

# Adrián\_Pérez\_Portero\_AG3

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## 1 AG3 - Actividad Guiada 3

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[https://github.com/adrianperezp/Alg\\_Opt/tree/master/Actividades%20Guiadas/AG3](https://github.com/adrianperezp/Alg_Opt/tree/master/Actividades%20Guiadas/AG3)

<https://colab.research.google.com/drive/103rdOSwFpMk9phlIILBie7fhATjmW07-?usp=sharing>

```
[ ]: !pip install requests
      !pip install tsplib95
```

Requirement already satisfied: requests in /usr/local/lib/python3.10/dist-packages (2.31.0)

Requirement already satisfied: charset-normalizer<4,>=2 in

/usr/local/lib/python3.10/dist-packages (from requests) (3.3.2)

Requirement already satisfied: idna<4,>=2.5 in /usr/local/lib/python3.10/dist-packages (from requests) (3.6)

Requirement already satisfied: urllib3<3,>=1.21.1 in

/usr/local/lib/python3.10/dist-packages (from requests) (2.0.7)

Requirement already satisfied: certifi>=2017.4.17 in

/usr/local/lib/python3.10/dist-packages (from requests) (2023.11.17)

Collecting tsplib95

Downloading tsplib95-0.7.1-py2.py3-none-any.whl (25 kB)

Requirement already satisfied: Click>=6.0 in /usr/local/lib/python3.10/dist-packages (from tsplib95) (8.1.7)

Collecting Deprecated~=1.2.9 (from tsplib95)

Downloading Deprecated-1.2.14-py2.py3-none-any.whl (9.6 kB)

Collecting networkx~=2.1 (from tsplib95)

Downloading networkx-2.8.8-py3-none-any.whl (2.0 MB)

2.0/2.0 MB

36.7 MB/s eta 0:00:00

Collecting tabulate~=0.8.7 (from tsplib95)

Downloading tabulate-0.8.10-py3-none-any.whl (29 kB)

Requirement already satisfied: wrapt<2,>=1.10 in /usr/local/lib/python3.10/dist-packages (from Deprecated~=1.2.9->tsplib95) (1.14.1)

Installing collected packages: tabulate, networkx, Deprecated, tsplib95

Attempting uninstall: tabulate

Found existing installation: tabulate 0.9.0

Uninstalling tabulate-0.9.0:

```

    Successfully uninstalled tabulate-0.9.0
Attempting uninstall: networkx
    Found existing installation: networkx 3.2.1
    Uninstalling networkx-3.2.1:
        Successfully uninstalled networkx-3.2.1
ERROR: pip's dependency resolver does not currently take into account all
the packages that are installed. This behaviour is the source of the following
dependency conflicts.

lida 0.0.10 requires fastapi, which is not installed.
lida 0.0.10 requires kaleido, which is not installed.
lida 0.0.10 requires python-multipart, which is not installed.
lida 0.0.10 requires uvicorn, which is not installed.
bigframes 0.19.2 requires tabulate>=0.9, but you have tabulate 0.8.10 which is
incompatible.

Successfully installed Deprecated-1.2.14 networkx-2.8.8 tabulate-0.8.10
tsplib95-0.7.1

```

## 2 Carga de los datos del problema

```

[ ]: import urllib.request      #Hacer llamadas http a paginas de la red
import tsplib95                 #Modulo para las instancias del problema del TSP
import math                     #Modulo de funciones matematicas. Se usa para exp
import random                   #Para generar valores aleatorios

#http://elib.zib.de/pub/mp-testdata/tsp/tsplib/
#Documentacion :
# http://comopt.ifl.uni-heidelberg.de/software/TSPLIB95/tsp95.pdf
# https://tsplib95.readthedocs.io/en/stable/pages/usage.html
# https://tsplib95.readthedocs.io/en/v0.6.1/modules.html
# https://pypi.org/project/tsplib95/

#Descargamos el fichero de datos (Matriz de distancias)
file = "swiss42.tsp";
urllib.request.urlretrieve("http://comopt.ifl.uni-heidelberg.de/software/
↳TSPLIB95/tsp/swiss42.tsp.gz", file + '.gz')
!gzip -d swiss42.tsp.gz      #Descomprimir el fichero de datos

#Coordenadas 51-city problem (Christofides/Eilon)
#file = "eil51.tsp"; urllib.request.urlretrieve ("http://comopt.ifl.
↳uni-heidelberg.de/software/TSPLIB95/tsp//eil51.tsp.gz", file) 48 capitals of
↳the US (Padberg/Rinaldi)
#Coordenadas

