# Proyecto 2 – Mas Pizza

## **DESCRIPCIÓN DEL PROBLEMA**



Mas Pizza (o More Pizza) es un problema utilizado en una competición de Hash Code organizado por Google. Esta organizado en un centro Hash Code y se quiere pedir una pizza para los participantes. Afortunadamente hay una pizzería cercana. Existen diferentes tipos de pizza pero solo se puede pedir como máximo una pizza de cada tipo. Cada pizza tiene un tamaño especifico siendo el tamaño el numero de porciones de una pizza. Para calcular el máximo numero de porciones que podemos pedir tendremos en cuenta el numero de participantes registrados. Para reducir el desperdicio de alimentos, el objetivo es pedir la mayor cantidad de porciones de pizza como sea posible pero no mas que el numero máximo. El objetivo solicitar pizzas de diferentes siendo el numero total de porciones menor o igual al numero de participantes. El problema tiene 2 datos de entrada:

- Porciones de pizza: La cantidad de porciones de pizza necesarias.
- Pizzas: Un vector con las porciones para cada pizza.

#### Ejemplo:

- Porciones necesarias: 17
- **Pizzas** = c (2.5.6.8)

**Una posible solución:** Comprar 1 pizza de tipo 1 (2 porciones), 1 pizza tipo 3 (3 porciones) y pizza tipo 4 (8 porciones). El total seria 16 porciones y nos quedamos una por debajo del valor máximo. El algoritmo nos debería devolver (elegir entre las dos opciones):

- Los índices de las pizzas que debo comprar
- El tamaño en secuencia

Nuestra tarea consistirá en implementar los algoritmos:

- Random Restart Hill Climbling
- Local beam search

Una vez implementados analizaremos los resultados

### **ANALISIS DE LOS RESULTADOS**

### Random restart Hill climbing

#### **Small**

|   | r                                | name           | cost | runtime   | iterations | max_depth |
|---|----------------------------------|----------------|------|-----------|------------|-----------|
| 1 | Random Restart Hill Climbing -   | <pre>It:</pre> | 101  | 2.26 secs | 8          | 3         |
| 2 | Random Restart Hill Climbing -   | <pre>It:</pre> | 100  | 0.02 secs | 5          | 2         |
| 3 | Random Restart Hill Climbing -   | <pre>It:</pre> | 100  | 0.01 secs | 1          | 3         |
| 4 | Random Restart Hill Climbing -   | <pre>It:</pre> | 100  | 0.01 secs | 1          | 4         |
| 5 | Random Restart Hill Climbing -   | <pre>It:</pre> | 99   | 1.12 secs | 8          | 4         |
| 6 | Random Restart Hill Climbing -   | <pre>It:</pre> | 99   | 1.11 secs | 8          | 3         |
| 7 | Random Restart Hill Climbing -   | <pre>It:</pre> | 100  | 0.01 secs | 2          | 4         |
| 8 | Random Restart Hill Climbing -   | <pre>It:</pre> | 99   | 2.19 secs | 8          | 4         |
| 9 | Random Restart Hill Climbing -   | <pre>It:</pre> | 100  | 0.02 secs | 5          | 3         |
| 1 | 0 Random Restart Hill Climbing - | It:            | 100  | 0.00 secs | 1          | 3         |

#### Medium

```
name cost runtime iterations max_depth
1 Random Restart Hill Climbing - It: 4500 0.35 secs
                                                          7
                                                                    23
2 Random Restart Hill Climbing - It: 4501 0.44 secs
                                                           8
                                                                    22
3 Random Restart Hill Climbing - It: 4501 0.41 secs
                                                          8
                                                                    20
4 Random Restart Hill Climbing - It: 4501 0.42 secs
                                                           8
                                                                    19
5 Random Restart Hill Climbing - It: 4500 0.22 secs
                                                           4
                                                                    21
6 Random Restart Hill Climbing - It: 4500 0.19 secs
                                                           4
                                                                    15
7 Random Restart Hill Climbing - It: 4500 0.35 secs
                                                           7
                                                                    16
8 Random Restart Hill Climbing - It: 4500 0.15 secs
                                                           3
                                                                    20
9 Random Restart Hill Climbing - It: 4500 0.14 secs
                                                           3
                                                                    19
10 Random Restart Hill Climbing - It: 4501 0.42 secs
                                                           8
                                                                    18
```

