דו"ח מעבדה 2 – אלגוריתמים גנטיים:

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חלק א' – חיפוש לוקאלי:

ממנו: התקן ממנו ה' fitness של האוכלוסייה בכל דור וסטיית התקן ממנו: .1

```
static void calc_ga_stat(ga_vector &population)

{
    unsigned int sumFitness = 0;
    for (int i = 0; i < GA_POPSIZE; i++) // sum all
    {
        sumFitness += population[i].fitness;
    }

double mean = sumFitness / GA_POPSIZE; // uniform mean
double std = 0;
    for (int i = 0; i < GA_POPSIZE; i++)

{
        double fitness = population[i].fitness;
        std += pow(fitness - mean, 2);

}

std = sqrt(std); // simple std as we recognize with
for (int i = 0; i < GA_POPSIZE; i++)

{
        population[i].mean = mean;
        population[i].std = std;

}

}
</pre>
```

דיווח ממוצע ה-fitness של האוכלוסייה בכל דור וסטיית התקן ממנו:

```
Best: Hello Wprld! (1) -> [mean=11,std=1035.21] -> CPU Clock Ticks=592,Elapsed Run Time=0 -> Generation=34
Best: Hello World! (0) -> [mean=10,std=984.898] -> CPU Clock Ticks=607,Elapsed Run Time=1 -> Generation=35
End-up after: 623.00 ticks and 1.00 seconds
```

2. חישוב זמן ריצה עד להתכנסות לפי clock ticks and elapsed time בכל דור:

בכל דור: clock ticks and elasped time בכל דור להתכנסות לפי

```
Best: Hello Wprld! (1) -> [mean=14,std=1014.18] -> CPU Clock Ticks=532,Elapsed Run Time=0 -> Generation=31
Best: Hello World! (0) -> [mean=12,std=956.333] -> CPU Clock Ticks=548,Elapsed Run Time=0 -> Generation=32
End-up after: 563.00 ticks and 0.00 seconds
```

:calc_fitness היוריסטיקת "בול פגיעה" כחלק מהפונקציה 3

```
else if (fitnessEstimation.compare("BACS") == 0)  // Bull And Cows
    for (int i = 0; i < GA_POPSIZE; i++)
        int fitness = 0;
            if (population[i].str[j] != target[j])
                fitness++; //caught different places to count the same as compliment
        int localFitness = 0;
        for (int j = 0; j < tsize; j++)
            for (int k = 0; k < tsize; k++)
                if (population[i].str[k] != target[k] && (j != k) && population[i].str[j] != target[k] && !SEEN)
                    localFitness++; // pay more for the difference places!
                    SEEN = true;
        population[i].caughtPlaces = tsize - fitness;
        population[i].fitness = fitness + localFitness;
        population[i].cpuTicks = ((double)(clock() - startClock));
        population[i].elapsedTime = time(&population[i].elapsedTime) - startTime;
Population::calc_ga_stat(population);
```

השוואה בין היוריסטיקת "בול פגיעה" להיוריסטיקה המקורית:

מקורית
פונקציית מרחק מנהטן משקלים מפולגים אחיד במחרוזת
לינארית באורך הקלט
דורשת הרבה דורות

שימוש בהיוריסטיקת "בול פגיעה":

```
Best: Hello World! (0) -> [mean=15,std=52.6688] -> CPU Clock Ticks=403,Elapsed Run Time=0 -> Generation=15 End-up after: 424.00 ticks and 0.00 seconds
```

שימוש בהיוריסטיקה המקורית:

```
Best: Hello World! (0) -> [mean=11,std=1015.48] -> CPU Clock Ticks=639,Elapsed Run Time=0 -> Generation=36 End-up after: 654.00 ticks and 0.00 seconds
```

- ההיוריסטיקה של "בול פגיעה" קשורה למוטציות במהלך האלגוריתם באופן שבו כאשר יתבצע שינוי מוטנטי חלק מאותם גנים מאוד יתקרבו ויקטינו את "קירבתם" לפתרון משמעותית (כי לאחר שינוי זה "בול פגיעה" תחושב שוב) ולכן זה יצור התכנסות מהירה יותר לפתרון.
 - ההיוריסטיקה של "בול פגיעה" אכן משפרת את ההיוריסטיקה המקורית כפי שנאמר בטבלה הנ"ל מסיבת הבינה שמוכנסת אליה בהתאם לנתונים המעורבים.
 - 4. תמיכה ב-SUS:

```
atic int SUS(ga_vector &population, ga_vector &buffer)
  ga_vector leftOver(GA_POPSIZE);
  int sum = population[0].fitness;
  for (int i = 0; i < population.size(); i++)</pre>
      m += population[i].fitness;
 // m /= population.size(); // finding avg of population
double r = (double)rand() / (RAND_MAX + 1);// pick random number between 0 to 1
  int j = 0, i = 0, k = 0;
      if (delta < sum) // for some delta we divide the population by sum - that is the point of this method [part of roullete]
           buffer[i] = population[j];
buffer[i].str = population[j].str;
           delta += sum;
           // keep into leftOver all individuals about sum less of equals than delta
sum += population[j].fitness;
           leftOver[k] = population[j];
leftOver[k].str = population[j].str;
  } while (j < population.size());</pre>
  int startRest = i;
for (k = i, j = 0; k < GA_POPSIZE - i; k++, j++) // coping leftOvers to the buffer's back
      buffer[k] = leftOver[j];
buffer[k].str = leftOver[j].str;
  return startRest;
```

