5-CAT-Optimitzaci?_paral?lelisme_i_concurrencia

May 6, 2020

| 1 | Programació pe | Programació per a la ciència de dades | | |
|-----|-------------------|--|--------|--|
| 1.1 | Unitat 5: Optimit | zació de codi: programació concurrent i para | lůlela | |

1.1.1 Instruccions d'ús

Aquest document és un notebook interactiu que intercala explicacions més aviat teòriques de conceptes de programació amb fragments de codi executables. Per aprofitar els avantatges que aporta aquest format, us recomanem que, en primer lloc, llegiu les explicacions i el codi que us proporcionem. D'aquesta manera tindreu un primer contacte amb els conceptes que hi exposem. Ara bé, la lectura és només el principi! Una vegada hagueu llegit el contingut proporcionat, no oblideu executar el codi proporcionat i modificar-lo per crear-ne variants, que us permetin comprovar que heu entès la seva funcionalitat i explorar-ne els detalls d'implementació. Per últim, us recomanem també consultar la documentació enllaçada per explorar amb més profunditat les funcionalitats dels mòduls presentats.

[1]: # %load_ext pycodestyle_magic
[2]: # %pycodestyle_on

1.1.2 Introducció

En aquesta unitat veurem com podem optimitzar els programes en Python, programant-ne versions que aprofitin la concurrència dels processadors i/o el paralůlelisme que ofereixen les arquitectures actuals. Això ens permetrà, dissenyar i implementar codi que aprofiti els recursos disponibles a la nostra màquina per a realitzar la tasca per la qual ha estat dissenyat.

En primer lloc, presentarem els conceptes bàsics de concurrència i paralulelisme, i farem una petita descripció dels *threads* i els processos.

Seguidament, s'explica com podem implementar codi *multithreaded* en Python, i quan serà beneficiós fer-ho. Veurem també quins problemes es poden produir de l'execució amb múltiples fils, i algunes de les eines que ens ofereix Python per a evitar-los.

Després ens centrarem en la creació de programes multiprocés. De nou, explicarem en quines situacions pot ser útil que un programa sigui multiprocés, veurem com implementar aquest tipus

de programes des de Python, i detallarem algunes alternatives per a comunicar diferents processos.

Important:

Nota 1: Abans d'executar el codi d'aquest notebook, cal instalular una llibreria addicional. Per instalular llibreries en Python, farem servir pip, l'instalulador de paquets de Python.

Obriu ara una consola i executeu la següent instrucció, que instalula el paquet sympy:

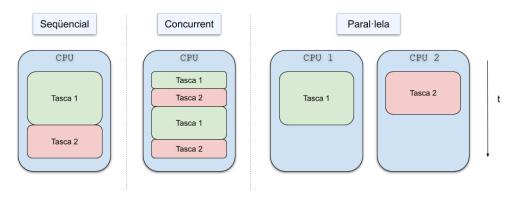
sudo pip3 install sympy

Només cal realitzar aquest pas **una única vegada**. Una vegada tingueu instalůlada la llibreria, podreu executar la totalitat del notebook a la màquina on hagueu fet la instalůlació.

2 1.- Introducció

Fins ara hem creat programes que s'executen **seqüencialment**: seguint el flux d'execució definit pel codi, les instruccions s'executaven sempre una darrera de l'altra, esperant a que finalitzi cada instrucció per a començar a executar la següent. Ara bé, d'una banda, la majoria d'ordinadors moderns disposen de diverses CPUs, que permeten executar diversos fluxos d'execució alhora. D'altra banda, tot i només disposar d'una única CPU, a vegades serà més eficient anar intercalant l'execució de diversos fils, en comptes d'anar esperant a que finalitzi cadascun d'ells per a executar-ne el següent. N'és el cas, per exemple, de fils d'execució que esperen events externs: mentre un dels fils es troba esperant l'event extern, un segon fil pot aprofitar la CPU per fer càlculs.

Així, en aquest *notebook* descriurem com podem realitzar programació **concurrent** (on diverses tasques poden avançar simultàniament, sense necessitat d'esperar a que en finalitzi una per iniciar la següent) i programació **paralůlela** (on diverses tasques s'executen alhora) en Python. La imatge següent mostra el concepte clau que distingeix la programació seqüencial, la concurrent i la paralůlela:



concurrencia

A continuació descriurem com es pot implementar la concurrència i el paralůlelisme en Python fent servir *threads* i processos.

Un **procés** és un programa que s'ha carregat en memòria per a la seva execució, juntament amb els recursos que necessita per a executar-se. Aquests recursos contenen els registres (que poden contenir una instrucció, una adreça, una dada, etc.); el comptador de programa (un registre especial que emmagatzema un punter a la instrucció que s'està executant); i la pila i el *heap* (amb el fil de crides que han anat succeint i les variables que s'han anat creant).

Un **fil d'execució** o *thread* és una unitat d'execució dins d'un procés. Un procés sempre té com a mínim un *thread*, i en pot tenir diversos.

Quan un procés es crea, se li assignen els recursos necessaris per a executar-se (entre els quals hi ha la memòria on s'emmagatzemen les variables). Així doncs, cada nou procés disposarà del seu espai de memòria (que s'assigna en el moment de la creació).

En canvi, la creació d'un nou *thread* en un procés no requereix de l'assignació de nous recursos: cada *thread* d'execució d'un procés compartirà la memòria ja assignada al procés on s'ha creat. Els *threads* sí que tindran algun recurs propi, però aquest serà mínim i es limitarà a les dades bàsiques que permetin mantenir l'execució (per exemple, tindran el seu propi comptador de programa que indiqui quina instrucció estan executant).

Això té dues implicacions clares. D'una banda, tant la creació de nous processos com els canvis de context entre processos són més costosos que entre *threads* (per l'*overhead* que es produeix a l'haver de gestionar la memòria). D'altra banda, els *threads* podran tenir problemes d'interferència al compartir espais de memòria, però serà fàcil passar dades d'un *thread* a un altre justament per aquesta compartició; en canvi, serà més costós comunicar processos entre ells, ja que diferents processos tindran espais de memòria diferents.

En aquesta introducció s'ha simplificat una mica el detall de com funciona la gestió de memòria en l'execució de programes, ja que no és l'objectiu principal d'aquest mòdul. Si esteu interessats en explorar en més detall què diferencia, a nivell de sistema operatiu, els *threads* dels processos, us recomanem que visiteu els enllaços següents (1, 2, 3, 4, 5).

3 2.- Ús de múltiples threads en Python

3.1 2.1.- Introducció

En aquesta secció veurem com podem implementar *threads* en Python fent servir el mòdul threading.

El mòdul threading implementa la classe Thread que representa un flux d'execució que corre en un thread individual. Per tal de crear diversos fils d'execució dins del nostre programa, crearem doncs diferents instàncies de la classe Thread, especificant quina funció han d'executar i amb quins paràmetres.

Una vegada creada la instància de Thread, podem iniciar-ne la seva execució cridant el mètode start. Per tal de controlar la finalització dels diferents fils d'execució des del fil principal, farem servir el mètode join de cada *thread*: aquest mètode bloqueja l'execució del fil on s'executa fins que finalitza el *thread* sobre el que s'ha cridat.

A continuació s'implementa un exemple senzill d'execució multithreaded amb el mòdul threading. Definim una funció random_wait que espera un temps aleatori entre un i quatre segons, i que serà la funció que executaran els diferents fils. El codi principal crea tres instàncies de la classe Thread, que executen la funció random_wait, i les inicia (amb thread.start()). Després, el fil principal espera a que finalitzin cadascun dels tres threads, cridant el mètode join de cadascun d'ells.

```
[3]: from threading import Thread
from random import randint
from time import sleep
import logging
import sys
```

```
def random_wait(t_index):
    Espera un temps aleatori entre 1 i 4 segons.
    logging.info("[T{}]\tStarted".format(t_index))
    t = randint(1, 4)
    logging.info("[T{}]\tSleeping {} seconds...".format(t_index, t))
    sleep(t)
    logging.info("[T{}]\tEnd".format(t_index))
# Configura el logging
log_format = '[%(process)d]\t%(asctime)s %(levelname)s: %(message)s'
logging.basicConfig(format=log_format, level=logging.INFO, datefmt="%H:%M:%S",
                    handlers=[logging.StreamHandler(sys.stdout)])
# Crea 3 threads que executen la funció random_wait i
# els inicia
threads = \Pi
num_threads = 3
for i in range(num_threads):
    logging.info("[M]\tCreating thread {}".format(i))
    # Creem el thread
    thread = Thread(target=random_wait, args=(i,))
    threads.append(thread)
    # Executem el thread
    thread.start()
# Espera a que els 3 threads finalitzin
for i, thread in enumerate(threads):
    logging.info("[M]\tWaiting to join thread {}".format(i))
    thread.join()
    logging.info("[M]\tThread {} joined!".format(i))
logging.info("[M]\tDONE!")
[1754] 15:31:29 INFO: [M]
                                Creating thread 0
[1754] 15:31:29 INFO: [TO]
                                Started
[1754] 15:31:29 INFO: [M]
                                Creating thread 1
[1754] 15:31:29 INFO: [TO]
                                Sleeping 2 seconds...
[1754] 15:31:29 INFO: [T1]
                                Started
[1754] 15:31:29 INFO: [M]
                                Creating thread 2
[1754] 15:31:29 INFO: [T1]
                                Sleeping 4 seconds...
[1754] 15:31:29 INFO: [T2]
                                Started
[1754] 15:31:29 INFO: [M]
                                Waiting to join thread 0
```

Sleeping 1 seconds...

[1754] 15:31:29 INFO: [T2]

```
Γ1754]
        15:31:30 INFO: [T2]
                                  End
[1754]
        15:31:31 INFO: [TO]
                                  End
[1754]
        15:31:31 INFO: [M]
                                  Thread 0 joined!
[1754]
        15:31:31 INFO: [M]
                                  Waiting to join thread 1
Γ17547
        15:31:33 INFO: [T1]
                                 End
[1754]
        15:31:33 INFO: [M]
                                  Thread 1 joined!
[1754]
        15:31:33 INFO: [M]
                                  Waiting to join thread 2
Γ17547
        15:31:33 INFO: [M]
                                  Thread 2 joined!
[1754]
        15:31:33 INFO: [M]
                                  DONE!
```

En primer lloc, fixeu-vos que la funció random_wait rep un paràmetre que fem servir per identificar cadascun dels *threads*. Per facilitar el seguiment de l'execució, mostrem aquest identificador entre claudàtors cada vegada que mostrem un missatge de *log*.

En segon lloc, noteu com els diferents fils s'executen concurrentment: mentre el fil principal està creant el segon i tercer fils, el primer fil creat ja s'està executant. Noteu també com el primer fil a iniciar-se (T0) no té perquè ser el primer a finalitzar, ja que això dependrà de les esperes aleatòries que es produeixen en cada fil.

En tercer lloc, és interessant notar que no hem fet servir la instrucció print per a mostrar els missatges que informen de quina part del codi s'està executant, sinó que hem utilitzat el mòdul logging. El principal motiu per fer-ho és assegurar que els diferents missatges es mostren sense interrupcions i amb el format desitjat, tot i que diferents fils d'execució estiguin escrivint-los. Addicionalment, fer servir logging ens ofereix altres funcionalitats, com ara el fet de mostrar informació addicional abans de cada missatge. En el cas del fragment de codi executat a la celula anterior, hem aprofitat per mostrar l'identificador del procés, l'hora, i el nivell del missatge.

El mòdul logging té com a objectiu facilitar la creació de registres o *logs* en Python, ajudant així en el seguiment del flux d'execució dels programes. Els *logs* normalment contenen un registre dels events que han succeït i permeten seguir el comportament d'un programa, amb diverses finalitats. Així, per exemple, els *logs* poden servir per a ajudar en la detecció i depuració d'errors, per avaluar el rendiment d'un programa, per mostrar informació addicional sobre com o qui l'està utilitzant, etc. Aquest mòdul és, per tant, molt útil alhora de fer el seguiment de l'execució de codi concurrent. Si voleu explorar l'ús d'aquesta llibreria, us recomanem la lectura dels tutorials oficials (tant el bàsic com el més avançat).