# Local beam search

## K= 3

#### small

|    | _     |              | nama   | cost | rur  | n+i ma    | iterations      | may denth |
|----|-------|--------------|--------|------|------|-----------|-----------------|-----------|
|    |       |              | Hulle  | CUST | i ui | I C LIIIC | r cei a c roiis | mux_ueptn |
| 1  | Local | Beam         | Search | 115  | 0.06 | secs      | 100             | 2         |
| 2  | Local | ${\tt Beam}$ | Search | 109  | 0.05 | secs      | 100             | 2         |
| 3  | Local | Beam         | Search | 125  | 0.06 | secs      | 100             | 2         |
| 4  | Local | Beam         | Search | 108  | 0.05 | secs      | 100             | 2         |
| 5  | Local | Beam         | Search | 105  | 0.06 | secs      | 100             | 2         |
| 6  | Local | Beam         | Search | 97   | 0.05 | secs      | 100             | 2         |
| 7  | Local | Beam         | Search | 126  | 0.06 | secs      | 100             | 2         |
| 8  | Local | Beam         | Search | 117  | 0.05 | secs      | 100             | 2         |
| 9  | Local | Beam         | Search | 125  | 0.06 | secs      | 100             | 2         |
| 10 | Local | Beam         | Search | 99   | 0.05 | secs      | 100             | 2         |

### Medium

| name       cost       runtime       iterations       max_depth         1       Local       Beam       Search       2690       0.05       secs       100       2         2       Local       Beam       Search       2908       0.07       secs       100       2         3       Local       Beam       Search       3173       0.06       secs       100       2         4       Local       Beam       Search       2606       0.06       secs       100       2         5       Local       Beam       Search       2757       0.06       secs       100       2         6       Local       Beam       Search       3380       0.06       secs       100       2         7       Local       Beam       Search       2767       0.06       secs       100       2         8       Local       Beam       Search       3241       0.07       secs       100       2         9       Local       Beam       Search       3070       0.06       secs       100       2 | _  | -     |      |        |      |      |       |            |      |        |
|---|----|-------|------|--------|------|------|-------|------------|------|--------|
| 2 Local Beam Search 2908 0.07 secs       100       2         3 Local Beam Search 3173 0.06 secs       100       2         4 Local Beam Search 2606 0.06 secs       100       2         5 Local Beam Search 2757 0.06 secs       100       2         6 Local Beam Search 3380 0.06 secs       100       2         7 Local Beam Search 3189 0.06 secs       100       2         8 Local Beam Search 2767 0.06 secs       100       2         9 Local Beam Search 3241 0.07 secs       100       2   |    |       |      | name   | cost | rur  | ntime | iterations | max_ | _depth |
| 3       Local Beam Search 3173 0.06 secs       100       2         4       Local Beam Search 2606 0.06 secs       100       2         5       Local Beam Search 2757 0.06 secs       100       2         6       Local Beam Search 3380 0.06 secs       100       2         7       Local Beam Search 3189 0.06 secs       100       2         8       Local Beam Search 2767 0.06 secs       100       2         9       Local Beam Search 3241 0.07 secs       100       2  | 1  | Local | Beam | Search | 2690 | 0.05 | secs  | 100        |      | 2      |
| 4       Local Beam Search 2606 0.06 secs       100       2         5       Local Beam Search 2757 0.06 secs       100       2         6       Local Beam Search 3380 0.06 secs       100       2         7       Local Beam Search 3189 0.06 secs       100       2         8       Local Beam Search 2767 0.06 secs       100       2         9       Local Beam Search 3241 0.07 secs       100       2   | 2  | Local | Beam | Search | 2908 | 0.07 | secs  | 100        |      | 2      |
| 5       Local Beam Search 2757 0.06 secs       100       2         6       Local Beam Search 3380 0.06 secs       100       2         7       Local Beam Search 3189 0.06 secs       100       2         8       Local Beam Search 2767 0.06 secs       100       2         9       Local Beam Search 3241 0.07 secs       100       2  | 3  | Local | Beam | Search | 3173 | 0.06 | secs  | 100        |      | 2      |
| 6       Local Beam Search 3380 0.06 secs       100       2         7       Local Beam Search 3189 0.06 secs       100       2         8       Local Beam Search 2767 0.06 secs       100       2         9       Local Beam Search 3241 0.07 secs       100       2   | 4  | Local | Beam | Search | 2606 | 0.06 | secs  | 100        |      | 2      |
| 7 Local Beam Search 3189 0.06 secs 100 2<br>8 Local Beam Search 2767 0.06 secs 100 2<br>9 Local Beam Search 3241 0.07 secs 100 2  | 5  | Local | Beam | Search | 2757 | 0.06 | secs  | 100        |      | 2      |
| 8 Local Beam Search 2767 0.06 secs 100 2 9 Local Beam Search 3241 0.07 secs 100 2   | 6  | Local | Beam | Search | 3380 | 0.06 | secs  | 100        |      | 2      |
| 9 Local Beam Search 3241 0.07 secs 100 2  | 7  | Local | Beam | Search | 3189 | 0.06 | secs  | 100        |      | 2      |
|   | 8  | Local | Beam | Search | 2767 | 0.06 | secs  | 100        |      | 2      |
| 10 Local Beam Search 3070 0.06 secs 100 2   | 9  | Local | Beam | Search | 3241 | 0.07 | secs  | 100        |      | 2      |
|   | 10 | Local | Beam | Search | 3070 | 0.06 | secs  | 100        |      | 2      |