:Tournament

```
static int Tournament(ga_vector &population, ga_vector &buffer)
   vector<int> rest;
   ga_struct best;
   bool isBestNull = true;
       int ind = rand() % population.size();
       if (isBestNull || (best.fitness > population[ind].fitness))
           best = population[ind];
           isBestNull = false;
           rest.push_back(ind);
   for (int i = 0; i < GA_POPSIZE; i++)
       if ((k < rest.size()) && (i == rest[k]))
           buffer[j] = population[i];
           j++;
           k++;
       }
   for (int i = 0; (k < rest.size()) && (j < GA_POPSIZE) && (i < GA_POPSIZE); i++)
       if (i != rest[k])
           buffer[j] = population[i];
            j++;
            k++;
    return restStart;
```

```
static int Turnir(ga_vector &population, ga_vector &buffer)
   vector<int> rest;
   for (int i = 0; i < K; i++)
       int ipos = rand() % GA_POPSIZE;
       int jpos = rand() % GA_POPSIZE;
       bool SEEN = false;
       for (int h = 0; h < i; h++)
            if (rest[h] == ipos || rest[h] == jpos)
       if (SEEN == true)
       if (population[ipos].fitness < population[jpos].fitness)</pre>
           buffer[j] = population[ipos];
           rest.push_back(jpos);
           buffer[j] = population[jpos];
           rest.push_back(ipos);
       j++;
   sort(rest.begin(), rest.end());
   int restStart = j;
   int k = 0;
   for (int i = 0, k = 0; i < GA_POPSIZE; i++) // put in the buffer's back
```

:"twoPoints" - אסטרטגיית שחלוף נוספת

אסטרטגיית שחלוף נוספת:

```
static void uniform(ga_struct &populationi1, ga_struct &populationi2, ga_struct &bufferi)

for(int i = 0;i < GA_TARGET.size();i++){
    int gen_to_select = rand() % 2;
    if(gen_to_select == 0){
        bufferi.str[i] = populationi1.str[i];
    } else {
        bufferi.str[i] = populationi2.str[i];
    }
}
</pre>
```

אסטרטגיית מוטציה נוספת:

```
static void swap(ga_struct &member)
{

// swapping between two indecies - very simple method:
    int tsize = GA_TARGET.size();
    int ipos = rand() % tsize;
    int jpos = rand() % tsize;

char temp = member.str[ipos];
    member.str[ipos] = member.str[jpos];
    member.str[jpos] = temp;
}
```

7. בדיקת רגישות:

בול "בול המחרוזת עם היוריסטיקה המקורית ו-(2) בעיית המחרוזת עם היוריסטיקת בעיית המחרוזת עם היוריסטיקת "בול פגיעה".

Х.

(2)	(1)	גודל אוכלוסייה
14 דורות,1 שניות,449 טיקים	עניות, 638 טיקים 29	2048
14 דורות,1 שניות,191 טיקים	28 דורות,2 שניות,1679 טיקים	5500
12 דורות,2 שניות,1859 טיקים	25 דורות,3 שניות,2763 טיקים	10000
11 דורות,4 שניות,3577 טיקים	22 דורות,5 שניות,5056 טיקים	20000

• ניתן להבחין שגודל האוכלוסייה משפיע באופן דרמתי על כמות הטיקים של שעון המחשב ועל זמן החישוב. יתרה מזאת ניתן לראות באופן מובהק שמספר הדורות באופן ממוצע נשאר זהה – רגישות לגודל האוכלוסייה בפרמטר הזמן.

	(2)	(1)	הסתברות למוטציות
	14 דורות,1 שניות,421 טיקים	43 דורות,1 שניות,968 טיקים	10%
ĺ	14 דורות,1 שניות,422 טיקים	36 דורות,1 שניות,807 טיקים	25%
	16 דורות,1 שניות,503 טיקים	38 דורות,1 שניות,854 טיקים	55%
ĺ	17 דורות,0 שניות,533 טיקים	98 דורות,2 שניות,2309 טיקים	90%

• ניתן להבחין בשינוי מספר הדורות של אלגוריתם (1) בפונקציה של הסתברות למוטציות לעומת אלגוריתם (2) שהוא יותר יציב. בפרמטרי הזמן בממוצע אין שינוי – רגישות להסתברות למוטציות בפרמטר של מספר דורות עבור אלגוריתם (1).

ג.

(2)	(1)	פרופורציית האוכלוסייה האליטיסטית
14 דורות,1 שניות,445 טיקים	28 דורות,1 שניות,611 טיקים	10%
16 דורות,1 שניות,491 טיקים	34 דורות,1 שניות,725 טיקים	30%
22 דורות,0 שניות,667 טיקים	46 דורות,1 שניות,973 טיקים	60%
56 דורות,1 שניות,1644טיקים	278 דורות,6 שניות,5699 טיקים	90%

• ניתן להבחין שהפרמטרים ששני האלגוריתמים גדלים כפונקציה של פרופורציית האוכלוסייה האליטיסטית פרט לפרמטר הזמן שהוא באופן ממוצע יציב אצל אלגוריתם (2) – רגישות לפרופורציית האוכלוסייה האליטיסטית פרט לזמן באלגוריתם (2).

.7

(2)	(1)	אסטרטגיית הבחירה
15 דורות,1 שניות,441 טיקים	35 דורות,1 שניות,765 טיקים	elitism
14 דורות,1 שניות,438 טיקים	37 דורות,0 שניות,860 טיקים	Turnir
13 דורות,0 שניות,414 טיקים	67 דורות,2 שניות,1570 טיקים	SUS
15 דורות,1 שניות,486 טיקים	49 דורות,1 שניות,1085 טיקים	Tournament

• ניתן להבחין שאלגוריתם 1 יותר מושפע משינוי שיטת הבחירה מאשר אלגוריתם (2) שיציב עם שונות נמוכה – רגישות לאסטרטגיית הבחירה באלגוריתם (1).

٦.

(2)	(1)	אסטרטגיית השחלוף
15 דורות,0 שניות,402 טיקים	53 דורות,1 שניות,906 טיקים	onePoint
15 דורות,0 שניות,457 טיקים	26 דורות,1 שניות,568 טיקים	twoPoints
14 דורות,0 שניות,379 טיקים	96 דורות,2 שניות,1562 טיקים	uniform

- כמו באסטרטגיית הבחירה הנ"ל גם כאן ניתן להבחין ברגישות אלגוריתם (1) לשינוי שיטת השחלוף בניגוד ליציבות של אלגוריתם (2).
 - איכות הפתרון לפי כל פרמטר הוא מצוין, כלומר ברוב המוחלט של המקרים האלגוריתם התכנס.