```

```
#file - "att48.tsp"; urllib.request.urlretrieve ("http://comopt.ifi.
uni-heidelberg.de/software/TSPLIB95/tsp//att48.tsp.gz",
```

```
[ ]: # Carga de datos y generación de objeto problem
#####
problem = tsplib95.load(file)

#Nodos
Nodos = list(problem.get_nodes())
#Aristas
Aristas = list(problem.get_edges())

print(Nodos)
print(Aristas)
```

```
[0, 1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12, 13, 14, 15, 16, 17, 18, 19, 20, 21,
22, 23, 24, 25, 26, 27, 28, 29, 30, 31, 32, 33, 34, 35, 36, 37, 38, 39, 40, 41]
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[illegible]

[illegible]

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[ ]: *#Probamos algunas funciones del objeto problem*

*#Distancia entre nodos*

`problem.get_weight(0, 1)`

*#Todas las funciones*

*#Documentación: <https://tsplib95.readthedocs.io/en/v0.6.1/modules.html>*

*#dir (problem)*

[ ]: 15

### 3 Funciones básicas

```
[ ]: # Se genera una solución aleatoria con comienzo en el nodo 0
def crear_solucion(Nodos):
    solucion = [Nodos[0]]
    for n in Nodos[1:]:
        solucion = solucion + [random.choice(list(set(Nodos) - set({Nodos[0]}) -
↪set(solucion)))]
    return solucion

# Devuelve la distancia entre dos nodos
def distancia(a, b, problem):
    return problem.get_weight(a, b)

# Devuelve la distancia total de una trayectoria / solución
def distancia_total(solucion, problem):
    distancia_total = 0
    for i in range(len(solucion) - 1):
        distancia_total += distancia(solucion[i], solucion[i + 1], problem)
    return distancia_total + distancia(solucion[len(solucion) - 1], solucion[0],
↪problem)
```

[ ]: 4396

```
[ ]: # Ponemos a prueba el algoritmo
sol_temporal = crear_solucion(Nodos)

distancia_total(sol_temporal, problem)
```

[ ]: 4945

```
[ ]: def busqueda_aleatoria(problem, N):
    # N es el número de iteraciones
    Nodos = list(problem.get_nodos())

    mejor_solucion = []

    mejor_distancia = float('inf')

    for i in range(N):
        solucion = crear_solucion(Nodos)
        distancia = distancia_total(solucion, problem)

        if distancia < mejor_distancia:
```



```

    mejor_solucion = solucion
    mejor_distancia = distancia

    print("Mejor solución: ", mejor_solucion)
    print("Distancia: " , mejor_distancia)
    return mejor_solucion

# Búsqueda aleatoria con muchas iteraciones
solucion = busqueda_aleatoria(problem, 10000)

```

Mejor solución: [0, 15, 3, 10, 27, 1, 38, 22, 11, 32, 14, 37, 20, 17, 41, 24, 40, 9, 23, 21, 18, 8, 13, 34, 33, 36, 16, 26, 6, 30, 31, 35, 39, 28, 25, 29, 5, 12, 2, 19, 4, 7]  
 Distancia: 3773

## 4 BÚSQUEDA LOCAL

```

[ ]: def genera_vecina(solucion):
    # Generador de soluciones vecinas: 2-opt (intercambiar 2 nodos) Si hay N
    ↪ nodos se generan (N-1)x(N-2)/2 soluciones
    #print(solucion)
    mejor_solucion = []
    mejor_distancia = 10e100
    for i in range(1, len(solucion) - 1):
        for j in range(i + 1, len(solucion)):

            # Se genera una nueva solución intercambiando los dos nodos i, j:
            # (Usamos el operador + que para listas en python las concatena): ej.: [1,
            ↪ 2] + [3] = [1, 2, 3]
            vecina = solucion[:i] + [solucion[j]] + solucion[i + 1 : j] +
            ↪ [solucion[i]] + solucion[j + 1:]

            # Se evalua la nueva solución
            distancia_vecina = distancia_total(vecina, problem)

            # ... para guardarla si mejora las anteriores
            if distancia_vecina <= mejor_distancia:
                mejor_distancia = distancia_vecina
                mejor_solucion = vecina
    return mejor_solucion

```

```

[ ]: print("Distancia Solucion Inicial: ", distancia_total(solucion, problem))

nueva_solucion = genera_vecina(solucion)
print("Distancia Solucion Local: ", distancia_total(nueva_solucion, problem))

```

Distancia Solucion Inicial: 3773

Distancia Solucion Local: 3521