3.2 2.2.- Optimització de codi fent servir threads en Python

No tots els programes poden beneficiar-se de l'execució en múltiples *threads*. D'una banda, els programes que requereixen conèixer uns resultats anteriors per a calcular-ne els següents, difícilment s'executaran més ràpid en un entorn *multithreaded*, ja que els diferents fils no podran executar-se concurrentment. D'altra banda, en la seva versió més estesa, Python executa els diferents *threads* en un mateix processador, de manera que l'execució d'aquests és concurrent (però no paralulela). Veiem-ho amb un parell d'exemples.

A la celula següent es defineix la funció get_factors, que donat un enter, en calcula la seva descomposició en factors primers i la retorna:

```
[4]: from sympy import primefactors

def get_factors(t_index, value):
"""
```

```
Retorna la factorització de `value` en factors primers.
        logging.info("[T{}]\tStarted with input {}".format(t_index, value))
        r = primefactors(value)
        logging.info("[T{}]\tEnded with output {}".format(t_index, r))
[5]: # Factoritzem el valor 15
   get_factors(1, 15)
   Γ1754]
          15:31:33 INFO: [T1]
                                    Started with input 15
   [1754]
          15:31:33 INFO: [T1]
                                    Ended with output [3, 5]
      Ara, calcularem la factorització de tres enters fent servir la funció get factors de manera
   sequencial:
[6]: nums_to_factor = [5215785878052641903952977068511001599,
                      748283119772062608265951220534384001023,
                      949273031776466197045163567568010291199]
[7]: %%time
   for _, num in enumerate(nums_to_factor):
        get_factors(1, num)
   [1754] 15:31:33 INFO: [T1]
                                    Started with input
   5215785878052641903952977068511001599
   [1754] 15:31:34 INFO: [T1]
                                    Ended with output [479001599,
   10888869450418352160768000001]
   [1754] 15:31:34 INFO: [T1]
                                    Started with input
   748283119772062608265951220534384001023
   [1754] 15:31:39 INFO: [T1]
                                    Ended with output [68720001023,
   10888869450418352160768000001]
   [1754] 15:31:39 INFO: [T1]
                                    Started with input
   949273031776466197045163567568010291199
   [1754] 15:31:43 INFO: [T1]
                                    Ended with output [87178291199,
   10888869450418352160768000001]
   CPU times: user 9.35 s, sys: 34.8 ms, total: 9.39 s
   Wall time: 9.87 s
      A continuació tornarem a repetir el càlcul de la factorització dels mateixos tres enters,
   executant-los ara com a threads independents:
[8]: %%time
   threads = []
    # Crea 3 threads que executen la funció get_factors i
    # els inicia
```

for i, num in enumerate(nums_to_factor):

threads.append(thread)

thread = Thread(target=get_factors, args=(i, num))

```
thread.start()

# Espera a que els 3 threads finalitzin
for i, thread in enumerate(threads):
    logging.info("[M]\tWaiting to join thread {}".format(i))
    thread.join()
    logging.info("[M]\tThread {} joined!".format(i))

logging.info("[M]\tDONE!")
```

```
[1754] 15:31:43 INFO: [TO]
                                Started with input
5215785878052641903952977068511001599
                                Started with input
[1754] 15:31:43 INFO: [T1]
748283119772062608265951220534384001023
[1754] 15:31:43 INFO: [T2]
                                Started with input
949273031776466197045163567568010291199
[1754] 15:31:43 INFO: [M]
                                Waiting to join thread 0
                                Ended with output [479001599,
[1754] 15:31:46 INFO: [TO]
10888869450418352160768000001]
[1754] 15:31:47 INFO: [M]
                                Thread 0 joined!
                                Waiting to join thread 1
[1754] 15:31:47 INFO: [M]
                                Ended with output [68720001023,
[1754] 15:31:53 INFO: [T1]
10888869450418352160768000001]
[1754] 15:31:53 INFO: [M]
                                Thread 1 joined!
[1754] 15:31:53 INFO: [M]
                                Waiting to join thread 2
[1754] 15:31:53 INFO: [T2]
                                Ended with output [87178291199,
10888869450418352160768000001]
[1754] 15:31:53 INFO: [M]
                                Thread 2 joined!
[1754] 15:31:53 INFO: [M]
                                DONE!
CPU times: user 9.42 s, sys: 9.44 ms, total: 9.43 s
Wall time: 9.91 s
```

Els temps d'execució de les dues versions del codi (la primera, seqüencial; i la segona, amb múltiples *threads*) és molt similar (i, sovint, la versió seqüencial resulta més ràpida). Això és així perquè els diferents *threads* s'executen en un mateix processador i tots ells executen codi que requereix temps de còmput de CPU. Per tant, la possible concurrència en l'execució no s'aprofita, i l'overhead que produeix la gestió dels *threads* impacta negativament en el rendiment del codi. Així doncs, aquest és un exemple clar d'un fragment de codi que **no** es beneficiarà d'una implementació amb múltiples fils d'execució en Python.

Veiem ara un segon exemple, en el qual crearem també tres *threads*: dos d'elles es descarregaran uns conjunts de dades d'Internet, i el tercer tornarà a factoritzar un dels números de l'exemple anterior.

En primer lloc, definim la funció get_url_and_write_to_disk, que descarrega el contingut d'una *url* i el desa al disc:

```
[9]: import requests

def get_url_and_write_to_disk(t_index, url):
```

```
Descarrega el contingut de la url i el desa a la carpeta `data`.
         logging.info("[T{}]\tStarted with url {}".format(t_index, url))
         r = requests.get(url, allow_redirects=True)
         open('data/'+str(t_index), 'wb').write(r.content)
         logging.info("[T{}]\tEnd".format(t_index))
[10]: urls = ["https://snap.stanford.edu/data/twitter.tar.gz",
             "https://snap.stanford.edu/data/twitter_combined.txt.gz"]
```

Ara, com a l'exemple anterior, executarem les tres tasques de manera seqüencial: primer, factoritzarem l'enter i, després, descarregarem els dos fitxers apuntats per les urls de la llista de la

```
celula anterior:
[12]: %%time
     get_factors(1, nums_to_factor[-1])
    [1754] 15:33:50 INFO: [T1]
                                     Started with input
    949273031776466197045163567568010291199
    [1754] 15:33:55 INFO: [T1]
                                     Ended with output [87178291199,
    10888869450418352160768000001]
    CPU times: user 3.69 s, sys: 138 ms, total: 3.83 s
    Wall time: 4.66 s
[13]: %%time
     for url in urls:
         get_url_and_write_to_disk(1, url)
    [1754] 15:33:55 INFO: [T1]
                                     Started with url
    https://snap.stanford.edu/data/twitter.tar.gz
    [1754] 15:33:59 INFO: [T1]
                                     End
    [1754] 15:33:59 INFO: [T1]
                                     Started with url
    https://snap.stanford.edu/data/twitter_combined.txt.gz
    [1754] 15:34:02 INFO: [T1]
                                     End
    CPU times: user 18.3 ms, sys: 1.3 s, total: 1.31 s
    Wall time: 7.36 s
```

A continuació, implementem la versió multithreaded del codi anterior, tot creant tres threads (dos que descarregaran fitxers i un que farà el càlcul de la factorització).

```
[14]: %%time
     # Creem els 3 threads que executen get factors o get url and write to disk
     # i els iniciem
     threads = []
     for i in range(3):
         if i == 2:
```

```
thread = Thread(target=get_factors, args=(i, nums_to_factor[-1]))
else:
    thread = Thread(target=get_url_and_write_to_disk, args=(i, urls[i]))

threads.append(thread)
thread.start()

# Esperem a que els 3 threads finalitzin
for i, thread in enumerate(threads):
    logging.info("[M]\tWaiting to join thread {}".format(i))
    thread.join()
    logging.info("[M]\tThread {} joined!".format(i))
logging.info("[M]\tDONE!")
```

```
[1754] 15:34:04 INFO: [TO]
                                Started with url
https://snap.stanford.edu/data/twitter.tar.gz
[1754] 15:34:04 INFO: [T1]
                                Started with url
https://snap.stanford.edu/data/twitter_combined.txt.gz
[1754]
       15:34:04 INFO: [T2]
                                Started with input
949273031776466197045163567568010291199
[1754] 15:34:04 INFO: [M]
                                Waiting to join thread 0
[1754] 15:34:07 INFO: [T1]
                                Ended with output [87178291199,
[1754] 15:34:09 INFO: [T2]
10888869450418352160768000001]
[1754] 15:34:10 INFO: [TO]
                                End
[1754] 15:34:10 INFO: [M]
                                Thread 0 joined!
[1754] 15:34:10 INFO: [M]
                                Waiting to join thread 1
                                Thread 1 joined!
[1754] 15:34:10 INFO: [M]
                                Waiting to join thread 2
[1754] 15:34:10 INFO: [M]
[1754] 15:34:10 INFO: [M]
                                Thread 2 joined!
[1754] 15:34:10 INFO: [M]
                                DONE!
CPU times: user 2.77 s, sys: 1.97 s, total: 4.74 s
Wall time: 5.98 s
```

A diferència del primer exemple, ara sí que veiem una millora clara en el temps d'execució de la versió concurrent en relació a la versió seqüencial del nostre codi. En aquest cas, el fet que els tres *threads* no executin una tasca centrada en la CPU, sinó que dos d'ells descarreguen dades i les desen a disc, i el tercer sí que fa servir la CPU, fa que el temps d'execució global millori amb l'execució concurrent: tot el codi s'ha executat en una única CPU, però els temps d'espera produïts per les limitacions de la xarxa i l'escriptura a disc són aprofitats per a realitzar càlculs.

3.3 2.3.- Interferències entre threads

Al crear instàncies de la classe Thread que executen una funció (que es passa com a target al constructor de la classe), els diferents threads que s'executen concurrentment disposen d'una còpia pròpia de totes les variables locals de la funció que executen (per exemple, de la variable r de

la funció get_url_and_write_to_disk; o de la variable t de la funció random_wait) però comparteixen les mateixes variables globals.

El fet que diversos fils d'execució estiguin compartint les mateixes variables pot provocar interferències entre els diversos fils a l'hora de fer servir aquestes variables, interferències que poden causar comportaments indesitjats en els programes *multithreaded*.

Per veure un exemple dels problemes que es poden produir, recuperem el codi de la factorització concurrent d'una llista d'enters, i hi afegirem una variable global factor_ctr que comptarà quants números s'han factoritzat. La funció get_factors llegirà el valor de la variable, i la incrementarà quan hagi finalitzat cada factorització:

```
[15]: def get_factors(t_index, value):
         global factor_ctr
         logging.info("[T{}]\tStarted with input {}".format(t_index, value))
         c = factor_ctr
         r = primefactors(value)
         factor_ctr = c + 1
         logging.info("[T{}]\tEnded with output {}".format(t_index, r))
     factor ctr = 0
     threads = []
     for i, num in enumerate(nums to factor):
         thread = Thread(target=get_factors, args=(i, num))
         threads.append(thread)
         thread.start()
     for i, thread in enumerate(threads):
         logging.info("[M]\tWaiting to join thread {}".format(i))
         thread.join()
         logging.info("[M]\tThread {} joined!".format(i))
     logging.info("[M]\tDONE!")
     logging.info("[M]\tFactor counter is: {}".format(factor_ctr))
```

```
[1754] 15:34:10 INFO: [TO]
                                Started with input
5215785878052641903952977068511001599
[1754] 15:34:10 INFO: [T1]
                                Started with input
748283119772062608265951220534384001023
[1754] 15:34:10 INFO: [T2]
                                Started with input
949273031776466197045163567568010291199
[1754] 15:34:10 INFO: [M]
                                Waiting to join thread 0
                                Ended with output [479001599,
[1754] 15:34:14 INFO: [TO]
10888869450418352160768000001]
[1754] 15:34:14 INFO: [M]
                                Thread 0 joined!
[1754] 15:34:14 INFO: [M]
                                Waiting to join thread 1
                                Ended with output [68720001023,
[1754] 15:34:21 INFO: [T1]
10888869450418352160768000001]
[1754] 15:34:21 INFO: [M]
                                Thread 1 joined!
```

```
[1754]
       15:34:21 INFO: [M]
                                 Waiting to join thread 2
[1754]
       15:34:21 INFO: [T2]
                                 Ended with output [87178291199,
10888869450418352160768000001]
        15:34:21 INFO: [M]
                                 Thread 2 joined!
[1754]
Γ17547
        15:34:21 INFO: [M]
                                 DONE!
[1754]
        15:34:21 INFO: [M]
                                 Factor counter is: 1
```

Fixeu-vos que tot i haver executat tres vegades la funció get_factors, el valor final de la variable factor_ctr és 1 en comptes de 3. Si ens fixem en l'ordre amb què s'han executat les instruccions, podrem deduir què ha passat: els tres threads han començat a executar-se, i han copiat el valor inicial de la variable global factor_ctr a les seves respectives variables locals c. Els tres threads han executat aquesta assignació **abans** que cap d'ells actualitzés el valor de la variable, de manera que les tres variables locals c contenen inicialment el valor 0. Després de factoritzar l'enter, els tres threads han procedit a actualitzar la variable global factor_ctr, assignant-li el valor 1 (c + 1). Cada thread ha actualitzat doncs el valor de global factor_ctr, però sobreescrivint-la sempre amb el valor 1.