חלק ב' – חיפוש עם אילוצים:

:N ייצוג מתאים לגן באורך.

```
23  struct stateBoard {
24    vector<int> _board;
25    unsigned int _fitness;
26  };
```

. ממוקמת המלכה שבה השורה את מכיל ה-iהעמודה העמרה כאשר לאורך את השורה העמודה אוקטור כאשר העמודה ה

:simple reverse

```
static void simpleReverse(state &member)
    int tsize = GA_NQUE_SIZE;
    int ipos = rand() % tsize;
    int jpos = rand() % tsize;
    int low = 0, high = 0;
    if (ipos < jpos)
    {
        low = ipos;
        high = jpos;
    }
    else
    {
        low = jpos;
        high = ipos;
    vector<int> s(GA NQUE SIZE);
    for (int i = 0; i < low; i++)
    {
        s.push_back(member._board[i]);
    vector<int> toRev;
    for (int i = low; i \leftarrow high; i++)
    {
        toRev.push_back(member._board[i]);
    reverse(toRev.begin(), toRev.end());
    for (int i = 0; i < toRev.size(); i++)
    {
        s.push_back(toRev[i]);
    for (int i = high + 1; i < GA_NQUE_SIZE; i++)
        s.push_back(member._board[i]);
```

```
for(int i = 0;i < GA_NQUE_SIZE;i++){

member._board[i] = s[i];

261 }

262 }
```

:insertion

```
static void insertion(state &member)

// insert new random letter to random place
int tsize = GA_NQUE_SIZE;
int ipos = rand() % tsize;

int nextPlace = rand() % tsize;

vector<int> temp(GA_NQUE_SIZE);
for(int i = 0;i < GA_NQUE_SIZE;i++){
    if(i != ipos){
        temp.push_back(member._board[i]);
        } else if(i == nextPlace){
        temp.push_back(member._board[i]);
        temp.push_back(member._board[i]);
        temp.push_back(member._board[i]);
        temp.push_back(member._board[i]);
        temp.push_back(member._board[i]);
        temp.push_back(member._board[i]);
}

for(int i = 0;i < GA_NQUE_SIZE;i++){
        member._board[i] = temp[i];
}
</pre>
```

:PMX operator

```
tatic void PMX(state &populationi1, state &populationi2, state &bufferi)
   //initial buffer for result usage
for(int i = 0;i < GA_NQUE_SIZE;i++){</pre>
       bufferi._board[i] = -1;
   //picking randomly block chunck
int ipos = rand() % GA_NQUE_SIZE;
   int jpos = rand() % GA_NQUE_SIZE;
   int low = 0, high = 0;
   if(ipos <= jpos){
       low = ipos;
       high = jpos;
   } else {
low = jpos;
       high = ipos;
   //directly trasform the p1 segment to the children keeping the alels order for(int i = low;i <= high;i++){
       bufferi._board[i] = populationi1._board[i];
   vector<int> p2_src; // values from p1
vector<int> p2_dest; // values from p2
for(int i = low;i <= high;i++){</pre>
       bool IS_THERE = false;
        for(int j = low; j <= high; j++){</pre>
            if(populationi2._board[i] == populationi1._board[j]){
                 IS_THERE = true;
       }
//building the mapping between values in p2 to values same location in p1 where these values are no in child already
       if(!IS_THERE){
            p2_src.push_back(populationi2._board[i]);
            p2_dest.push_back(populationi1._board[i]);
   }
for(int i = 0;i < p2_dest.size();i++){
        for(int j = 0; j < GA_NQUE_SIZE; j++){
```

```
if(populationi2._board[j] == p2_dest[i]){
    //check if this place is empty
    if(bufferi._board[j] == -1){
        bufferi._board[j] = p2_src[i];
    }
    //else {
        // because of duplication is allowd better is to live this case because of Inf loop and bad performance we could achieve.
        // this is working well without it!
        // b
}

for(int i = 0; i < GA_NQUE_SIZE;i++){
        if(bufferi._board[i] == -1){
        bufferi._board[i] = populationi2._board[i];
        }
}
</pre>
```

:OX operator

```
static void OX(state &populationi1, state &populationi2, state &bufferi)
{
    //initial buffer for result usage
    for(int i = g; i < GA NQUE_SIZE;i++){
        bufferi._board[i] = -1;
    }
    // pick chunck of alels from populationi1
    int ipos = rand() % GA_NQUE_SIZE;
    int jpos = rand() % GA_NQUE_SIZE;
    int low = 0,high = 0;
    if(ipos <- jpos){
        low = ipos;
        high = ipos;
        high = ipos;
    }
    // directly trasform the p1 segment to the children keeping the alels order
    for(int i = low;i <= high;i++){
        bufferi._board[i] = populationi1._board[i];
    }
    // picking each value in index i to be in buffer index i -> this operation is handling duplications otherwise there is no any coverage.
    for(int i = (high + 1);i < GA_NQUE_SIZE;i++){
        bufferi._board[i] = populationi2._board[i];
    }
    for(int i = (high + 1);i < GA_NQUE_SIZE;i++){
        bufferi._board[i] = populationi2._board[i];
    }
}</pre>
```

הרצת האלגוריתם לגדלי לוח שונים:

:n = 8

```
8 Queens solution using Genetic algorithms:
Best Position: <1,5,7,0,6,3,2,7> (fitness=2,generation=1)
Best Position: <5,1,4,7,0,3,1,6> (fitness=1,generation=2)
Best Position: <0,6,1,7,5,3,2,4> (fitness=1,generation=3)
Best Position: <5,1,4,7,0,3,1,6> (fitness=1,generation=4)
Best Position: <7,4,1,5,2,6,0,3> (fitness=1,generation=5)
Best Position: <4,4,7,0,3,6,2,5> (fitness=1,generation=6)
Best Position: <2,4,7,3,0,6,1,5> (fitness=0,generation=7)
Solution visualization:
  0 0 0 X 0 0 0
0
0
  0
     0
       0 0 0
                х о
  0
     0
        0
          0
             0 0 0
0
  0
     0
        X
           0
              0
                0
                   0
0
  Χ
     0 0 0 0 0 0
0
  0 0 0 0 0 X
0
  0
     0
       0
          0 X
                0 0
0
  0 X 0 0 0 0 0
End-up after: 179.00 ticks and 0.00 seconds
```

```
15 Queens solution using Genetic algorithms:
Best Position: <4,2,10,6,1,3,12,3,0,11,7,2,7,13,8> (fitness=5,generation=1)
Best Position: <4,2,10,6,1,3,12,3,0,11,7,2,7,13,8> (fitness=5,generation=2)
Best Position: <9,2,0,13,11,8,12,3,3,14,4,10,5,1,7> (fitness=4,generation=3)
Best Position: <9,2,0,13,11,8,12,3,3,14,4,10,5,1,7> (fitness=4,generation=4)
Best Position: <4,14,11,3,10,6,1,9,2,0,7,1,7,11,13> (fitness=4,generation=5)
Best Position: <12,5,11,8,10,4,14,0,11,6,1,7,10,13,3> (fitness=3,generation=6)
Best Position: <12,5,11,8,10,4,14,0,11,6,1,7,10,13,3> (fitness=3,generation=7)
Best Position: <3,1,11,14,9,6,12,0,0,13,5,8,2,4,10> (fitness=3,generation=8)
Best Position: <12,5,11,8,10,4,14,0,11,6,1,7,10,13,3> (fitness=3,generation=9)
Best Position: <3,1,11,14,9,6,12,0,0,13,5,8,2,4,10> (fitness=3,generation=10)
Best Position: <12,5,11,8,10,4,14,0,11,6,1,7,10,13,3> (fitness=3,generation=11)
Best Position: <3,1,11,14,9,6,12,0,0,13,5,8,2,4,10> (fitness=3,generation=12)
Best Position: <4,1,14,0,6,7,12,10,13,2,9,3,8,11,1> (fitness=2,generation=13)
Best Position: <13,4,5,8,0,12,4,2,14,11,9,1,3,10,7> (fitness=2,generation=14)
Best Position: <4,1,14,0,6,7,12,10,13,2,9,3,8,11,1> (fitness=2,generation=15)
Best Position: <13,4,5,8,0,12,4,2,14,11,9,1,3,10,7> (fitness=2,generation=16)
Best Position: <4,1,14,0,6,7,12,10,13,2,9,3,8,11,1> (fitness=2,generation=17)
Best Position: <13,4,5,8,0,12,4,2,14,11,9,1,3,10,7> (fitness=2,generation=18)
Best Position: <4,1,14,0,6,7,12,10,13,2,9,3,8,11,1> (fitness=2,generation=19)
Best Position: <13,4,5,8,0,12,4,2,14,11,9,1,3,10,7> (fitness=2,generation=20) Best Position: <4,1,14,0,6,7,12,10,13,2,9,3,8,11,1> (fitness=2,generation=21)
Best Position: <13,4,5,8,0,12,4,2,14,11,9,1,3,10,7> (fitness=2,generation=22)
Best Position: <3,5,10,14,11,6,12,2,0,8,12,9,1,13,7> (fitness=2,generation=23)
Best Position: <4,1,14,0,6,7,12,10,13,2,9,3,8,11,1> (fitness=2,generation=24)
Best Position: <13,4,5,8,0,12,4,2,14,11,9,1,3,10,7> (fitness=2,generation=25)
Best Position: <3,5,10,14,11,6,12,2,0,8,12,9,1,13,7> (fitness=2,generation=26)
Best Position: <4,1,14,0,6,7,12,10,13,2,9,3,8,11,1> (fitness=2,generation=27)
Best Position: <13,4,5,8,0,12,4,2,14,11,9,1,3,10,7> (fitness=2,generation=28) Best Position: <13,4,5,11,6,14,12,2,0,8,10,1,3,9,7> (fitness=1,generation=29)
Best Position: <13,4,5,11,6,14,12,2,0,8,10,1,3,9,7> (fitness=1,generation=30)
Best Position: <13,4,5,11,6,14,12,2,0,8,10,1,3,9,7> (fitness=1,generation=31)
Best Position: <13,4,5,11,6,14,12,2,0,8,10,1,3,9,7> (fitness=1,generation=32)
Best Position: <13,4,5,11,6,14,12,2,0,8,10,1,3,9,7> (fitness=1,generation=33)
Best Position: <1,11,4,12,7,0,8,3,13,9,14,2,5,10,6> (fitness=1,generation=34)
Best Position: <13,4,5,11,6,14,12,2,0,8,10,1,3,9,7> (fitness=1,generation=35)
Best Position: <1,11,4,12,7,0,8,3,13,9,14,2,5,10,6> (fitness=1,generation=36)
Best Position: <1,11,4,12,7,0,8,3,13,9,14,2,5,10,6> (fitness=1,generation=37)
Best Position: <4,1,12,5,9,13,3,8,14,7,2,0,11,6,10> (fitness=0,generation=38)
Solution visualization:
      0 0 0 0 0
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             0 0
                   0 0 X
                              0
                                 0 0
```

