟,首先將最佳行動設為None, 最佳分數設為負無限大,然後開始進行演算法,從 Pacman 開始,透過生出 successor,也就是生成執行該行動後的新遊戲狀態,並假設所有 Ghost 都會選擇對他們最有利的行動時,Pacman 能達到的最低評分,若此評分大於先前的最佳評分則更新分數與行動。

```
Question q2
_____
*** PASS: test_cases/q2/0-eval-function-lose-states-1.test
*** PASS: test_cases/q2/0-eval-function-lose-states-2.test
*** PASS: test_cases/q2/0-eval-function-win-states-1.test
*** PASS: test_cases/q2/0-eval-function-win-states-2.test
*** PASS: test_cases/g2/0-lecture-6-tree.test
*** PASS: test_cases/q2/0-small-tree.test
*** PASS: test_cases/q2/1-1-minmax.test
*** PASS: test_cases/q2/1-2-minmax.test
*** PASS: test_cases/q2/1-3-minmax.test
*** PASS: test_cases/q2/1-4-minmax.test
*** PASS: test_cases/q2/1-5-minmax.test
*** PASS: test_cases/q2/1-6-minmax.test
*** PASS: test_cases/q2/1-7-minmax.test
*** PASS: test_cases/q2/1-8-minmax.test
*** PASS: test_cases/q2/2-1a-vary-depth.test
*** PASS: test_cases/q2/2-1b-vary-depth.test
*** PASS: test_cases/q2/2-2a-vary-depth.test
*** PASS: test_cases/q2/2-2b-vary-depth.test
*** PASS: test_cases/q2/2-3a-vary-depth.test
*** PASS: test_cases/q2/2-3b-vary-depth.test
*** PASS: test_cases/q2/2-4a-vary-depth.test
*** PASS: test_cases/q2/2-4b-vary-depth.test
*** PASS: test_cases/q2/2-one-ghost-3level.test
*** PASS: test_cases/q2/3-one-ghost-4level.test
*** PASS: test_cases/q2/4-two-ghosts-3level.test
*** PASS: test_cases/q2/5-two-ghosts-4level.test
*** PASS: test_cases/q2/6-tied-root.test
*** PASS: test_cases/q2/7-1a-check-depth-one-ghost.test
*** PASS: test_cases/q2/7-1b-check-depth-one-ghost.test
*** PASS: test_cases/q2/7-1c-check-depth-one-ghost.test
*** PASS: test_cases/q2/7-2a-check-depth-two-ghosts.test
*** PASS: test_cases/q2/7-2b-check-depth-two-ghosts.test
*** PASS: test_cases/q2/7-2c-check-depth-two-ghosts.test
*** Running MinimaxAgent on smallClassic 1 time(s).
Pacman died! Score: 84
Average Score: 84.0
Scores:
               84.0
Win Rate:
               0/1 (0.00)
Record:
              Loss
*** Finished running MinimaxAgent on smallClassic after 0 seconds.
*** Won 0 out of 1 games. Average score: 84.000000 ***
*** PASS: test_cases/q2/8-pacman-game.test
### Question q2: 30/30 ###
Finished at 19:24:11
Provisional grades
Question q2: 30/30
Total: 30/30
```

Q3. Alpha-Beta Pruning

```
Question q3
_____
*** PASS: test_cases/q3/0-eval-function-lose-states-1.test
*** PASS: test_cases/q3/0-eval-function-lose-states-2.test
*** PASS: test_cases/q3/0-eval-function-win-states-1.test
*** PASS: test_cases/q3/0-eval-function-win-states-2.test
*** PASS: test_cases/q3/0-lecture-6-tree.test
*** PASS: test_cases/q3/0-small-tree.test
*** PASS: test_cases/q3/1-1-minmax.test
*** PASS: test_cases/q3/1-2-minmax.test
*** PASS: test_cases/q3/1-3-minmax.test
*** PASS: test_cases/q3/1-4-minmax.test
*** PASS: test_cases/q3/1-5-minmax.test
*** PASS: test_cases/q3/1-6-minmax.test
*** PASS: test_cases/q3/1-7-minmax.test
*** PASS: test_cases/q3/1-8-minmax.test
*** PASS: test_cases/q3/2-la-vary-depth.test
*** PASS: test_cases/q3/2-1b-vary-depth.test
*** PASS: test_cases/q3/2-2a-vary-depth.test
*** PASS: test_cases/q3/2-2b-vary-depth.test
*** PASS: test_cases/q3/2-3a-vary-depth.test
*** PASS: test_cases/q3/2-3b-vary-depth.test
*** PASS: test_cases/q3/2-4a-vary-depth.test
*** PASS: test_cases/q3/2-4b-vary-depth.test
*** PASS: test_cases/q3/2-one-ghost-3level.test
*** PASS: test_cases/q3/3-one-ghost-4level.test
*** PASS: test_cases/q3/4-two-ghosts-3level.test
*** PASS: test_cases/q3/5-two-ghosts-4level.test
*** PASS: test_cases/q3/6-tied-root.test
*** PASS: test_cases/q3/7-1a-check-depth-one-ghost.test
*** PASS: test_cases/q3/7-1b-check-depth-one-ghost.test
*** PASS: test_cases/q3/7-1c-check-depth-one-ghost.test
*** PASS: test_cases/q3/7-2a-check-depth-two-ghosts.test
*** PASS: test_cases/q3/7-2b-check-depth-two-ghosts.test
*** PASS: test_cases/q3/7-2c-check-depth-two-ghosts.test
*** Running AlphaBetaAgent on smallClassic 1 time(s).
Pacman died! Score: 84
Average Score: 84.0
Scores:
               84.0
Win Rate:
               0/1 (0.00)
Record:
              Loss
*** Finished running AlphaBetaAgent on smallClassic after 0 seconds.
*** Won 0 out of 1 games. Average score: 84.000000 ***
*** PASS: test_cases/q3/8-pacman-game.test
### Question q3: 30/30 ###
Finished at 20:13:25
Provisional grades
Question q3: 30/30
Total: 30/30
```