El problema del codi anterior és, d'una banda, que l'actualització de la variable es fa en dos passos (lectura del valor original i escriptura del nou valor) i, d'altra banda, que tots tres *threads* accedeixen a la variable global sense cap mena de control sobre qui l'està fent servir en cada moment. Això fa que lectures i escriptures dels diversos fils s'intercalin, produint un resultat incorrecte per al nostre objectiu. Per a obtenir el resultat correcte hauríem d'assegurar que cada *thread* llegeix el valor actual de la variable factor_ctr i escriu el valor actualitzat (resultant d'incrementar-la en una unitat) de manera **atòmica**.

Una alternativa per a assegurar l'atomicitat de l'operació d'actualització de la variable és bloquejar-ne el seu ús (en anglès, parlarem d'obtenir un *lock* o bloqueig sobre la variable) abans de fer-la servir, assegurant que cap altra *thread* pot treballar-hi mentre duri el bloqueig. Així, el fil que obté el bloqueig podrà llegir i escriure la variable (en definitiva, actualitzar-la), sense que hi hagi interferències per part dels altres fils d'execució.

El mòdul threading permet implementar bloquejos fent servir la classe Lock, que disposa dels mètodes acquire i release, que bloquegen i desbloquegen l'accés a fragments de codi. El primer fil que executa un acquire sobre un lock, n'obtindrà el dret d'execució, i la resta de fils que executin l'acquire hauran d'esperar a que aquest quedi alliberat amb l'execució del mètode release. A continuació s'implementa l'exemple anterior fent servir *locks* per a controlar l'actualització de la variable factor_ctr:

```
def get_factors(t_index, value, lock):
    global factor_ctr
    logging.info("[T{}]\tStarted with input {}".format(t_index, value))
    # Es bloqueja l'accés a aquesta part del codi: només un thread
    # podrà accedir-hi fins que no s'alliberi
    lock.acquire()
    c = factor_ctr + 1
    r = primefactors(value)
    factor_ctr = c
    # S'allibera l'accés, permetent que un altre thread accedeixi
```

```
# a aquest fragment de codi
    lock.release()
    logging.info("[T{}]\tEnded with output {}".format(t_index, r))
factor_ctr = 0
# Es crea un lock, que servirà per controlar l'accés al fragment de codi
# que actualitza la variable global
lock = Lock()
threads = []
for i, num in enumerate(nums to factor):
    thread = Thread(target=get_factors, args=(i, num, lock))
    threads.append(thread)
    thread.start()
for i, thread in enumerate(threads):
    logging.info("[M]\tWaiting to join thread {}".format(i))
    thread.join()
    logging.info("[M]\tThread {} joined!".format(i))
logging.info("[M]\tDONE!")
logging.info("[M]\tFactor counter is: {}".format(factor_ctr))
[1754] 15:34:21 INFO: [TO]
                                Started with input
5215785878052641903952977068511001599
[1754] 15:34:21 INFO: [T1]
                                Started with input
748283119772062608265951220534384001023
[1754] 15:34:21 INFO: [T2]
                                Started with input
949273031776466197045163567568010291199
[1754] 15:34:21 INFO: [M]
                                Waiting to join thread 0
                                Ended with output [479001599,
[1754] 15:34:22 INFO: [TO]
10888869450418352160768000001]
[1754] 15:34:22 INFO: [M]
                                Thread 0 joined!
[1754] 15:34:22 INFO: [M]
                                Waiting to join thread 1
                                Ended with output [68720001023,
[1754] 15:34:27 INFO: [T1]
10888869450418352160768000001]
[1754] 15:34:27 INFO: [M]
                                Thread 1 joined!
[1754] 15:34:27 INFO: [M]
                                Waiting to join thread 2
[1754] 15:34:31 INFO: [T2]
                                Ended with output [87178291199,
10888869450418352160768000001]
[1754] 15:34:31 INFO: [M]
                                Thread 2 joined!
```

Al codi de la celula anterior es crea un objecte Lock global, que es fa servir per controlar l'accés a les següents tres línies de codi:

Factor counter is: 3

DONE!

```
c = factor_ctr + 1
```

[1754] 15:34:31 INFO: [M]

[1754] 15:34:31 INFO: [M]

```
r = primefactors(value)
factor_ctr = c
```

que implementen l'actualització de la variable global factor_ctr. D'aquesta manera, s'aconsegueix que no hi hagi interferències entre els tres *threads*, i que la variable comptabilitzi correctament el número de factoritzacions.

Hi ha un detall a comentar en relació a l'exemple que hem fet servir per motivar l'ús de *locks*: el codi d'actualització de la variable factor_ctr està programat explícitament perquè passi molt temps entre la lectura de la variable i l'escriptura del valor actualitzat, ja que entremig s'hi executa la factorització (que és una operació lenta). Això assegura que efectivament es produeixen interferències en l'execució dels diferents fils, i permet visualitzar un dels problemes que comporta la compartició de variables entre fils d'execució. Ara bé, si haguéssim fet l'actualització de manera més compacta, *probablement* no hauríem pogut observar les interferències produïdes entre els *threads*, ja que el codi hagués donat el resultat esperat tot i no implementar cap mena de control sobre l'accés a la variable. Tot i així, sempre és aconsellable assegurar que l'execució dels diferents fils no produeix interferències, ja que les casuístiques d'execució de codis *multithreaded* complexos en entorns reals són enormes, i els errors en programes que fan servir aquest paradigma són sovint molt difícils de detectar.

3.3.1 2.3.1.- Deadlocks

L'ús de *locks* permet gestionar els recursos en aplicacions concurrents. Ara bé, si aquesta gestió es fa de manera incorrecta, també pot crear nous problemes. Fixem-nos, per exemple, en el codi de la celúla següent, que executa dos acquire seguits sobre el mateix *lock*. Si el descomentem i l'executem, el *notebook* es quedarà esperant indefinidament després del primer print. Això és degut a que el segon acquire no es podrà aconseguir mai, doncs el recurs es troba ja assignat i no s'allibera en cap moment.

```
[]: """
# Descomenteu aquest fragment de codi si voleu crear un deadlock
lock = Lock()

lock.acquire()
print("Lock acquired")
lock.acquire()
print("We will never get here...")
"""
```

Aquesta situació, en la qual un fil d'execució es troba bloquejat de manera indefinida a l'espera d'un recurs que mai podrà obtenir, es coneix amb el nom de *deadlock*.

L'exemple de la celula anterior és una mica artificial, ja que el *deadlock* es produeix per un únic *thread* que intenta adquirir dues vegades el mateix recurs sense haver-lo alliberat, però serveix per ilulustrar de manera senzilla la situació. Normalment, els *deadlocks* es produeixen quan diversos fils d'execució intenten adquirir diferents recursos en un ordre que acaba produint una situació de bloqueig total.

L'exemple de la celûla següent produeix un *deadlock* entre dos *threads*. A l'exemple, un dels *threads* obté un número a factoritzar de la llista nums_to_factor, i escriu el resultat de la factorització a la llista results. Per a controlar l'accés als dos recursos (és a dir, a les dues llistes), es fan servir dos *locks*, lock_nums i lock_res, respectivament. El segon *thread* és un fil informatiu, que mostra l'estat de les dues llistes per pantalla.

```
[]: """
   def factor_from_list(t_index, lock_nums, lock_res):
        logging.info("[T{}]\tFactor\thread\ started".format(t_index))
        logging.info("[T{}] \setminus tWaiting for lock_nums".format(t_index))
        lock_nums.acquire()
        logging.info("[T{}]\tlock_nums acquired".format(t_index))
       num_to_factor = nums_to_factor.pop()
       r = primefactors(num_to_factor)
        logging.info("[T{}]\tWaiting for lock_res".format(t_index))
        lock res.acquire()
        logging.info("[T{}]\tlock_res acquired".format(t_index))
       results.append(r)
        lock_res.release()
        lock_nums.release()
        logging.info("[T{}] \setminus Ended".format(t_index))
   def print_status(t_index, lock_nums, lock_res):
        logging.info("[T{}]\tPrint\ thread\ started".format(t_index))
        logging.info("[T{}]\twaiting\ for\ lock\_res".format(t\_index))
        lock res.acquire()
        logging.info("[T{}]\tlock_res acquired".format(t_index))
        logging.info("[T{}]\tWaiting for lock_nums".format(t_index))
        lock_nums.acquire()
        logging.info("[T{}] \setminus tlock\_nums acquired".format(t\_index))
       print(results)
       print(nums_to_factor)
        lock_res.release()
        lock_nums.release()
        logging.info("[T{}] \setminus Ended".format(t_index))
    lock nums = Lock()
    lock res = Lock()
   results = []
   thread_0 = Thread(target=factor_from_list, args=(0, lock_nums, lock_res))
    thread_1 = Thread(target=print_status, args=(1, lock_nums, lock_res))
    thread_0.start()
   thread_1.start()
    logging.info("[M]\tWaiting to join thread {}".format(0))
    thread_0.join()
    logging.info("[M]\tThread {} joined!".format(0))
    logging.info("[M]\tWaiting to join thread {}".format(0))
```

```
thread_1.join()
logging.info("[M]\tThread {} joined!".format(0))

logging.info("[M]\tDONE!")
"""
```

El problema en aquest cas és que el *thread* de factorització adquireix el *lock* sobre la llista lock_nums, i es queda bloquejat esperant a obtenir lock_res. Per la seva banda, el *thread* informatiu adquireix el *lock* sobre lock_res, i es queda bloquejat esperant a obtenir lock_nums. Això produeix una situació d'espera infinita, ja que cap dels dos recursos s'allibera mai.

4 3.- Ús de múltiples processos en Python

4.1 3.1.- Introducció

En aquesta secció veurem com podem crear múltiples processos des del nostre codi en Python. De fet, ja hem creat processos des de Python anteriorment, quan executàvem programes externs fent servir el mòdul subprocess. En aquell cas, simplement creàvem un nou procés que executava una comanda del sistema operatiu o bé algun programa extern al nostre codi Python, i esperàvem a que finalitzés per a seguir l'execució del procés principal (que executava el nostre programa en Python). Ara, veurem com podem crear diversos processos que executen codi del nostre programa en Python de manera paralůlela, fent servir el mòdul multiprocessing.

El mòdul multiprocessing implementa la classe Process que representa un flux d'execució que corre en un procés individual. Per tal de crear diferents processos controlats pel nostre programa principal, crearem doncs diferents instàncies de la classe Process, especificant quina funció han d'executar i amb quins paràmetres.

De manera similar a com treballàvem amb els *threads* a l'apartat anterior, una vegada creada la instància de Process, podem iniciar-ne la seva execució cridant el mètode start, i esperar la seva finalització amb el mètode join.