End-up after: 1203.00 ticks and 1.00 seconds

```
25 Queens solution using Genetic algorithms:
Best Position: <17,12,14,11,3,23,6,16,3,10,21,16,9,19,6,22,20,8,22,24,1,12,2,0,7> (fitness=12,generation=1)
Best Position: <13,23,13,0,8,22,17,7,21,19,15,9,10,20,4,12,18,11,24,0,16,22,13,3,16> (fitness=11,generation=2)
Best Position: <0,12,22,11,3,23,6,16,3,10,21,16,14,2,6,22,20,13,9,15,18,4,19,17,7> (fitness=10,generation=3)
Best Position: <0,12,22,11,3,23,6,16,3,10,21,16,14,2,6,22,20,13,9,15,18,4,19,17,7> (fitness=10,generation=4)
Best Position: <17,8,1,4,11,7,16,22,19,2,14,20,6,5,0,13,7,18,7,19,23,15,10,3,23> (fitness=9,generation=5)
Best Position: <17,8,1,4,11,7,16,22,19,2,14,20,6,5,0,13,7,18,7,19,23,15,10,3,23> (fitness=9,generation=6)
Best Position: <17,8,1,4,11,7,16,22,19,2,14,20,6,5,0,13,7,18,7,19,23,15,10,3,23> (fitness=9,generation=7)
Best Position: <10,5,9,19,7,12,6,20,3,21,15,5,14,24,15,23,22,4,6,1,16,2,13,18,8> (fitness=8,generation=8)
Best Position: <10,5,9,19,7,12,6,20,3,21,15,5,14,24,15,23,22,4,6,1,16,2,13,18,8> (fitness=8,generation=10)
Best Position: <10,5,9,19,7,12,6,20,3,21,15,5,14,24,15,23,22,4,6,1,16,2,13,18,8> (fitness=8,generation=11)
Best Position: <10,5,9,19,7,12,6,20,3,21,15,5,14,24,15,23,22,4,6,1,16,2,13,18,8> (fitness=8,generation=12)
Best Position: <10,5,9,19,7,12,6,20,3,21,15,5,14,24,15,23,22,4,6,1,16,2,13,18,8> (fitness=8,generation=12)
Best Position: <10,5,9,19,7,12,6,20,3,21,15,5,14,24,15,23,22,4,6,1,16,2,13,18,8> (fitness=8,generation=12)
Best Position: <10,5,9,19,7,12,6,20,3,21,15,5,14,24,15,23,22,4,6,1,16,2,13,18,8> (fitness=7,generation=13)
Best Position: <10,5,9,19,7,12,6,20,3,21,15,5,14,24,15,23,22,4,6,1,16,2,13,18,8> (fitness=7,generation=14)
Best Position: <10,5,9,19,7,12,6,20,3,21,15,5,14,24,15,23,22,4,23,0,20,10,21,18,10,19> (fitness=7,generation=15)
Best Position: <10,5,9,21,14,7,22,0,6,13,16,2,24,12,3,22,4,23,0,20,10,21,18,10,19> (fitness=7,generation=16)
Best Position: <10,5,9,21,14,7,22,0,6,13,16,2,24,12,3,22,4,23,0,20,10,21,18,10,19> (fitness=7,generation=17)
Best Position: <10,5,0,10,19,5,11,17,3,22,16,14,24,8,4,23,9,
```

Best Position: <6,13,15,10,7,2,20,23,0,11,21,12,16,9,24,4,17,22,3,18,14,19,5,1,8> (fitness=1,generation=120) Best Position: <6,13,15,10,7,2,20,23,0,11,21,12,16,9,24,4,17,22,3,18,14,19,5,1,8> (fitness=1,generation=121) Best Position: <6,13,15,2,7,10,20,23,0,16,14,1,21,9,24,4,17,11,3,12,22,19,5,18,8> (fitness=1,generation=122) Best Position: <6,13,15,10,7,2,20,23,0,11,21,12,16,9,24,4,17,22,3,18,14,19,5,1,8> (fitness=1,generation=123) $Best\ Position:\ \langle 6,13,15,10,7,2,20,23,0,11,21,12,16,9,24,4,17,22,3,18,14,19,5,1,8 \rangle\ (fitness=1,generation=124)$ Best Position: <6,13,15,10,7,2,20,23,0,11,21,12,16,9,24,4,17,22,3,18,14,19,5,1,8> (fitness=1,generation=125) Best Position: <6,13,15,21,7,2,20,23,0,16,10,1,11,9,24,4,17,22,3,12,14,19,5,18,8> (fitness=0,generation=126) Solution visualization: 0 X 0 X 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 X 0 0 0 0 0 0 0 0 0 0 0 0 0 0 X 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 X 0 X 0 X 0 0 0 0 0 0 0 0 0 End-up after: 5913.00 ticks and 5.00 seconds

:Minimal conflicts השוואה בין ביצועי האלגוריתם הגנטי לבין - 9

MC	GA	פרמטר
מהיר	סביר	זמן
לינארי באורך הקלט	צריכה גבוהה	מקום
גרועה	טובה מאוד	יכולת לפתור לוחות גדולים ללא
		מצב התחלה טוב
מצוינת	מצוינת	יכולת לפתור לוחות גדולים עם מצב
		התחלה טוב
גבוהות	סבירות	איטרציות ללא מצב התחלה טוב
מעטות	מעטות	איטרציות עם מצב התחלה טוב

• ההכלאה בין האלגוריתמים הינה אפשרית באופן שבו minimal conflicts יכול להוות מוטציה לצורך שיפור הגן לקראת הדור הבא וע"י כך לשפר את הדור הבא בצורה חכמה יותר ולשפר את מהירות ההתכנסות בצורה משמעותית.

10. הדגמה ושימוש באלגוריתם הגנטי בכדי לפתור את "בעיית השק":

פריט יראה מהצורה הבאה:

```
struct item {
    vector<pair<pair</pre>
vector<pair<pair</p>
struct item {
    vector<pair<pair</p>
vector<pair</p>
ventor<pair</p>
vector<pair</p>
vect
```

ה-typedef נועד לצורך שימוש במערך של פריטים באורך נוח במהלך התוכנית. •

באופן דומה ל-framework הנ"ל נשתמש:

- elitism שיטת בחירה .1
- onePoint שיטת שחלוף .2
- flip one random bit שיטת מוטציה.

```
Computing problem number 1 solution...
Best Solution: <1,1,0,1,0,0,1,0,0,0 (Weight = 161, Profit = 284, Generation = 1)
Best Solution: <1,1,1,1,0,1,0,0,0,0 (Weight = 165, Profit = 309, Generation = 2)
Best Solution: <1,1,1,1,0,1,0,0,0,0> (Weight = 165, Profit = 309, Generation = 3)
Best Solution: <1,1,1,1,0,1,0,0,0,0> (Weight = 165, Profit = 309, Generation = 4)
Best Solution: <1,1,1,1,0,1,0,0,0,0 (Weight = 165, Profit = 309, Generation = 5)
Best Solution: <1,1,1,1,0,1,0,0,0,0> (Weight = 165, Profit = 309, Generation = 6)
Best Solution: <1,1,1,1,0,1,0,0,0,0> (Weight = 165, Profit = 309, Generation = 7)
Best Solution: <1,1,1,1,0,1,0,0,0,0> (Weight = 165, Profit = 309, Generation = 8)
Best Solution: <1,1,1,1,0,1,0,0,0,0> (Weight = 165, Profit = 309, Generation = 9)
Best Solution: <1,1,1,1,0,1,0,0,0,0 (Weight = 165, Profit = 309, Generation = 10)
Best Solution: <1,1,1,1,0,1,0,0,0,0 (Weight = 165, Profit = 309, Generation = 11)
Best Solution: <1,1,1,1,0,1,0,0,0,0 (Weight = 165, Profit = 309, Generation = 12)
Best Solution: <1,1,1,1,0,1,0,0,0,0 (Weight = 165, Profit = 309, Generation = 13)
Best Solution: <1,1,1,1,0,1,0,0,0,0 (Weight = 165, Profit = 309, Generation = 14)
Best Solution: <1,1,1,1,0,1,0,0,0,0 (Weight = 165, Profit = 309, Generation = 15)
Best Solution: <1,1,1,1,0,1,0,0,0,0 (Weight = 165, Profit = 309, Generation = 16)
Best Solution: <1,1,1,1,0,1,0,0,0,0 (Weight = 165, Profit = 309, Generation = 17)
Best Solution: <1,1,1,1,0,1,0,0,0,0 (Weight = 165, Profit = 309, Generation = 18)
Best Solution: <1,1,1,1,0,1,0,0,0,0 (Weight = 165, Profit = 309, Generation = 19)
Best Solution: <1,1,1,1,0,1,0,0,0,0 (Weight = 165, Profit = 309, Generation = 20)
Best Solution: <1,1,1,1,0,1,0,0,0,0 (Weight = 165, Profit = 309, Generation = 21)
Best Solution: <1,1,1,1,0,1,0,0,0,0> (Weight = 165, Profit = 309, Generation = 22)
An Optimal Packing: <1,1,1,1,0,1,0,0,0,0> (Weight = 165, Profit = 309, Generation = 22)
End-up after: 123.00 ticks and 0.00 seconds
```

:2 פתרון בעיה

```
Computing problem number 2 solution...
Best Solution: <0,1,1,1,0> (Weight = 26,Profit = 51,Generation = 1)
Best Solution: <0,1,1,1,0> (Weight = 26, Profit = 51, Generation = 2)
Best Solution: <0,1,1,1,0> (Weight = 26, Profit = 51, Generation = 3)
Best Solution: <0,1,1,1,0> (Weight = 26,Profit = 51,Generation = 4)
Best Solution: <0,1,1,1,0> (Weight = 26, Profit = 51, Generation = 5)
Best Solution: <0,1,1,1,0> (Weight = 26, Profit = 51, Generation = 6)
Best Solution: <0,1,1,1,0> (Weight = 26,Profit = 51,Generation = 7)
Best Solution: <0,1,1,1,0> (Weight = 26,Profit = 51,Generation = 8)
Best Solution: <0,1,1,1,0> (Weight = 26,Profit = 51,Generation = 9)
Best Solution: <0,1,1,1,0> (Weight = 26, Profit = 51, Generation = 10)
Best Solution: <0,1,1,1,0> (Weight = 26, Profit = 51, Generation = 11)
Best Solution: <0,1,1,1,0> (Weight = 26, Profit = 51, Generation = 12)
Best Solution: <0,1,1,1,0> (Weight = 26, Profit = 51, Generation = 13)
Best Solution: <0,1,1,1,0> (Weight = 26, Profit = 51, Generation = 14)
Best Solution: <0,1,1,1,0> (Weight = 26,Profit = 51,Generation = 15)
Best Solution: <0,1,1,1,0> (Weight = 26,Profit = 51,Generation = 16)
Best Solution: <0,1,1,1,0> (Weight = 26,Profit = 51,Generation = 17)
Best Solution: <0,1,1,1,0> (Weight = 26,Profit = 51,Generation = 18)
Best Solution: <0,1,1,1,0> (Weight = 26, Profit = 51, Generation = 19)
Best Solution: <0,1,1,1,0> (Weight = 26, Profit = 51, Generation = 20)
Best Solution: <0,1,1,1,0> (Weight = 26, Profit = 51, Generation = 21)
An Optimal Packing: <0,1,1,1,0> (Weight = 26,Profit = 51,Generation = 21)
End-up after: 97.00 ticks and 0.00 seconds
```

```
Computing problem number 3 solution...
Best Solution: <1,1,0,0,1,0> (Weight = 190, Profit = 150, Generation = 1)
Best Solution: <1,1,0,0,1,0> (Weight = 190, Profit = 150, Generation = 2)
Best Solution: <1,1,0,0,1,0> (Weight = 190, Profit = 150, Generation = 3)
Best Solution: <1,1,0,0,1,0> (Weight = 190, Profit = 150, Generation = 4)
Best Solution: <1,1,0,0,1,0> (Weight = 190, Profit = 150, Generation = 5)
Best Solution: <1,1,0,0,1,0> (Weight = 190, Profit = 150, Generation = 6)
Best Solution: <1,1,0,0,1,0> (Weight = 190, Profit = 150, Generation = 7)
Best Solution: <1,1,0,0,1,0> (Weight = 190, Profit = 150, Generation = 8)
Best Solution: <1,1,0,0,1,0> (Weight = 190, Profit = 150, Generation = 9)
Best Solution: <1,1,0,0,1,0> (Weight = 190, Profit = 150, Generation = 10)
Best Solution: <1,1,0,0,1,0> (Weight = 190, Profit = 150, Generation = 11)
Best Solution: <1,1,0,0,1,0> (Weight = 190, Profit = 150, Generation = 12)
Best Solution: <1,1,0,0,1,0> (Weight = 190, Profit = 150, Generation = 13)
Best Solution: <1,1,0,0,1,0> (Weight = 190, Profit = 150, Generation = 14)
Best Solution: <1,1,0,0,1,0> (Weight = 190, Profit = 150, Generation = 15)
Best Solution: <1,1,0,0,1,0> (Weight = 190, Profit = 150, Generation = 16)
Best Solution: <1,1,0,0,1,0> (Weight = 190, Profit = 150, Generation = 17)
Best Solution: <1,1,0,0,1,0> (Weight = 190, Profit = 150, Generation = 18)
Best Solution: <1,1,0,0,1,0> (Weight = 190, Profit = 150, Generation = 19)
Best Solution: <1,1,0,0,1,0> (Weight = 190, Profit = 150, Generation = 20)
Best Solution: <1,1,0,0,1,0> (Weight = 190, Profit = 150, Generation = 21)
An Optimal Packing: <1,1,0,0,1,0> (Weight = 190, Profit = 150, Generation = 21)
End-up after: 98.00 ticks and 0.00 seconds
```