## K= 5

### Small

| _ | _       |      |        |      |      |       |            |      |        |
|---|---------|------|--------|------|------|-------|------------|------|--------|
|   |         |      | name   | cost | rur  | ntime | iterations | max_ | _depth |
| 1 | Local   | Beam | Search | 97   | 0.06 | secs  | 100        |      | 2      |
| 2 | Local   | Beam | Search | 84   | 0.06 | secs  | 100        |      | 2      |
| 3 | Local   | Beam | Search | 101  | 0.05 | secs  | 100        |      | 2      |
| 4 | Local   | Beam | Search | 100  | 0.01 | secs  | 2          |      | 2      |
| 5 | Local   | Beam | Search | 110  | 0.06 | secs  | 100        |      | 2      |
| 6 | Local   | Beam | Search | 84   | 0.05 | secs  | 100        |      | 2      |
| 7 | Local   | Beam | Search | 101  | 0.06 | secs  | 100        |      | 2      |
| 8 | Local   | Beam | Search | 98   | 0.05 | secs  | 100        |      | 2      |
| 9 | Local   | Beam | Search | 100  | 0.00 | secs  | 2          |      | 2      |
| 1 | 0 Local | Beam | Search | 98   | 0.05 | secs  | 100        |      | 2      |
| _ |         |      |        |      |      |       |            |      |        |

### YERAY BELLANCO CASARES

### Medium

| _  | _     |      |        |      |      |       |            |           |
|----|-------|------|--------|------|------|-------|------------|-----------|
|    |       |      | name   | cost | rur  | ntime | iterations | max_depth |
| 1  | Local | Beam | Search | 3057 | 0.07 | secs  | 100        | 2         |
| 2  | Local | Beam | Search | 3260 | 0.06 | secs  | 100        | 2         |
| 3  | Local | Beam | Search | 2942 | 0.07 | secs  | 100        | 2         |
| 4  | Local | Beam | Search | 3033 | 0.07 | secs  | 100        | 2         |
| 5  | Local | Beam | Search | 3212 | 0.06 | secs  | 100        | 2         |
| 6  | Local | Beam | Search | 2877 | 0.07 | secs  | 100        | 2         |
| 7  | Local | Beam | Search | 3136 | 0.06 | secs  | 100        | 2         |
| 8  | Local | Beam | Search | 2775 | 0.07 | secs  | 100        | 2         |
| 9  | Local | Beam | Search | 2808 | 0.07 | secs  | 100        | 2         |
| 10 | Local | Beam | Search | 3474 | 0.06 | secs  | 100        | 2         |

# K=10

### Small

|    |       |      | name   | cost | rur  | ntime | iterations | max_depth |
|----|-------|------|--------|------|------|-------|------------|-----------|
| 1  | Local | Beam | Search | 97   | 0.07 | secs  | 100        | 2         |
| 2  | Local | Beam | Search | 101  | 0.06 | secs  | 100        | 2         |
| 3  | Local | Beam | Search | 100  | 0.02 | secs  | 2          | 2         |
| 4  | Local | Beam | Search | 100  | 0.01 | secs  | 2          | 2         |
| 5  | Local | Beam | Search | 115  | 0.06 | secs  | 100        | 2         |
| 6  | Local | Beam | Search | 101  | 0.07 | secs  | 100        | 2         |
| 7  | Local | Beam | Search | 97   | 0.07 | secs  | 100        | 2         |
| 8  | Local | Beam | Search | 104  | 0.06 | secs  | 100        | 2         |
| 9  | Local | Beam | Search | 100  | 0.01 | secs  | 2          | 2         |
| 10 | Local | Beam | Search | 98   | 0.07 | secs  | 100        | 2         |