A continuació s'implementa un exemple senzill (anàlog al primer exemple de *multithreading*) d'execució multiprocés amb el mòdul <u>multiprocessing</u>.

```
[17]: from multiprocessing import Process

def random_wait(p_index):
    """
    Espera un temps aleatori entre 1 i 4 segons.
    """
    logging.info("[P{}]\tStarted".format(p_index))
    t = randint(1, 4)
    logging.info("[P{}]\tSleeping {} seconds...".format(p_index, t))
    sleep(t)
    logging.info("[P{}]\tEnd".format(p_index))

# Crea 3 processos que executen la funció random_wait i
# els inicia
```

```
processes = []
for i in range(3):
    logging.info("[M]\tCreating process {}".format(i))
    # Crea el procés
    p = Process(target=random_wait, args=(i,))
    processes.append(p)
    # Inicia el procés
    p.start()

# Espera a que els 3 processos finalitzin
for process in processes:
    logging.info("[M]\tWaiting to join process {}".format(i))
    process.join()
    logging.info("[M]\tProcess {} joined!".format(i))
logging.info("[M]\tDONE!")
```

```
[1754]
      15:34:31 INFO: [M]
                                Creating process 0
[1754] 15:34:31 INFO: [M]
                                Creating process 1
[1754] 15:34:31 INFO: [M]
                                Creating process 2
[4593]
       15:34:31 INFO: [PO]
                                Started
       15:34:31 INFO: [PO]
[4593]
                                Sleeping 4 seconds...
[1754]
       15:34:31 INFO: [M]
                                Waiting to join process 2
       15:34:31 INFO: [P1]
[4596]
                                Started
[4596]
       15:34:31 INFO: [P1]
                                Sleeping 3 seconds...
[4599]
       15:34:31 INFO: [P2]
                                Started
[4599]
       15:34:31 INFO: [P2]
                                Sleeping 1 seconds...
[4599]
       15:34:32 INFO: [P2]
                                End
       15:34:34 INFO: [P1]
                                End
[4596]
[4593]
       15:34:35 INFO: [PO]
                                End
[1754] 15:34:35 INFO: [M]
                                Process 2 joined!
       15:34:35 INFO: [M]
                                Waiting to join process 2
[1754]
[1754] 15:34:35 INFO: [M]
                                Process 2 joined!
[1754]
      15:34:35 INFO: [M]
                                Waiting to join process 2
                                Process 2 joined!
[1754] 15:34:35 INFO: [M]
       15:34:35 INFO: [M]
[1754]
                                DONE!
```

Tot i que la gestió dels processos s'ha fet de manera molt similar a com havíem gestionat els *threads*, l'execució és molt diferent! D'una banda, els diferents processos poden executar-se de manera paralulela, distribuint la seva execució entre les diverses CPUs de la màquina. D'altra banda, la gestió de la memòria ha estat radicalment diferent: amb la creació de diversos processos, s'han creat còpies de tots els recursos per a cadascun d'ells.

Un dels primers canvis que podem observar de la sortida de la celula anterior és que ara l'identificador de procés (el *PID*, que és el primer valor que es mostra entre claudàtors per cada línia de *log*) és ara diferent per cadascun dels processos ja que, efectivament, s'han creat processos independents, que disposen del seu propi identificador de procés.

4.2 3.2.- Optimització de codi fent servir multiprocés en Python

A l'apartat anterior hem vist com alguns tipus de programes no es beneficien de l'execució concurrent en un mateix processador: són els programes on les tasques requereixen d'un ús intensiu de la CPU, com ara per exemple, la factorització d'enters en factors primers. Alguns d'aquests programes podran beneficiar-se de l'execució multiprocés, aprofitant les diverses CPUs de les quals disposa la màquina per a executar tasques de manera **paralůlela**. Per veure-ho, tornarem a executar l'exemple de la factorització d'un llista d'enters, fent servir ara un procés diferent per a factoritzar cadascun dels enters de la llista:

```
[18]: def get_factors(p_index, value):
         Retorna la factorització de `value` en factors primers.
         logging.info("[P{}]\tStarted with input {}".format(p_index, value))
         r = primefactors(value)
         logging.info("[P{}] \text{tEnded with output {}".format(p index, r))
     nums_to_factor = [5215785878052641903952977068511001599,
                       748283119772062608265951220534384001023,
                       949273031776466197045163567568010291199]
[19]: %%time
     # Crea 3 processos que executen la funció get_factors i
     # els inicia
     processes = []
     for i, num in enumerate(nums_to_factor):
         logging.info("[M]\tCreating process {}".format(i))
         p = Process(target=get_factors, args=(i, num))
         processes.append(p)
         p.start()
     # Espera a que els 3 processos finalitzin
     for process in processes:
         logging.info("[M]\tWaiting to join process {}".format(i))
         process.join()
         logging.info("[M]\tProcess {} joined!".format(i))
     logging.info("[M]\tDONE!")
```

```
[1754] 15:34:35 INFO: [M] Creating process 0 [1754] 15:34:36 INFO: [M] Creating process 1 [1754] 15:34:36 INFO: [M] Creating process 2 [4614] 15:34:36 INFO: [PO] Started with input 5215785878052641903952977068511001599 [4616] 15:34:36 INFO: [P1] Started with input
```

```
748283119772062608265951220534384001023
[1754]
       15:34:36 INFO: [M]
                                Waiting to join process 2
[4620]
       15:34:36 INFO: [P2]
                                Started with input
949273031776466197045163567568010291199
[4614] 15:34:38 INFO: [P0]
                                Ended with output [479001599,
10888869450418352160768000001]
       15:34:38 INFO: [M]
                                Process 2 joined!
[1754] 15:34:38 INFO: [M]
                                Waiting to join process 2
                                Ended with output [68720001023,
[4616] 15:34:44 INFO: [P1]
10888869450418352160768000001]
[1754] 15:34:44 INFO: [M]
                                Process 2 joined!
[1754] 15:34:44 INFO: [M]
                                Waiting to join process 2
[4620] 15:34:44 INFO: [P2]
                                Ended with output [87178291199,
10888869450418352160768000001]
[1754]
       15:34:44 INFO: [M]
                                Process 2 joined!
[1754] 15:34:44 INFO: [M]
                                DONE!
CPU times: user 38.2 ms, sys: 1.52 ms, total: 39.7 ms
Wall time: 8.85 s
```

Efectivament, l'execució multiprocés del codi de factorització de la llista d'enters és molt més ràpida que la seva versió seqüencial (sempre que s'executi en una màquina amb diversos processadors). Ara, s'estan aprofitant millor els recursos de la màquina, fent servir de manera simultània diverses CPUs.

Observant els resultats de l'exemple anterior, ens podríem preguntar doncs si tots els programes poden beneficiar-se de l'execució multiprocés. Doncs bé, no tots els programes poden reduir el seu temps d'execució amb una implementació multiprocés. En general, per a que un programa o fragment de codi pugui optimitzar-se amb aquesta tècnica caldrà que: * No hi hagi dependència de resultats anteriors. * Els càlculs no s'hagin d'executar en un ordre específic.

Així, l'exemple de la factorització d'un conjunt d'enters és un candidat ideal ja que, d'una banda, les factoritzacions individuals de cada enter no depenen d'altres resultats ni generen resultats dels quals en depenguin altres càlculs i, d'altra banda, són totalment independents entre elles.

4.3 3.3.- Compartició de dades i coordinació de processos

4.3.1 3.3.1.- Variables compartides

Els diferents processos que creem des del nostre codi Python són independents, i no comparteixen l'espai de memòria. Així, si recuperem l'exemple del comptador de factoritzacions que no s'incrementava correctament quan diferents *threads* l'actualitzaven, i l'executem ara fent servir múltiples processos, veurem com el resultat és diferent:

```
factor_ctr = c + 1
    logging.info("[P{}]\tFactor counter is {}".format(p_index, factor_ctr))
    logging.info("[P{}]\tEnded with output {}".format(p_index, r))
factor_ctr = 0
processes = []
for i, num in enumerate(nums_to_factor):
    process = Process(target=get_factors, args=(i, num))
    processes.append(process)
    process.start()
for i, process in enumerate(processes):
    logging.info("[M]\tWaiting to join process {}".format(i))
    process.join()
    logging.info("[M]\tProcess {} joined!".format(i))
logging.info("[M]\tDONE!")
logging.info("[M]\tFactor counter is: {}".format(factor_ctr))
[4629] 15:34:44 INFO: [P0]
                                Started with input
5215785878052641903952977068511001599
[4629] 15:34:44 INFO: [P0]
                                The factor counter is currently 0
[1754] 15:34:44 INFO: [M]
                                Waiting to join process 0
[4632] 15:34:44 INFO: [P1]
                                Started with input
748283119772062608265951220534384001023
[4632] 15:34:45 INFO: [P1]
                                The factor counter is currently 0
[4635] 15:34:44 INFO: [P2]
                                Started with input
949273031776466197045163567568010291199
                                The factor counter is currently 0
[4635] 15:34:45 INFO: [P2]
[4629] 15:34:48 INFO: [P0]
                                Factor counter is 1
[4629] 15:34:48 INFO: [P0]
                                Ended with output [479001599,
10888869450418352160768000001]
[1754] 15:34:48 INFO: [M]
                                Process 0 joined!
                                Waiting to join process 1
[1754] 15:34:48 INFO: [M]
[4632] 15:34:54 INFO: [P1]
                                Factor counter is 1
[4632] 15:34:54 INFO: [P1]
                                Ended with output [68720001023,
10888869450418352160768000001]
[1754] 15:34:54 INFO: [M]
                                Process 1 joined!
[1754] 15:34:54 INFO: [M]
                                Waiting to join process 2
[4635] 15:34:54 INFO: [P2]
                                Factor counter is 1
[4635] 15:34:54 INFO: [P2]
                                Ended with output [87178291199,
10888869450418352160768000001]
[1754] 15:34:54 INFO: [M]
                                Process 2 joined!
[1754] 15:34:54 INFO: [M]
                                DONE!
                                Factor counter is: 0
[1754] 15:34:54 INFO: [M]
```

El recompte de factoritzacions segueix sent erroni (doncs s'han realitzat tres factoritzacions

però el comptador es troba a zero al final de l'execució). Ara bé, a diferència de l'execució *multi-threaded*, el resultat del comptador és zero en comptes d'u. És a dir, sembla que cap dels processos ha pogut actualitzar el comptador.

En efecte, si ens fixem amb la sortida que mostren els processos que executen get_factors, tots ells recuperen el comptador quan està a zero i l'incrementen a u abans de finalitzar la seva execució. Ara bé, aquest increment no es veu reflectit al procés original. Això és així ja que els processos no comparteixen les variables que tenen en memòria i, per tant, la variable factor_ctr del procés original no s'actualitza mai (només s'actualitzen les còpies que té cada un dels processos que executen get_factors).

Així doncs, com podem crear variables compartides entre els diferents processos o bé comunicar processos?

Pel que fa a la creació de variables compartides entre processos, el mòdul multiprocessing ofereix un parell de classes que representen objectes que s'assignen en un espai de memòria compartida entre els diversos processos: Value, que permet emmagatzemar un objecte (un enter, un caràcter, un decimal, un booleà, etc.); i Array, que emmagatzema una llista d'objectes.