```
[ ]: # Búsqueda Local:
# - Sobre el operador de vecindad 2-opt (funcion genera_vecina)
# - Sin criterio de parada, se para cuando no es posible mejorar.
def busqueda_local(problem):
    mejor_solucion = []

    # Generar una solucion inicial de referencia (aleatoria)
    solucion_referencia = crear_solucion(Nodos)
    mejor_distancia = distancia_total(solucion_referencia, problem)

    iteracion = 0      # Un contador para saber las iteraciones que hacemos
    while(1):
        iteracion += 1  # Incrementamos el contador

        # Obtenemos la mejor vecina...
        vecina = genera_vecina(solucion_referencia)

        # ... y la evaluamos para ver si mejoramos respecto a lo encontrado hasta
        ↪ el momento
        distancia_vecina = distancia_total(vecina, problem)

        # Si no mejoramos hay que terminar. Hemos llegado a un mínimo local (según
        ↪ nuestro operador de vecindad 2-opt)
        if distancia_vecina < mejor_distancia:
            mejor_solucion = vecina
            mejor_distancia = distancia_vecina
        else:
            print("En la iteración ", iteracion, ", la mejor solución encontrada es:
            ↪", mejor_solucion)
            print("Distancia: ", mejor_distancia)
            return mejor_solucion

        solucion_referencia = vecina

sol = busqueda_local(problem)
```

En la iteración 37 , la mejor solución encontrada es: [0, 27, 3, 4, 6, 1, 7, 31, 17, 37, 15, 16, 14, 19, 13, 12, 18, 26, 5, 30, 38, 22, 29, 8, 41, 23, 40, 24, 21, 39, 9, 10, 25, 11, 2, 28, 32, 34, 33, 20, 35, 36]  
Distancia: 1657

```
[ ]:
```

```
[ ]: # Generador de 1 solucion vecina 2-opt aleatoria (intercambiar 2 nodos)
def genera_vecina_aleatorio(solucion):
```

```

# Se elegien dos nodos aleatoriamente
i, j = sorted(random.sample(range(1, len(solucion)), 2))

# Devuelve una nueva solución pero intercambiando los dos nodos elegidos al
↪azar
return solucion[:i] + [solucion[j]] + solucion[i + 1:j] + [solucion[i]] +
↪solucion[j + 1:]

#genera_vecina_aleatorio(solucion)

```

```

[ ]: [0,
      15,
      3,
      10,
      27,
      1,
      38,
      22,
      11,
      32,
      14,
      37,
      20,
      17,
      41,
      24,
      40,
      9,
      23,
      21,
      13,
      8,
      18,
      34,
      33,
      36,
      16,
      26,
      6,
      30,
      31,
      35,
      39,
      28,
      25,
      29,

```

```
5,  
12,  
2,  
19,  
4,  
7]
```

```
[ ]: # Funcion de probabilidad para aceptar peores soluciones  
def probabilidad(T, d):  
    if random.random() < math.exp(-1 * d / T):  
        return True  
    else:  
        return False  
  
# Funcion de descenso de temperatura  
def bajar_temperatura(T):  
    return T * 0.99
```

```
[ ]: def recocido_simulado(problem, TEMPERATURA):  
    #problem = datos del problema  
    # T = Temperatura  
  
    solucion_referencia = crear_solucion(Nodos)  
    distancia_referencia = distancia_total(solucion_referencia, problem)  
  
    mejor_solucion = []  
    mejor_distancia = 10e100  
  
    N = 0  
    while TEMPERATURA > .0001:  
        N += 1  
        # Genera una solución vecina  
        vecina = genera_vecina_aleatorio(solucion_referencia)  
  
        # Calcula su valor (distancia)  
        distancia_vecina = distancia_total(vecina, problem)  
  
        # Si es la mejor solución de todas se guarda(siempre!!!)  
        if distancia_vecina < mejor_distancia:  
            mejor_solucion = vecina  
            mejor_distancia = distancia_vecina  
  
        # Bajamos la temperatura  
        TEMPERATURA = bajar_temperatura(TEMPERATURA)  
  
    print("La mejor solución encontrada es ", end="")  
    print(mejor_solucion)
```

```
print(" con una distancia total de ", end="")
print(mejor_distancia)
return mejor_solucion
```

```
sol = recocido_simulado(problem, 1000000)
```

La mejor solución encontrada es [0, 22, 40, 8, 25, 18, 20, 38, 4, 1, 33, 37, 12, 19, 2, 26, 9, 41, 17, 28, 14, 5, 23, 30, 39, 10, 35, 31, 11, 24, 27, 13, 16, 15, 32, 21, 29, 7, 6, 36, 34, 3]  
con una distancia total de 4349