### Medium

|    |       |      | name   | cost | rui  | ntime | iterations | max_depth |
|----|-------|------|--------|------|------|-------|------------|-----------|
| 1  | Local | Beam | Search | 3599 | 0.07 | secs  | 100        | 2         |
| 2  | Local | Beam | Search | 2940 | 0.07 | secs  | 100        | 2         |
| 3  | Local | Beam | Search | 2926 | 0.08 | secs  | 100        | 2         |
| 4  | Local | Beam | Search | 3042 | 0.08 | secs  | 100        | 2         |
| 5  | Local | Beam | Search | 3183 | 0.07 | secs  | 100        | 2         |
| 6  | Local | Beam | Search | 3324 | 0.07 | secs  | 100        | 2         |
| 7  | Local | Beam | Search | 2997 | 0.08 | secs  | 100        | 2         |
| 8  | Local | Beam | Search | 3036 | 0.08 | secs  | 100        | 2         |
| 9  | Local | Beam | Search | 3101 | 0.07 | secs  | 100        | 2         |
| 10 | Local | Beam | Search | 2943 | 0.07 | secs  | 100        | 2         |

# **COMPARACIÓN DE RESULTADOS**

|                   | RANDOM RESTAR | T HILL CLIMBING |            |           |
|-------------------|---------------|-----------------|------------|-----------|
|                   | Cost          | Runtime         | Iterations | Max-depth |
| Tipo : Small      | -             | -               | -          | -         |
| Media             | 99,8          | 0,675           | 4,7        | 3,3       |
| Desviación tipica | 0,6           | 0,885           | 3,03       | 0,64      |
|                   |               |                 |            |           |
| Tipo : Medium     | -             | -               | -          | -         |
| Media             | 4500,4        | 0,3             | 6          | 19,3      |
| Desviación tipica | 0,489         | 0,114           | 2,09       | 2,36      |
|                   |               |                 |            |           |
|                   | LOCAL BEA     | M SEARCH        |            | •         |
| K = 3             | -             | -               | -          | -         |
| Tipo : Small      | -             | -               | -          | -         |
| Media             | 112,6         | 0,055           | 100        | 2         |
| Desviación tipica | 10,16         | 0               | 0          | 0         |
|                   |               |                 |            |           |
| K = 3             | -             | -               | -          | -         |
| Tipo : Medium     | -             | -               | -          | -         |
| Media             | 2978,1        | 0,061           | 100        | 2         |
| Desviación tipica | 266,9525343   | 0,005676462122  | 0          | 0         |
|                   |               |                 |            |           |
| K = 5             | -             | -               | -          | -         |
| Tipo : Small      | -             | -               | -          | -         |
| Media             | 97,3          | 0,045           | 100        | 2         |
| Desviación tipica | 7,874713399   | 0,02173067468   | 0          | 0         |
|                   |               |                 |            |           |
| K = 5             | -             | -               | -          | -         |
| Tipo : Medium     | -             | -               | -          | -         |
| Media             | 3057,4        | 0,066           | 100        | 2         |
| Desviación tipica | 219,3648407   | 0,005163977795  | 0          | 0         |
|                   |               |                 |            |           |
| K = 10            | -             | -               | -          | -         |
| Tipo : Small      | -             | -               | -          | -         |
| Media             | 101,3         | 0,045           | 100        | 2         |
| Desviación tipica | 5,25039681    | 0,02838231061   | 0          | 0         |
|                   |               |                 |            |           |
| K = 10            | -             | -               | -          | -         |
| Tipo : Medium     | -             | -               | -          | -         |
| Media             | 3109,1        | 0,074           | 100        | 2         |
| Desviación tipica | 211,8261604   | 0,005163977795  | 0          | 0         |

### **CONCLUSIONES**

Como podemos observar en la tabla de arriba, el tiempo de ejecución de el algoritmo Local beam search frente al random restart hill climbing es menor, ya que es un algoritmo mas probable en encontrar una mejor solución.

El algoritmo beam search trabaja con k estados actuales y simula un avance en paralelo con k estados actuales.

Mientras que en el random restart hill climbing, cada proceso de búsqueda se ejecuta independientemente de los demás, en el local beam search se abandona rápidamente aquellas búsquedas que no llevan a ninguna parte y se enfoca en los caminos donde habrá un mayor progreso.