Revisitem doncs l'exemple del comptador de factoritzacions, fent servir un Value per a emmagatzemar el valor del comptador:

```
[21]: from multiprocessing import Value
     def get_factors(p_index, value):
         global factor ctr
         logging.info("[P{}]\tStarted with input {}".format(p_index, value))
         c = factor_ctr.value
         logging.info("[P{}]\tThe factor counter is currently {}".format(p_index,_
      →factor_ctr.value))
         r = primefactors(value)
         factor_ctr.value = c + 1
         logging.info("[P{}]\tFactor counter is {}".format(p_index, factor_ctr.
      →value))
         logging.info("[P{}]\tEnded with output {}".format(p_index, r))
     # Creem un comptador fent servir un objecte de tipus Value, indicant
     # que serà un enter ('i') i que s'inicialitzarà a 0
     factor_ctr = Value('i', 0)
     # Crea 3 processos que executen la funció get_factors i
     # els inicia
     processes = []
     for i, num in enumerate(nums_to_factor):
         process = Process(target=get_factors, args=(i, num))
         processes.append(process)
         process.start()
     # Espera a que els 3 processos finalitzin
     for i, process in enumerate(processes):
         logging.info("[M]\tWaiting to join process {}".format(i))
```

```
process.join()
  logging.info("[M]\tProcess {} joined!".format(i))

logging.info("[M]\tDONE!")
logging.info("[M]\tFactor counter is: {}".format(factor_ctr.value))
```

```
15:34:54 INFO: [PO]
                                Started with input
5215785878052641903952977068511001599
Γ4656]
                                The factor counter is currently 0
       15:34:55 INFO: [PO]
[4657]
       15:34:54 INFO: [P1]
                                Started with input
748283119772062608265951220534384001023
                                Waiting to join process 0
[1754]
       15:34:54 INFO: [M]
                                The factor counter is currently 0
Γ4657]
       15:34:55 INFO: [P1]
[4658] 15:34:54 INFO: [P2]
                                Started with input
949273031776466197045163567568010291199
[4658] 15:34:55 INFO: [P2]
                                The factor counter is currently 0
[4656] 15:34:58 INFO: [P0]
                                Factor counter is 1
                                Ended with output [479001599,
[4656]
       15:34:58 INFO: [PO]
10888869450418352160768000001]
[1754]
       15:34:58 INFO: [M]
                                Process 0 joined!
                                Waiting to join process 1
[1754]
       15:34:58 INFO: [M]
                                Factor counter is 1
[4657]
       15:35:05 INFO: [P1]
                                Ended with output [68720001023,
[4657]
       15:35:05 INFO: [P1]
10888869450418352160768000001]
[1754]
       15:35:05 INFO: [M]
                                Process 1 joined!
[1754] 15:35:05 INFO: [M]
                                Waiting to join process 2
[4658]
                                Factor counter is 1
       15:35:05 INFO: [P2]
[4658]
       15:35:05 INFO: [P2]
                                Ended with output [87178291199,
10888869450418352160768000001]
Γ17547
       15:35:05 INFO: [M]
                                Process 2 joined!
[1754] 15:35:05 INFO: [M]
                                DONE!
[1754] 15:35:05 INFO: [M]
                                Factor counter is: 1
```

Efectivament, ara els canvis que estan fent els processos dins de get_factors s'estan reflectint a la variable factor_ctr del procés original: tots els processos llegeixen la variable quan aquesta té un valor de zero i l'incrementen, deixant el valor de la variable a u. Hem aconseguit, doncs, que els diferents processos puguin accedir i escriure a la variable factor_ctr, però el resultat final del comptador segueix sent erroni! De nou, el comptador té el valor final 1, quan hauria de ser 3. Per què obtenim aquest resultat? De nou, ara estem tenint un problema d'interferència de processos, similar al que teníem quan treballàvem amb *threads*. Els tres processos llegeixen factor_ctr quan està a 0 i l'incrementen en una unitat, deixant com a resultat final un 1. La solució passa doncs per fer servir *locks* que controlin l'accés a la variable factor_ctr, de manera anàloga a com ho hem fet amb la versió *multithreaded*:

```
[22]: from multiprocessing import Value

def get_factors(p_index, value):
    global factor_ctr
```

```
logging.info("[P{}]\tStarted with input {}".format(p_index, value))
    with factor_ctr.get_lock():
        c = factor_ctr.value
        logging.info("[P{}]\tThe factor counter is currently {}".
 →format(p_index, factor_ctr.value))
        r = primefactors(value)
        factor ctr.value = c + 1
        logging.info("[P{}]\tFactor counter is {}".format(p index, factor ctr.
 →value))
    logging.info("[P{}]\tEnded with output {}".format(p_index, r))
# Creem un comptador fent servir un objecte de tipus Value, indicant
# que serà un enter ('i') i que s'inicialitzarà a 0
factor_ctr = Value('i', 0)
# Crea 3 processos que executen la funció get_factors i
# els inicia
processes = []
for i, num in enumerate(nums_to_factor):
    process = Process(target=get_factors, args=(i, num))
    processes.append(process)
    process.start()
# Espera a que els 3 processos finalitzin
for i, process in enumerate(processes):
    logging.info("[M]\tWaiting to join process {}".format(i))
    process.join()
    logging.info("[M]\tProcess {} joined!".format(i))
logging.info("[M]\tDONE!")
logging.info("[M]\tFactor counter is: {}".format(factor_ctr.value))
[4683] 15:35:05 INFO: [P0]
                                Started with input
5215785878052641903952977068511001599
[4684] 15:35:05 INFO: [P1]
                                Started with input
748283119772062608265951220534384001023
[1754] 15:35:05 INFO: [M]
                                Waiting to join process 0
[4683] 15:35:05 INFO: [P0]
                                The factor counter is currently 0
[4689] 15:35:05 INFO: [P2]
                                Started with input
949273031776466197045163567568010291199
[4683] 15:35:06 INFO: [P0]
                                Factor counter is 1
[4684] 15:35:06 INFO: [P1]
                                The factor counter is currently 1
[4683] 15:35:06 INFO: [P0]
                                Ended with output [479001599,
10888869450418352160768000001]
[1754] 15:35:06 INFO: [M]
                                Process 0 joined!
[1754] 15:35:06 INFO: [M]
                                Waiting to join process 1
```

```
[4684] 15:35:11 INFO: [P1]
                                Factor counter is 2
[4689] 15:35:11 INFO: [P2]
                                The factor counter is currently 2
[4684]
       15:35:11 INFO: [P1]
                                Ended with output [68720001023,
10888869450418352160768000001]
[1754] 15:35:11 INFO: [M]
                                Process 1 joined!
[1754] 15:35:11 INFO: [M]
                                Waiting to join process 2
                                Factor counter is 3
[4689] 15:35:15 INFO: [P2]
                                Ended with output [87178291199,
[4689] 15:35:15 INFO: [P2]
10888869450418352160768000001]
[1754] 15:35:15 INFO: [M]
                                Process 2 joined!
[1754] 15:35:15 INFO: [M]
                                DONE!
[1754] 15:35:15 INFO: [M]
                                Factor counter is: 3
```

Amb la utilització del *lock*, hem assegurat que els tres processos no s'interferien en l'actualització de la variable, obtenint per tant el resultat esperat.

Per últim, l'actualització del comptador estava dividida en dos passos (lectura i escriptura) i entremig s'executava la factorització en sí. Per tal de millorar l'eficiència del programa, podem executar la factorització abans d'actualitzar el comptador, de manera que els diversos processos no es quedin bloquejats esperant a poder llegir factor_ctr per tal de començar a factoritzar.

Aprofitarem aquesta versió del codi de factorització multiprocés per afegir-hi també un detall important: fins ara, hem escrit els resultats de les factoritzacions al *log*, però no retornàvem aquests valors al procés original! Normalment, els processos destinats al càlcul, retornaran algun valor o valors resultants de la seva tasca. Podem fer servir variables compartides per tal de realitzar el retorn d'aquests valors. Al codi de la celula següent, emmagatzemem els resultats de la factorització en un Array de multiprocessing:

```
[23]: from multiprocessing import Value, Array
     def get_factors(p_index, value, factor_results):
         global factor_ctr
         logging.info("[P{}]\tStarted with input {}".format(p_index, value))
         r = primefactors(value)
         with factor_ctr.get_lock():
             c = factor ctr.value
             logging.info("[P{}]\tThe factor counter is currently {}".
      →format(p_index, factor_ctr.value))
             factor_ctr.value = c + 1
             logging.info("[P{}]\tFactor counter is {}".format(p_index, factor_ctr.
      →value))
         logging.info("[P{}]\tEnded with output {}".format(p_index, r))
         factor_results[2*p_index] = r[0]
         factor_results[2*p_index + 1] = r[1]
     # Creem un comptador fent servir un objecte de tipus Value, indicant
     # que serà un enter ('i') i que s'inicialitzarà a 0
     factor_ctr = Value('i', 0)
     # Creem un array per a emmagatzemar els resultats fent servir
```

```
# un objecte de tipus Array d'enters de 6 posicions
factor_results = Array('i', 6)
# Crea 3 processos que executen la funció get_factors i
# els inicia
processes = []
for i, num in enumerate(nums_to_factor):
    process = Process(target=get_factors, args=(i, num, factor_results))
    processes.append(process)
    process.start()
# Espera a que els 3 processos finalitzin
for i, process in enumerate(processes):
    logging.info("[M]\tWaiting to join process {}".format(i))
    process.join()
    logging.info("[M]\tProcess {} joined!".format(i))
logging.info("[M]\tDONE!")
logging.info("[M]\tFactor counter is: {}".format(factor_ctr.value))
logging.info("[M]\tResults are: {}".format(", ".join([str(f) for f in_
 →factor_results])))
      15:35:16 INFO: [PO]
                                Started with input
5215785878052641903952977068511001599
[1754] 15:35:16 INFO: [M]
                                Waiting to join process 0
[4711] 15:35:16 INFO: [P1]
                                Started with input
748283119772062608265951220534384001023
[4714] 15:35:16 INFO: [P2]
                                Started with input
949273031776466197045163567568010291199
[4710] 15:35:20 INFO: [PO]
                                The factor counter is currently 0
[4710] 15:35:20 INFO: [P0]
                                Factor counter is 1
[4710] 15:35:20 INFO: [P0]
                                Ended with output [479001599,
10888869450418352160768000001
[1754] 15:35:20 INFO: [M]
                                Process 0 joined!
[1754] 15:35:20 INFO: [M]
                                Waiting to join process 1
                                The factor counter is currently 1
[4711] 15:35:26 INFO: [P1]
[4711] 15:35:26 INFO: [P1]
                                Factor counter is 2
[4711] 15:35:26 INFO: [P1]
                                Ended with output [68720001023,
10888869450418352160768000001]
[1754] 15:35:26 INFO: [M]
                                Process 1 joined!
[1754] 15:35:26 INFO: [M]
                                Waiting to join process 2
                                The factor counter is currently 2
[4714] 15:35:26 INFO: [P2]
[4714] 15:35:26 INFO: [P2]
                                Factor counter is 3
[4714] 15:35:26 INFO: [P2]
                                Ended with output [87178291199,
10888869450418352160768000001
[1754] 15:35:26 INFO: [M]
                                Process 2 joined!
[1754] 15:35:26 INFO: [M]
                                DONE!
```

```
[1754] 15:35:26 INFO: [M] Factor counter is: 3
[1754] 15:35:26 INFO: [M] Results are: 479001599, 1484783617, 524287, 1484783617, 1278945279, 1484783617
```

4.3.2 3.3.2.- Comunicació entre processos

Fins ara hem creat diversos processos i els hem assignat una tasca en el moment de la creació: partint d'una llista de números a factoritzar nums_to_factor que contenia tres elements, hem creat tres processos, assignant a cadascun d'ells un dels números a factoritzar. A vegades, però, disposarem d'una llista de tasques molt gran, fins al punt que no podrem crear un procés que s'encarregui de cada tasca individual. Seria el cas, per exemple, de si disposéssim de 10000 números a factoritzar, però la nostra màquina només tingués quatre CPUs. En comptes de crear 10000 processos (una tasca que consumiria ja molts recursos de per sí mateixa i, probablement, deixaria la nostra màquina inusable), ens pot ser d'utilitat crear quatre processos, que es vagin repartint les 10000 tasques. Els processos haurien d'estar coordinats, de manera que no fessin feina duplicada, que no quedés cap tasca per fer, i que cada procés estigués sense feina el mínim temps possible.

En aquests casos, sovint es fa servir una cua per a coordinar les tasques a realitzar pels processos. En primer lloc, es crea una cua de tasques pendents on s'hi dipositen totes les tasques. Després, cada procés obté una tasca de la cua, l'elimina de la cua (per evitar que altres processos la repeteixin) i la realitza. Quan un procés finalitza la seva tasca, obté una nova tasca de la cua. Així, la cua serveix com a element de coordinació dels processos.