和 minimax 類似,只是利用 Alpha-Beta 剪枝,來跳過那些不會影響決策的分支,得以節省大幅運算時間。Alpha 剪枝:如果當前節點的值 v 超過 beta,則剪枝並返回 v。同時更新 alpha;Beta 剪枝:如果當前節點的值 v 低於 alpha,則剪枝並返回 v。同時更新 beta。其餘和 minimax 大致一樣。

- Describe the idea of your design about evaluation function in Q1. 初始想法就是:首先給距離越近的食物越大的權重、距離越遠的食物越小的權重。接著就是設定一個安全距離並考慮鬼魂的位置與驚嚇狀態:離鬼魂接近到一個安全距離內,首先判斷此時鬼魂是否在驚嚇狀態內,若是且離驚嚇狀態結束還有至少兩秒,則我們要接近他必且吃掉;若已經要結束驚嚇狀態或甚至根本不在驚嚇狀態內,則要設定 penalty 來懲罰近距離接觸,最後將此分數加上原有的評分,即為我們的 evaluation function 所回傳的分數。
- Demonstrate the speed up after the implementation of pruning.

 左邊為 Q2(minimax), 右邊為 Q3(alpha-beta pruning), 可以看出透過觀察擴展出的 states 數量, pruning 後的 states 數量每一個確實都小於等於 minimax 擴展的 state.

```
Question q2
 Total states expanded in Minimax:
       PASS: test_cases/g2/0-eval-function-lose-states-1.test
 Total states expanded in Minimax: 2
*** PASS: test_cases/q2/0-eval-function-lose-states-2.test
  Total states expanded in Minimax:
  *** PASS: test_cases/g2/0-eval-function-win-states-1.test
 Total states expanded in Minimax: 2
*** PASS: test_cases/q2/0-eval-function-win-states-2.test
 Total states expanded in Minimax: 12
*** PASS: test_cases/q2/0-lecture-6-tree.test
 Total states expanded in Minimax: 7
*** PASS: test_cases/q2/0-small-tree.test
 Total states expanded in Minimax: 10
*** PASS: test_cases/q2/1-1-minmax.test
 Total states expanded in Minimax: 10
*** PASS: test_cases/q2/1-2-minmax.test
 Total states expanded in Minimax: 10
*** PASS: test_cases/q2/1-3-minmax.test
 Total states expanded in Minimax: 10
*** PASS: test_cases/q2/1-4-minmax.test
 Total states expanded in Minimax: 19
*** PASS: test_cases/q2/1-5-minmax.test
 Total states expanded in Minimax: 19
*** PASS: test_cases/q2/1-6-minmax.test
 Total states expanded in Minimax: 19
*** PASS: test_cases/q2/1-7-minmax.test
 Total states expanded in Minimax: 19
*** PASS: test_cases/q2/1-8-minmax.test
 Total states expanded in Minimax: 5
*** PASS: test_cases/q2/2-la-vary-depth.test
 Total states expanded in Minimax: 10
*** PASS: test_cases/q2/2-1b-vary-depth.test
 Total states expanded in Minimax: 5
*** PASS: test_cases/q2/2-2a-vary-depth.test
 Total states expanded in Minimax: 10
*** PASS: test_cases/q2/2-2b-vary-depth.test
*** PASS: test_cases/q2/2-2b-vary-depth.test
Total states expanded in Minimax: 5
*** PASS: test_cases/q2/2-3a-vary-depth.test
Total states expanded in Minimax: 10
*** PASS: test_cases/q2/2-3b-vary-depth.test
Total states expanded in Minimax: 5
*** PASS: test_cases/q2/2-la-vary-depth.test
Total states expanded in Minimax: 10
*** PASS: test_cases/q2/2-4b-vary-depth.test
Total states expanded in Minimax: 11
*** PASS: test_cases/q2/2-one-ghost-3level.test
Total states expanded in Minimax: 30
*** PASS: test_cases/q2/2-one-ghost-3level.test
 *** PASS: test_cases/q2/3-one-ghost-4level.test
Total states expanded in Minimax: 14
 Total states expanded in Minimax: 14
*** PASS: test_cases/q2/4-two-ghosts-3level.test
Total states expanded in Minimax: 30
*** PASS: test_cases/q2/5-two-ghosts-4level.test
Total states expanded in Minimax: 5
*** PASS: test_cases/q2/6-tied-root.test
Total states expanded in Minimax: 6
*** PASS: test_cases/q2/6-tied-root.test
 *** PASS: test_cases/q2/7-la-check-depth-one-ghost.test
Total states expanded in Minimax: 12
 *** PASS: test_cases/q2/7-1b-check-depth-one-ghost.test
Total states expanded in Minimax: 18
 *** PASS: test_cases/q2/7-1c-check-depth-one-ghost.test
Total states expanded in Minimax: 9
 *** PASS: test_cases/q2/7-2a-check-depth-two-ghosts.test
Total states expanded in Minimax: 18
 *** PASS: test_cases/q2/7-2b-check-depth-two-ghosts.test
Total states expanded in Minimax: 27
```