:4 פתרון בעיה

```
Computing problem number 4 solution...
Best Solution: <1,0,0,1,0,0,0> (Weight = 50, Profit = 107, Generation = 1)
Best Solution: <1,0,0,1,0,0,0 (Weight = 50, Profit = 107, Generation = 2)
Best Solution: <1,0,0,1,0,0,0> (Weight = 50, Profit = 107, Generation = 3)
Best Solution: <1,0,0,1,0,0,0> (Weight = 50, Profit = 107, Generation = 4)
Best Solution: <1,0,0,1,0,0,0> (Weight = 50, Profit = 107, Generation = 5)
Best Solution: <1,0,0,1,0,0,0> (Weight = 50, Profit = 107, Generation = 6)
Best Solution: <1,0,0,1,0,0,0> (Weight = 50, Profit = 107, Generation = 7)
Best Solution: <1,0,0,1,0,0,0 (Weight = 50, Profit = 107, Generation = 8)
Best Solution: <1,0,0,1,0,0,0 (Weight = 50, Profit = 107, Generation = 9)
Best Solution: <1,0,0,1,0,0,0 (Weight = 50, Profit = 107, Generation = 10)
Best Solution: <1,0,0,1,0,0,0 (Weight = 50, Profit = 107, Generation = 11)
Best Solution: <1,0,0,1,0,0,0 (Weight = 50, Profit = 107, Generation = 12)
Best Solution: <1,0,0,1,0,0,0 (Weight = 50, Profit = 107, Generation = 13)
Best Solution: <1,0,0,1,0,0,0 (Weight = 50, Profit = 107, Generation = 14)
Best Solution: <1,0,0,1,0,0,0 (Weight = 50, Profit = 107, Generation = 15)
Best Solution: <1,0,0,1,0,0,0 (Weight = 50, Profit = 107, Generation = 16)
Best Solution: <1,0,0,1,0,0,0 (Weight = 50, Profit = 107, Generation = 17)
Best Solution: <1,0,0,1,0,0,0 (Weight = 50, Profit = 107, Generation = 18)
Best Solution: <1,0,0,1,0,0,0 (Weight = 50, Profit = 107, Generation = 19)
Best Solution: <1,0,0,1,0,0,0 (Weight = 50, Profit = 107, Generation = 20)
Best Solution: <1,0,0,1,0,0,0> (Weight = 50, Profit = 107, Generation = 21)
An Optimal Packing: <1,0,0,1,0,0,0> (Weight = 50, Profit = 107, Generation = 21)
End-up after: 116.00 ticks and 0.00 seconds
```

```
Computing problem number 5 solution...
Best Solution: <1,0,1,1,1,0,1,1> (Weight = 104, Profit = 900, Generation = 1)
Best Solution: <1,0,1,1,1,0,1,1> (Weight = 104, Profit = 900, Generation = 2)
Best Solution: <1,0,1,1,1,0,1,1> (Weight = 104, Profit = 900, Generation = 3)
Best Solution: <1,0,1,1,1,0,1,1> (Weight = 104, Profit = 900, Generation = 4)
Best Solution: <1,0,1,1,1,0,1,1> (Weight = 104, Profit = 900, Generation = 5)
Best Solution: <1,0,1,1,1,0,1,1> (Weight = 104, Profit = 900, Generation = 6)
Best Solution: <1,0,1,1,1,0,1,1> (Weight = 104, Profit = 900, Generation = 7)
Best Solution: <1,0,1,1,1,0,1,1> (Weight = 104, Profit = 900, Generation = 8)
Best Solution: <1,0,1,1,1,0,1,1> (Weight = 104, Profit = 900, Generation = 9)
Best Solution: <1,0,1,1,1,0,1,1> (Weight = 104, Profit = 900, Generation = 10)
Best Solution: <1,0,1,1,1,0,1,1> (Weight = 104, Profit = 900, Generation = 11)
Best Solution: <1,0,1,1,1,0,1,1> (Weight = 104, Profit = 900, Generation = 12)
Best Solution: <1,0,1,1,1,0,1,1> (Weight = 104, Profit = 900, Generation = 13)
Best Solution: <1,0,1,1,1,0,1,1> (Weight = 104, Profit = 900, Generation = 14)
Best Solution: <1,0,1,1,1,0,1,1> (Weight = 104, Profit = 900, Generation = 15)
Best Solution: <1,0,1,1,1,0,1,1> (Weight = 104, Profit = 900, Generation = 16)
Best Solution: <1,0,1,1,1,0,1,1> (Weight = 104, Profit = 900, Generation = 17)
Best Solution: <1,0,1,1,1,0,1,1> (Weight = 104, Profit = 900, Generation = 18)
Best Solution: <1,0,1,1,1,0,1,1> (Weight = 104, Profit = 900, Generation = 19)
Best Solution: <1,0,1,1,1,0,1,1> (Weight = 104, Profit = 900, Generation = 20)
Best Solution: <1,0,1,1,1,0,1,1> (Weight = 104, Profit = 900, Generation = 21)
An Optimal Packing: <1,0,1,1,1,0,1,1> (Weight = 104, Profit = 900, Generation = 21)
End-up after: 109.00 ticks and 1.00 seconds
```