A continuació implementarem un programa que factoritza els números d'una llista fent servir cues per a coordinar els diferents processos. En concret, farem servir dues cues: nums_to_factor_q, que contindrà la llista de tasques (els números a factoritzar), i results_q, que emmagatzemarà els resultats de la factorització. Les dues cues seran de tipus diferents: * results_q serà una cua de tipus Queue, que implementa una cua en un espai de memòria compartit entre processos i que és segura d'utilitzar en mode multiprocés. * nums_to_factor_q serà una cua de tipus JoinableQueue, que té les mateixes funcionalitats i característiques que les cues de tipus Queue però, a més, disposa de dos mètodes addicionals. Un mètode task_done que permet informar que una tasca consumida de la cua ja s'ha completat, i un mètode join que bloqueja el procés que l'executa fins que totes les tasques que s'han afegit a la cua s'han completat.

Així, farem servir els mètodes task_done i join per controlar quan ja no hi ha més tasques pendents a realitzar i, aleshores, finalitzarem el programa:

```
# Obtenim la primera tasca
    num_to_factor = nums_to_factor_q.get()
    # Mentre hi haqi tasques pendents, les realitzem
    while num_to_factor:
        logging.info("[P{}]\tStarting to work on {}".format(p_index,__
 →num_to_factor))
        r = primefactors(num_to_factor)
        logging.info("[P{}]\tResult is {}".format(p_index, r))
        # Desem el resultat calculat a la cua results q
        results_q.put(r)
        # Indiquem que hem finalitzat la tasca
        nums_to_factor_q.task_done()
        # Obtenim la propera tasca
        num_to_factor = nums_to_factor_q.get()
    logging.info("[P{}]\tEnding".format(p index))
    # Indiquem que hem finalitzat l'última tasca obtinguda de la cua
    # (que era None, el marcador de final de tasques)
    nums_to_factor_q.task_done()
    logging.info("[P{}]\tProcess ended".format(p index))
def factor_list_multiproc(nums_to_factor, num_processes):
    11 11 11
    Factoritza els números de la llista `nums to factor` fent servir
    `num_processes` processos independents per a factoritzar.
    11 11 11
    # Creem la cua de resultats
    results_q = Queue()
    # Creem la cua de tasques a realitzar
    nums_to_factor_q = JoinableQueue()
    # Afegim els números a factoritzar a la cua de tasques
    for num in nums to factor:
        nums_to_factor_q.put(num)
    # Afeqim un indicador de final de procés al final de la llista
    # de tasques per a cada procés
    for _ in range(num_processes):
        nums_to_factor_q.put(None)
    # Iniciem els `num_processes` processos amb la tasca de factoritzar
    # i passant les cues com a paràmetres
    for i in range(num_processes):
        process = Process(target=get_factors, args=(i, nums_to_factor_q,_
 →results_q))
        process.start()
```

```
# Esperem a que s'haqin completat totes les tasques
         logging.info("[M]\tWaiting to join processes")
         nums_to_factor_q.join()
         logging.info("[M]\tProcesses joined!")
         logging.info("[M]\tResults are:")
         while not results_q.empty():
             logging.info("[M]\t\t{}".format(results_q.get()))
[25]: nums_to_factor = [477643546631018731262664599970076629899298319,
                       5215785878052641903952977068511001599,
                       748283119772062608265951220534384001023,
                       949273031776466197045163567568010291199,
                       135271171171184698288288289641,
                       300600900900930960990990993997,
                       644889984684749173683153159602053,
                       692445348112289650841117535271390418059141,
                       13433008104253584653,
                       13513646451903418921671959,
                       2550675724320679300501540037697253159.
                       16968198807282414331098927405269015833861]
[26]: # Factoritzem els números de la llista `nums_to_factor` fent servir 4
     # processos per a la factorització
     factor_list_multiproc(nums_to_factor, 4)
    [4738] 15:35:26 INFO: [PO]
                                    Started
    [1754] 15:35:26 INFO: [M]
                                    Waiting to join processes [4738] 15:35:26 INFO:
            Starting to work on 477643546631018731262664599970076629899298319
    [PO]
    [4739] 15:35:26 INFO: [P1]
                                    Started
    [4744] 15:35:26 INFO: [P2]
                                    Started
    [4739] 15:35:27 INFO: [P1]
                                     Starting to work on
    5215785878052641903952977068511001599
    [4749] 15:35:27 INFO: [P3]
                                     Started
    [4744] 15:35:27 INFO: [P2]
                                     Starting to work on
    748283119772062608265951220534384001023
    [4749] 15:35:27 INFO: [P3]
                                     Starting to work on
    949273031776466197045163567568010291199
    [4738] 15:35:27 INFO: [P0]
                                     Result is [99990001,
    4776913109852041418248056622882488319]
                                     Starting to work on
    [4738] 15:35:27 INFO: [P0]
    135271171171184698288288289641
    [4738] 15:35:27 INFO: [PO]
                                    Result is [150151, 900900900900990990990991]
    [4738] 15:35:27 INFO: [P0]
                                    Starting to work on
    300600900900930960990990993997
                                     Result is [333667, 90090090090099099099091]
    [4738] 15:35:27 INFO: [PO]
    [4738] 15:35:27 INFO: [PO]
                                     Starting to work on
```

```
644889984684749173683153159602053
[4738] 15:35:27 INFO: [PO]
                                Result is [715827883, 900900900900990990991]
[4738] 15:35:27 INFO: [PO]
                                Starting to work on
692445348112289650841117535271390418059141
[4738] 15:35:27 INFO: [PO]
                                Result is [768614336404564651,
900900900900990990991]
       15:35:27 INFO: [P0]
                                Starting to work on 13433008104253584653
[4738] 15:35:27 INFO: [PO]
                                Result is [2017963, 2474431, 2690201]
                                Starting to work on 13513646451903418921671959
[4738] 15:35:27 INFO: [PO]
                                Result is [1006003, 2017963, 2474431, 2690201]
[4738] 15:35:27 INFO: [P0]
[4738] 15:35:27 INFO: [P0]
                                Starting to work on
2550675724320679300501540037697253159
[4738] 15:35:27 INFO: [PO]
                                Result is [1006003, 2017963, 2474431, 2690201,
188748146801]
[4738] 15:35:27 INFO: [P0]
                                Starting to work on
16968198807282414331098927405269015833861
[4739] 15:35:30 INFO: [P1]
                                Result is [479001599,
10888869450418352160768000001]
[4739] 15:35:30 INFO: [P1]
                                Ending
[4739] 15:35:30 INFO: [P1]
                                Process ended
                                Result is [2017963, 2474431, 2690201,
[4738] 15:35:32 INFO: [PO]
6692367337, 188748146801]
[4738] 15:35:32 INFO: [PO]
                                Ending
                                Process ended
[4738] 15:35:32 INFO: [PO]
[4744] 15:35:38 INFO: [P2]
                                Result is [68720001023,
10888869450418352160768000001]
[4744] 15:35:38 INFO: [P2]
                                Ending
[4744] 15:35:38 INFO: [P2]
                                Process ended
[4749] 15:35:38 INFO: [P3]
                                Result is [87178291199,
10888869450418352160768000001]
[4749] 15:35:38 INFO: [P3]
                                Ending
[1754] 15:35:38 INFO: [M]
                                Processes joined!
[1754] 15:35:38 INFO: [M]
                                Results are:
[1754] 15:35:38 INFO: [M]
                                        [99990001,
4776913109852041418248056622882488319]
[1754] 15:35:38 INFO: [M]
                                        [150151, 900900900900990990990991]
[1754] 15:35:38 INFO: [M]
                                        [333667, 900900900900990990990991]
[1754] 15:35:38 INFO: [M]
                                        [715827883, 900900900900990990990991]
[4749] 15:35:38 INFO: [P3]
                                Process ended
                                        [768614336404564651,
[1754] 15:35:38 INFO: [M]
900900900900990990991]
                                        [2017963, 2474431, 2690201]
[1754] 15:35:38 INFO: [M]
[1754] 15:35:38 INFO: [M]
                                        [1006003, 2017963, 2474431, 2690201]
[1754] 15:35:38 INFO: [M]
                                        [1006003, 2017963, 2474431, 2690201,
188748146801]
[1754] 15:35:38 INFO: [M]
                                        [479001599,
10888869450418352160768000001]
[1754] 15:35:38 INFO: [M]
                                        [2017963, 2474431, 2690201, 6692367337,
```

188748146801]

[1754] 15:35:38 INFO: [M] [68720001023,

10888869450418352160768000001]

[1754] 15:35:38 INFO: [M] [87178291199,

10888869450418352160768000001]

És interessant notar com el fragment de codi anterior realitza tota la sincronització dels processos a partir de la cua nums_to_factor_q. Aquesta cua conté tots els números a factoritzar més un indicador de final per a cada procés. Els processos que factoritzen van obtenint les tasques de la cua cridant al mètode get, i informen de la finalització de cada tasca amb el mètode task_done. Quan ja no queden més números a factoritzar, els processos de factorització recuperen els marcadors de finalització None que s'han afegit a la cua. Això fa que s'acabi l'execució del bucle de treball, i es finalitzi el procés (implícitament, al sortir de la funció get_factors). Noteu com els processos informen també de la finalització de l'última tasca que obtenen (que correspon al valor None), ja que tot i que no comporti feina, des del punt de vista de la cua és una tasca i, per tant, cal finalitzar-la per informar a la cua que no s'hi està treballant. Finalment, el procés principal executa el mètode join de la cua nums_to_factor_q. Noteu com, a diferència dels altres exemples, aquí no cal esperar a la finalització de cada procés de manera individual, ja que la coordinació es fa a través de la cua: quan totes les tasques de la cua s'han acabat, els processos de factorització també hauran finalitzat.

5 4.- Exercicis per practicar

A continuació hi trobareu un conjunt de problemes que us poden servir per a practicar els conceptes explicats en aquesta unitat. Us recomanem que intenteu fer aquests problemes vosaltres mateixos i que, una vegada realitzats, compareu la solució que us proposem amb la vostra solució. No dubteu en adreçar tots els dubtes que sorgeixin de la resolució d'aquests exercicis o bé de les solucions proposades al fòrum de l'aula.

1. En aquesta activitat intentarem veure gràficament si hi ha alguna correlació entre les coordenades geogràfiques d'un país i el número de defuncions per covid-19 que s'hi han reportat. Per fer-ho, farem servir, d'una banda, les dades sobre covid-19 recopilades per l'European Center for Disease Prevention and Control (ECDC) i, d'altra banda, una API externa per a obtenir la localització geogràfica dels països.

L'objectiu de l'activitat és generar un *scatter plot* amb el número de defuncions de cada país del qual en tenim dades i la posició geogràfica d'aquest país:

- Cada punt del *plot* representarà un país.
- Els eixos x i y del *plot* representaran les coordenades geogràfiques del país.
- La mida del punt representarà el número de defuncions.

Les dades de defuncions de cada país es poden obtenir del *dataset* de l'ECDC, que trobareu al fitxer data/COVID-19.csv. Les dades de localització geogràfica de cada país no es troben al *dataset* i caldrà obtenir-les fent servir alguna API externa de geolocalització (podeu triar l'API que vulgueu).

1.1. Implementeu un programa multiprocés que generi l'scatter plot especificat. Per fer-ho, penseu quines tasques poden paralůlelitzar-se, i quines eines podeu fer servir per a coordinar els diferents processos.

```
[27]: # Resposta
```

1.2. Implementeu un programa *multithreaded* que generi l'scatter plot especificat. Per fer-ho, penseu quines tasques poden executar-se en diferents *threads*, i quines eines podeu fer servir per a evitar les interferències entre els *threads*.

```
[28]: # Resposta
```

1.3. Reflexioneu sobre quina de les dues implementacions hauria de ser la més eficient per a resoldre el problema plantejat.

Resposta:

5.1 4.1.- Solucions als exercicis per practicar

1. En aquesta activitat intentarem veure gràficament si hi ha alguna correlació entre les coordenades geogràfiques d'un país i el número de defuncions per covid-19 que s'hi han reportat. Per fer-ho, farem servir, d'una banda, les dades sobre covid-19 recopilades per l'European Center for Disease Prevention and Control (ECDC) i, d'altra banda, una API externa per a obtenir la localització geogràfica dels països.