Question q3 Total states expanded in Alpha-Beta: 2
*** PASS: test_cases/q3/0-eval-function-lose-states-1.test Total states expanded in Alpha-Beta: 2
*** PASS: test_cases/q3/0-eval-function-lose-states-2.test Total states expanded in Alpha-Beta: 2

*** PASS: test_cases/q3/0-eval-function-win-states-1.test Total states expanded in Alpha-Beta: 2 *** PASS: test_cases/q3/0-eval-function-win-states-2.test Total states expanded in Alpha-Beta: 11
*** PASS: test_cases/q3/0-lecture-6-tree.test Total states expanded in Alpha-Beta: 5
*** PASS: test_cases/q3/0-small-tree.test Total states expanded in Alpha-Beta: 9
*** PASS: test_cases/q3/1-1-minmax.test Total states expanded in Alpha-Beta: 9
*** PASS: test_cases/q3/1-2-minmax.test Total states expanded in Alpha-Beta: 7
*** PASS: test_cases/q3/1-3-minmax.test Total states expanded in Alpha-Beta: 10
*** PASS: test_cases/q3/1-4-minmax.test Total states expanded in Alpha-Beta: 1: *** PASS: test_cases/q3/1-5-minmax.test Total states expanded in Alpha-Beta: 18
*** PASS: test_cases/q3/1-6-minmax.test Total states expanded in Alpha-Beta: 1
*** PASS: test_cases/q3/1-7-minmax.test Total states expanded in Alpha-Beta: 1'
*** PASS: test_cases/q3/1-8-minmax.test Total states expanded in Alpha-Beta: 5
*** PASS: test_cases/q3/2-la-vary-depth.test Total states expanded in Alpha-Beta: 9
*** PASS: test_cases/q3/2-1b-vary-depth.test Total states expanded in Alpha-Beta: 5
*** PASS: test_cases/q3/2-2a-vary-depth.test Total states expanded in Alpha-Beta: 9
*** PASS: test_cases/q3/2-2b-vary-depth.test Total states expanded in Alpha-Beta: 5
*** PASS: test_cases/q3/2-3a-vary-depth.test Total states expanded in Alpha-Beta: 7
*** PASS: test_cases/q3/2-3b-vary-depth.test Total states expanded in Alpha-Beta: 5
*** PASS: test_cases/q3/2-4a-vary-depth.test Total states expanded in Alpha-Beta: 7 *** PASS: test_cases/q3/2-4b-vary-depth.test Total states expanded in Alpha-Beta: 10
*** PASS: test_cases/q3/2-one-ghost-3level.test
Total states expanded in Alpha-Beta: 18
*** PASS: test_cases/q3/3-one-ghost-4level.test Total states expanded in Alpha-Beta: 13
*** PASS: test_cases/q3/4-two-ghosts-3level.test Total states expanded in Alpha-Beta: 19 *** PASS: test_cases/q3/5-two-ghosts-4level.test Total states expanded in Alpha-Beta: 5
*** PASS: test_cases/q3/6-tied-root.test Total states expanded in Alpha-Beta: 6 *** PASS: test_cases/q3/7-1a-check-depth-one-ghost.test Total states expanded in Alpha-Beta: 12
*** PASS: test_cases/q3/7-1b-check-depth-one-ghost.test Total states expanded in Alpha-Beta: 18 *** PASS: test_cases/q3/7-1c-check-depth-one-ghost.test Total states expanded in Alpha-Beta: '9 *** PASS: test_cases/q3/7-2a-check-depth-two-ghosts.test Total states expanded in Alpha-Beta: 18 *** PASS: test_cases/q3/7-2b-check-depth-two-ghosts.test Total states expanded in Alpha-Beta: 27