<u>פתרון בעיה 6:</u>

```
Computing problem number 6 solution...
Best Solution: <0,1,0,1,0,0,1> (Weight = 169, Profit = 1735, Generation = 1)
Best Solution: <0,1,0,1,0,0,1> (Weight = 169, Profit = 1735, Generation = 2)
Best Solution: <0,1,0,1,0,0,1> (Weight = 169, Profit = 1735, Generation = 3)
Best Solution: <0,1,0,1,0,0,1> (Weight = 169, Profit = 1735, Generation = 4)
Best Solution: <0,1,0,1,0,0,1> (Weight = 169, Profit = 1735, Generation = 5)
Best Solution: <0,1,0,1,0,0,1> (Weight = 169, Profit = 1735, Generation = 6)
Best Solution: <0,1,0,1,0,0,1> (Weight = 169, Profit = 1735, Generation = 7)
Best Solution: <0,1,0,1,0,0,1> (Weight = 169, Profit = 1735, Generation = 8)
Best Solution: <0,1,0,1,0,0,1> (Weight = 169, Profit = 1735, Generation = 9)
Best Solution: <0,1,0,1,0,0,1> (Weight = 169, Profit = 1735, Generation = 10)
Best Solution: <0,1,0,1,0,0,1> (Weight = 169, Profit = 1735, Generation = 11)
Best Solution: <0,1,0,1,0,0,1> (Weight = 169, Profit = 1735, Generation = 12)
Best Solution: <0,1,0,1,0,0,1> (Weight = 169, Profit = 1735, Generation = 13)
Best Solution: <0,1,0,1,0,0,1> (Weight = 169, Profit = 1735, Generation = 14)
Best Solution: <0,1,0,1,0,0,1> (Weight = 169, Profit = 1735, Generation = 15)
Best Solution: <0,1,0,1,0,0,1> (Weight = 169, Profit = 1735, Generation = 16)
Best Solution: <0,1,0,1,0,0,1> (Weight = 169, Profit = 1735, Generation = 17)
Best Solution: <0,1,0,1,0,0,1> (Weight = 169, Profit = 1735, Generation = 18)
Best Solution: <0,1,0,1,0,0,1> (Weight = 169, Profit = 1735, Generation = 19)
Best Solution: <0,1,0,1,0,0,1> (Weight = 169,Profit = 1735,Generation = 20)
Best Solution: <0,1,0,1,0,0,1> (Weight = 169, Profit = 1735, Generation = 21)
An Optimal Packing: <0,1,0,1,0,0,1> (Weight = 169,Profit = 1735,Generation = 21)
End-up after: 109.00 ticks and 1.00 seconds
```

```
Computing problem number 7 solution...

Best Solution: <1,1,0,0,0,1,1,1,1,0,0,0,0,1,1> (Weight = 750, Profit = 1455, Generation = 1)

Best Solution: <1,1,0,0,0,1,1,1,1,0,0,0,0,1,1> (Weight = 750, Profit = 1455, Generation = 2)

Best Solution: <1,1,0,0,0,1,1,1,1,0,0,0,0,1,1> (Weight = 750, Profit = 1455, Generation = 3)

Best Solution: <0,1,1,1,0,0,1,1,1,0,0,0,0,1,1> (Weight = 750, Profit = 1456, Generation = 4)

Best Solution: <0,1,1,1,0,0,1,1,1,0,0,0,0,1,1> (Weight = 750, Profit = 1456, Generation = 5)

Best Solution: <0,1,1,1,0,0,1,1,1,0,0,0,0,1,1> (Weight = 750, Profit = 1456, Generation = 5)

Best Solution: <1,0,1,0,1,0,1,1,1,0,0,0,0,1,1> (Weight = 749, Profit = 1458, Generation = 6)

Best Solution: <1,0,1,0,1,0,1,1,1,0,0,0,0,1,1> (Weight = 749, Profit = 1458, Generation = 7)

Best Solution: <1,0,1,0,1,0,1,1,1,0,0,0,0,1,1> (Weight = 749, Profit = 1458, Generation = 8)

Best Solution: <1,0,1,0,1,0,1,1,1,0,0,0,0,1,1> (Weight = 749, Profit = 1458, Generation = 9)

Best Solution: <1,0,1,0,1,0,1,1,1,0,0,0,0,1,1> (Weight = 749, Profit = 1458, Generation = 10)

Best Solution: <1,0,1,0,1,0,1,1,1,0,0,0,0,1,1> (Weight = 749, Profit = 1458, Generation = 11)

Best Solution: <1,0,1,0,1,0,1,1,1,0,0,0,0,1,1> (Weight = 749, Profit = 1458, Generation = 12)

Best Solution: <1,0,1,0,1,0,1,1,1,0,0,0,0,1,1> (Weight = 749, Profit = 1458, Generation = 13)

Best Solution: <1,0,1,0,1,0,1,1,1,0,0,0,0,1,1> (Weight = 749, Profit = 1458, Generation = 13)

Best Solution: <1,0,1,0,1,1,1,0,0,0,0,1,1> (Weight = 749, Profit = 1458, Generation = 15)

Best Solution: <1,0,1,0,1,1,1,0,0,0,0,1,1> (Weight = 749, Profit = 1458, Generation = 16)

Best Solution: <1,0,1,0,1,1,1,0,0,0,0,1,1> (Weight = 749, Profit = 1458, Generation = 17)

Best Solution: <1,0,1,0,1,0,1,1,1,0,0,0,0,1,1> (Weight = 749, Profit = 1458, Generation = 17)

Best Solution: <1,0,1,0,1,1,1,0,0,0,0,1,1> (Weight = 749, Profit = 1458, Generation = 17)

Best Solution: <1,0,1,0,1,1,1,0,0,0,0,1,1> (Weight = 749, Profit = 1458, Generation = 20)

Best Solution: <1,0,1,0,1,1,1,0,0,0,0,1,1
```

פתרון בעיה 8:

• כפי שניתן לראות הנ"ל הבעיות נפתרו מאוד מהר הן כפרמטר של מספר דורות עד להתכנסות והן כפרמטר של זמן.

תודה רבה על זמן הקריאה