L'objectiu de l'activitat és generar un *scatter plot* amb el número de defuncions de cada país del qual en tenim dades i la posició geogràfica d'aquest país:

- Cada punt del *plot* representarà un país.
- Els eixos x i y del plot representaran les coordenades geogràfiques del país.
- La mida del punt representarà el número de defuncions.

Les dades de defuncions de cada país es poden obtenir del *dataset* de l'ECDC, que trobareu al fitxer data/COVID-19.csv. Les dades de localització geogràfica de cada país no es troben al *dataset* i caldrà obtenir-les fent servir alguna API externa de geolocalització (podeu triar l'API que vulgueu).

1.1. Implementeu un programa multiprocés que generi l'scatter plot especificat. Per fer-ho, penseu quines tasques poden paralůlelitzar-se, i quines eines podeu fer servir per a coordinar els diferents processos.

```
response = requests.get(base_url.format(country_name, api_key))
        r = response.json()
        lat = r["results"][0]["geometry"]['lat']
        lng = r["results"][0]["geometry"]['lng']
   except Exception as e:
        lat, lng = 0, 0
   return lat, lng
def get_coords_proc(p_index, countries_q, results_q):
    Obté tasques (països dels quals en volem saber les coordenades)
        de la cua `countries_q`, realitza les tasques i desa els
        resultats a la cua `results_q`.
   Finalitza quan ja no hi ha tasques a realitzar.
   logging.info("[P{}]\tStarted".format(p_index))
    # Obtenim la primera tasca
   country = countries q.get()
    # Mentre hi hagi tasques pendents, les realitzem
   while country:
        logging.info("[P{}]\tStarting to work on {}".format(p_index, country))
       r = get geo cords(country)
       logging.info("[P{}]\tResult is {}".format(p_index, r))
        # Desem el resultat a la cua results q
       results_q.put([country, r])
        # Indiquem que hem finalitzat la tasca
       countries_q.task_done()
        # Obtenim la propera tasca
        country = countries_q.get()
   logging.info("[P{}]\tEnding".format(p_index))
    # Indiquem que hem finalitzat l'última tasca obtinguda de la cua
    # (que era None, el marcador de final de tasques)
    countries_q.task_done()
   logging.info("[P{}]\tProcess ended".format(p index))
def get_coords_multiproc(countries, num_processes):
   Obté les coordenades geogràfiques d'una llista de països, fent servir
    `num processes` processos independents per a l'obtenció de les dades.
    # Creem la cua de resultats
```

```
results_q = Queue()
         # Creem la cua de tasques a realitzar
         countries_q = JoinableQueue()
         # Afegim els països a la cua de tasques
         for country in countries:
             countries_q.put(country)
         # Afegim un indicador de final de procés al final de la llista
         # de tasques per a cada procés
         for _ in range(num_processes):
             countries q.put(None)
         # Iniciem els `num_processes` processos amb la tasca d'obtenir
         # les coordenades i passant les cues com a paràmetres
         for i in range(num_processes):
             process = Process(target=get_coords_proc, args=(i, countries_q,_
      →results_q))
             process.start()
         # Esperem a que s'hagin completat totes les tasques
         logging.info("[M]\tWaiting to join processes")
         countries_q.join()
         logging.info("[M]\tProcesses joined!")
         r list = {}
         while not results_q.empty():
             e = results_q.get()
             r_list[e[0]] = e[1]
         return r_list
     def plot_results(deaths_by_country, countries_coords):
         Genera l'scatter plot amb els resultats.
         plt.figure()
         x, y, d = zip(*[(v[0], v[1], deaths_by_country[k])) for k, v in_{\square}
      →countries_coords.items()])
         plt.scatter(x, y, s=d, alpha=0.7)
[30]: %%time
     # Carrequem les dades del fitxer covid-19
     data = pd.read_csv("data/COVID-19.csv")
     # Sumem les defuncions per país
     deaths_by_country = data.groupby(["countriesAndTerritories"])["deaths"].sum()
     # Obtenim les coordenades, paralulelitzant la feina amb 4 processos
```

```
→num_processes=4)
# Mostrem els resultats
plot_results(deaths_by_country, countries_coords)
[4819]
       15:35:39 INFO: [PO]
                                Started
[4819]
       15:35:39 INFO: [PO]
                                Starting to work on Afghanistan
[1754] 15:35:39 INFO: [M]
                                Waiting to join processes
[4822]
       15:35:39 INFO: [P1]
                                Started
       15:35:39 INFO: [P1]
[4822]
                                Starting to work on Albania
[4825]
       15:35:39 INFO: [P2]
                                Started
[4830]
       15:35:39 INFO: [P3]
                                Started
[4825]
       15:35:39 INFO: [P2]
                                Starting to work on Algeria
       15:35:39 INFO: [P3]
                                Starting to work on Andorra
[4830]
[4819]
       15:35:39 INFO: [PO]
                                Result is (33.7680065, 66.2385139)
[4819]
       15:35:39 INFO: [PO]
                                Starting to work on Angola
[4822]
       15:35:39 INFO: [P1]
                                Result is (41.000028, 19.9999619)
[4822]
       15:35:39 INFO: [P1]
                                Starting to work on Anguilla
       15:35:39 INFO: [P2]
                                Result is (28.0000272, 2.9999825)
[4825]
[4825]
       15:35:39 INFO: [P2]
                                Starting to work on Antigua_and_Barbuda
[4830]
       15:35:39 INFO: [P3]
                                Result is (42.5407167, 1.5732033)
[4830]
       15:35:39 INFO: [P3]
                                Starting to work on Argentina
       15:35:40 INFO: [PO]
                                Result is (-11.8775768, 17.5691241)
Г48197
[4825]
       15:35:40 INFO: [P2]
                                Result is (17.05, -61.8)
       15:35:40 INFO: [P2]
[4825]
                                Starting to work on Aruba
[4819]
       15:35:40 INFO: [PO]
                                Starting to work on Armenia
[4822]
       15:35:40 INFO: [P1]
                                Result is (18.1954947, -63.0750234)
[4822]
       15:35:40 INFO: [P1]
                                Starting to work on Australia
       15:35:40 INFO: [P3]
                                Result is (-34.9964963, -64.9672817)
[4830]
[4830]
       15:35:40 INFO: [P3]
                                Starting to work on Austria
[4819]
       15:35:40 INFO: [PO]
                                Result is (40.7696272, 44.6736646)
       15:35:40 INFO: [PO]
[4819]
                                Starting to work on Azerbaijan
       15:35:40 INFO: [P2]
                                Result is (12.4902998, -69.9609842)
[4825]
[4825]
       15:35:40 INFO: [P2]
                                Starting to work on Bahamas
[4830]
       15:35:40 INFO: [P3]
                                Result is (47.2000338, 13.199959)
[4830]
       15:35:40 INFO: [P3]
                                Starting to work on Bahrain
[4822]
       15:35:40 INFO: [P1]
                                Result is (-24.7761086, 134.755)
[4822]
       15:35:40 INFO: [P1]
                                Starting to work on Bangladesh
[4819]
       15:35:41 INFO: [PO]
                                Result is (40.3936294, 47.7872508)
       15:35:41 INFO: [PO]
                                Starting to work on Barbados
[4819]
       15:35:41 INFO: [P2]
                                Result is (24.7736546, -78.0000547)
[4825]
[4825]
       15:35:41 INFO: [P2]
                                Starting to work on Belarus
[4822]
       15:35:41 INFO: [P1]
                                Result is (24.4768783, 90.2932426)
[4822]
       15:35:41 INFO: [P1]
                                Starting to work on Belgium
[4830] 15:35:41 INFO: [P3]
                                Result is (26.1551249, 50.5344606)
[4830]
       15:35:41 INFO: [P3]
                                Starting to work on Belize
[4819] 15:35:41 INFO: [PO]
                                Result is (13.1500331, -59.5250305)
```

countries_coords = get_coords_multiproc(deaths_by_country.index,_

```
[4819]
       15:35:41 INFO: [PO]
                                Starting to work on Benin
[4825] 15:35:41 INFO: [P2]
                                Result is (53.4250605, 27.6971358)
[4825]
       15:35:41 INFO: [P2]
                                Starting to work on Bermuda
       15:35:41 INFO: [P3]
                                Result is (16.8259793, -88.7600927)
[4830]
Γ4830]
       15:35:41 INFO: [P3]
                                Starting to work on Bhutan
[4819]
       15:35:42 INFO: [PO]
                                Result is (9.5293472, 2.2584408)
[4819]
       15:35:42 INFO: [PO]
                                Starting to work on Bolivia
[4825]
       15:35:42 INFO: [P2]
                                Result is (32.3018217, -64.7603583)
                                Starting to work on Bonaire, Saint Eustatius and
[4825] 15:35:42 INFO: [P2]
Saba
[4830] 15:35:42 INFO: [P3]
                                Result is (27.549511, 90.5119273)
       15:35:42 INFO: [P3]
[4830]
                                Starting to work on Bosnia_and_Herzegovina
                                Result is (50.6402809, 4.6667145)
[4822]
       15:35:42 INFO: [P1]
[4822]
       15:35:42 INFO: [P1]
                                Starting to work on Botswana
                                Result is (-17.0568696, -64.9912286)
[4819]
       15:35:42 INFO: [PO]
       15:35:42 INFO: [PO]
                                Starting to work on Brazil
[4819]
[4830]
       15:35:42 INFO: [P3]
                                Result is (44.25, 17.83333)
[4830]
       15:35:42 INFO: [P3]
                                Starting to work on British_Virgin_Islands
[4822]
       15:35:42 INFO: [P1]
                                Result is (-23.1681782, 24.5928742)
[4822]
       15:35:42 INFO: [P1]
                                Starting to work on Brunei Darussalam
                                Result is (18.5, -64.5)
[4830]
       15:35:42 INFO: [P3]
                                Starting to work on Bulgaria
[4830]
       15:35:42 INFO: [P3]
[4819] 15:35:42 INFO: [P0]
                                Result is (-10.3333333, -53.2)
       15:35:42 INFO: [PO]
                                Starting to work on Burkina_Faso
[4819]
[4825] 15:35:43 INFO: [P2]
                                Result is (12.167, -68.2909614)
[4825]
       15:35:43 INFO: [P2]
                                Starting to work on Burundi
[4822]
       15:35:43 INFO: [P1]
                                Result is (4.5, 114.66667)
[4822]
       15:35:43 INFO: [P1]
                                Starting to work on Cambodia
       15:35:43 INFO: [P3]
                                Result is (42.6073975, 25.4856617)
[4830]
[4830]
       15:35:43 INFO: [P3]
                                Starting to work on Cameroon
[4819]
       15:35:43 INFO: [PO]
                                Result is (12.0753083, -1.6880314)
[4819]
       15:35:43 INFO: [PO]
                                Starting to work on Canada
[4825]
       15:35:43 INFO: [P2]
                                Result is (-3.3634357, 29.8870575)
[4825]
       15:35:43 INFO: [P2]
                                Starting to work on Cape_Verde
                                Result is (4.6125522, 13.1535811)
[4830]
       15:35:43 INFO: [P3]
[4830] 15:35:43 INFO: [P3]
                                Starting to work on
Cases on an international conveyance Japan
[4825] 15:35:43 INFO: [P2]
                                Result is (16.0, -24.0)
[4825] 15:35:43 INFO: [P2]
                                Starting to work on Cayman_Islands
[4819] 15:35:43 INFO: [P0]
                                Result is (61.0666922, -107.9917071)
[4819] 15:35:43 INFO: [P0]
                                Starting to work on Central_African_Republic
       15:35:43 INFO: [P1]
                                Result is (13.5066394, 104.869423)
[4822]
[4822]
       15:35:43 INFO: [P1]
                                Starting to work on Chad
[4825]
       15:35:44 INFO: [P2]
                                Result is (19.5, -80.66667)
[4825]
       15:35:44 INFO: [P2]
                                Starting to work on Chile
[4819]
       15:35:44 INFO: [PO]
                                Result is (7.0, 21.0)
[4819] 15:35:44 INFO: [PO]
                                Starting to work on China
[4822] 15:35:44 INFO: [P1]
                                Result is (15.6134137, 19.0156172)
```

```
[4822]
       15:35:44 INFO: [P1]
                                 Starting to work on Colombia
[4819] 15:35:44 INFO: [P0]
                                 Result is (35.000074, 104.999927)
[4819]
       15:35:44 INFO: [PO]
                                 Starting to work on Comoros
       15:35:44 INFO: [P2]
                                 Result is (-31.7613365, -71.3187697)
[4825]
[4825]
       15:35:44 INFO: [P2]
                                 Starting to work on Congo
[4822]
                                 Result is (2.8894434, -73.783892)
       15:35:44 INFO: [P1]
[4822]
       15:35:44 INFO: [P1]
                                 Starting to work on Costa Rica
[4830]
       15:35:44 INFO: [P3]
                                 Result is (35.68536, 139.75309)
                                 Starting to work on Cote dIvoire
[4830]
       15:35:44 INFO: [P3]
[4830]
       15:35:45 INFO: [P3]
                                 Result is (8.0, -5.5)
[4830]
       15:35:45 INFO: [P3]
                                 Starting to work on Croatia
                                 Result is (-0.7264327, 15.6419155)
[4825]
       15:35:45 INFO: [P2]
[4825]
       15:35:45 INFO: [P2]
                                 Starting to work on Cuba
[4822]
       15:35:45 INFO: [P1]
                                 Result is (45.8302419, 10.2568862)
[4822]
       15:35:45 INFO: [P1]
                                 Starting to work on CuraÃğao
       15:35:45 INFO: [P1]
[4822]
                                 Result is (0, 0)
[4822]
       15:35:45 INFO: [P1]
                                 Starting to work on Cyprus
       15:35:45 INFO: [PO]
                                 Result is (-12.2045176, 44.2832964)
[4819]
       15:35:45 INFO: [PO]
                                 Starting to work on Czechia
[4819]
[4825]
       15:35:45 INFO: [P2]
                                 Result is (23.0131338, -80.8328748)
[4830]
       15:35:45 INFO: [P3]
                                 Result is (45.5643442, 17.0118954)
[4825]
       15:35:45 INFO: [P2]
                                 Starting to work on
Democratic_Republic_of_the_Congo
       15:35:45 INFO: [P3]
[4830]
                                 Starting to work on Denmark
[4819] 15:35:45 INFO: [P0]
                                 Result is (49.8167003, 15.4749544)
[4819]
       15:35:45 INFO: [PO]
                                 Starting to work on Djibouti
       15:35:45 INFO: [P2]
                                 Result is (-2.5, 23.5)
[4825]
[4825]
       15:35:45 INFO: [P2]
                                 Starting to work on Dominica
       15:35:46 INFO: [P3]
                                 Result is (55.670249, 10.3333283)
[4830]
[4830]
       15:35:46 INFO: [P3]
                                 Starting to work on Dominican_Republic
[4819]
       15:35:46 INFO: [PO]
                                 Result is (11.8145966, 42.8453061)
[4819]
       15:35:46 INFO: [PO]
                                 Starting to work on Ecuador
[4825]
       15:35:46 INFO: [P2]
                                 Result is (19.0974031, -70.3028026)
[4825]
       15:35:46 INFO: [P2]
                                 Starting to work on Egypt
                                 Result is (34.9823018, 33.1451285)
[4822]
       15:35:46 INFO: [P1]
[4822]
        15:35:46 INFO: [P1]
                                 Starting to work on El Salvador
[4819]
       15:35:46 INFO: [PO]
                                 Result is (-1.3397668, -79.3666965)
[4819]
       15:35:46 INFO: [PO]
                                 Starting to work on Equatorial_Guinea
       15:35:46 INFO: [P2]
                                 Result is (26.2540493, 29.2675469)
[4825]
[4825]
       15:35:46 INFO: [P2]
                                 Starting to work on Eritrea
                                 Result is (10.4975281, 124.03134)
[4822]
       15:35:46 INFO: [P1]
       15:35:46 INFO: [P1]
[4822]
                                 Starting to work on Estonia
       15:35:46 INFO: [P3]
                                 Result is (19.0, -70.66667)
[4830]
[4830]
       15:35:46 INFO: [P3]
                                 Starting to work on Eswatini
[4819]
       15:35:47 INFO: [PO]
                                 Result is (1.613172, 10.5170357)
[4819]
       15:35:47 INFO: [PO]
                                 Starting to work on Ethiopia
[4825]
       15:35:47 INFO: [P2]
                                 Result is (15.9500319, 37.9999668)
[4825] 15:35:47 INFO: [P2]
                                 Starting to work on Falkland_Islands_(Malvinas)
```

```
[4830]
       15:35:47 INFO: [P3]
                                 Result is (-26.5624806, 31.3991317)
[4830]
       15:35:47 INFO: [P3]
                                 Starting to work on Faroe_Islands
[4822]
       15:35:47 INFO: [P1]
                                 Result is (58.7523778, 25.3319078)
[4822]
       15:35:47 INFO: [P1]
                                 Starting to work on Fiji
                                 Result is (-51.75, -59.16667)
[4825]
       15:35:47 INFO: [P2]
[4825]
       15:35:47 INFO: [P2]
                                 Starting to work on Finland
[4819]
       15:35:47 INFO: [PO]
                                 Result is (10.2116702, 38.6521203)
[4819]
       15:35:47 INFO: [PO]
                                 Starting to work on France
                                 Result is (62.0, -7.0)
[4830]
       15:35:47 INFO: [P3]
[4830]
       15:35:47 INFO: [P3]
                                 Starting to work on French_Polynesia
       15:35:47 INFO: [P1]
                                 Result is (-18.1239696, 179.0122737)
[4822]
       15:35:47 INFO: [P1]
                                 Starting to work on Gabon
[4822]
                                 Result is (63.2467777, 25.9209164)
[4825]
       15:35:47 INFO: [P2]
       15:35:47 INFO: [P2]
                                 Starting to work on Gambia
[4825]
[4819]
       15:35:47 INFO: [PO]
                                 Result is (46.603354, 1.8883335)
[4819]
       15:35:48 INFO: [P0]
                                 Starting to work on Georgia
[4822]
       15:35:48 INFO: [P1]
                                 Result is (-0.8999695, 11.6899699)
[4822]
       15:35:48 INFO: [P1]
                                 Starting to work on Germany
[4825]
       15:35:48 INFO: [P2]
                                 Result is (13.470062, -15.4900464)
[4825]
       15:35:48 INFO: [P2]
                                 Starting to work on Ghana
                                 Result is (-15.0, -140.0)
[4830]
       15:35:48 INFO: [P3]
[4830]
       15:35:48 INFO: [P3]
                                 Starting to work on Gibraltar
[4819]
       15:35:48 INFO: [PO]
                                 Result is (41.6809707, 44.0287382)
[4819]
       15:35:48 INFO: [PO]
                                 Starting to work on Greece
[4822]
       15:35:48 INFO: [P1]
                                 Result is (51.0834196, 10.4234469)
[4822]
       15:35:48 INFO: [P1]
                                 Starting to work on Greenland
[4825]
       15:35:48 INFO: [P2]
                                 Result is (8.0300284, -1.0800271)
[4825]
       15:35:48 INFO: [P2]
                                 Starting to work on Grenada
       15:35:49 INFO: [P3]
                                 Result is (36.106747, -5.3352772)
[4830]
[4830]
       15:35:49 INFO: [P3]
                                 Starting to work on Guam
[4819]
       15:35:49 INFO: [PO]
                                 Result is (38.9953683, 21.9877132)
[4819]
       15:35:49 INFO: [PO]
                                 Starting to work on Guatemala
[4822]
       15:35:49 INFO: [P1]
                                 Result is (77.6192349, -42.8125967)
[4822]
       15:35:49 INFO: [P1]
                                 Starting to work on Guernsey
       15:35:49 INFO: [P2]
                                 Result is (12.1360374, -61.6904045)
[4825]
[4825]
       15:35:49 INFO: [P2]
                                 Starting to work on Guinea
[4819]
       15:35:49 INFO: [PO]
                                 Result is (15.6356088, -89.8988087)
[4819]
       15:35:49 INFO: [PO]
                                 Starting to work on Guinea Bissau
       15:35:49 INFO: [P3]
                                 Result is (13.4501257, 144.757551)
[4830]
[4830]
       15:35:49 INFO: [P3]
                                 Starting to work on Guyana
[4822]
       15:35:49 INFO: [P1]
                                 Result is (49.5795202, -2.5290434)
       15:35:49 INFO: [P1]
                                 Starting to work on Haiti
[4822]
[4819]
       15:35:49 INFO: [PO]
                                 Result is (12.0, -15.0)
[4825]
       15:35:49 INFO: [P2]
                                 Result is (10.7226226, -10.7083587)
[4819]
       15:35:49 INFO: [PO]
                                 Starting to work on Holy_See
[4825]
       15:35:49 INFO: [P2]
                                 Starting to work on Honduras
[4830]
       15:35:50 INFO: [P3]
                                 Result is (4.8417097, -58.6416891)
[4830] 15:35:50 INFO: [P3]
                                 Starting to work on Hungary
```

```
[4822]
       15:35:50 INFO: [P1]
                                 Result is (19.1399952, -72.3570972)
[4822]
       15:35:50 INFO: [P1]
                                 Starting to work on Iceland
[4819]
       15:35:50 INFO: [PO]
                                 Result is (41.90225, 12.4533)
       15:35:50 INFO: [P0]
                                 Starting to work on India
[4819]
                                 Result is (15.2572432, -86.0755145)
[4825]
       15:35:50 INFO: [P2]
[4825]
        15:35:50 INFO: [P2]
                                 Starting to work on Indonesia
[4830]
       15:35:50 INFO: [P3]
                                 Result is (47.1817585, 19.5060937)
[4830]
       15:35:50 INFO: [P3]
                                 Starting to work on Iran
[4819]
       15:35:50 INFO: [PO]
                                 Result is (22.3511148, 78.6677428)
[4819]
       15:35:50 INFO: [PO]
                                 Starting to work on Iraq
                                 Result is (-2.4833826, 117.8902853)
[4825]
       15:35:50 INFO: [P2]
[4825]
       15:35:50 INFO: [P2]
                                 Starting to work on Ireland
                                 Result is (32.6475314, 54.5643516)
[4830]
       15:35:50 INFO: [P3]
[4830]
       15:35:50 INFO: [P3]
                                 Starting to work on Isle_of_Man
[4819]
       15:35:51 INFO: [PO]
                                 Result is (33.0955793, 44.1749775)
[4819]
       15:35:51 INFO: [PO]
                                 Starting to work on Israel
[4830]
       15:35:51 INFO: [P3]
                                 Result is (54.1714196, -4.4958104)
[4830]
       15:35:51 INFO: [P3]
                                 Starting to work on Italy
[4825]
       15:35:51 INFO: [P2]
                                 Result is (52.865196, -7.9794599)
[4825]
       15:35:51 INFO: [P2]
                                 Starting to work on Jamaica
[4822]
       15:35:51 INFO: [P1]
                                 Result is (64.9841821, -18.1059013)
[4822]
        15:35:51 INFO: [P1]
                                 Starting to work on Japan
[4819]
       15:35:51 INFO: [PO]
                                 Result is (31.5313113, 34.8667654)
       15:35:51 INFO: [PO]
[4819]
                                 Starting to work on Jersey
[4825]
       15:35:51 INFO: [P2]
                                 Result is (18.1152958, -77.1598455)
[4825]
       15:35:51 INFO: [P2]
                                 Starting to work on Jordan
       15:35:51 INFO: [P3]
                                 Result is (42.6384261, 12.674297)
[4830]
[4830]
       15:35:51 INFO: [P3]
                                 Starting to work on Kazakhstan
       15:35:51 INFO: [P1]
                                 Result is (36.5748441, 139.2394179)
[4822]
[4822]
       15:35:51 INFO: [P1]
                                 Starting to work on Kenya
       15:35:51 INFO: [PO]
[4819]
                                 Result is (49.2123066, -2.1256)
[4819]
       15:35:51 INFO: [PO]
                                 Starting to work on Kosovo
[4830]
       15:35:52 INFO: [P3]
                                 Result is (47.2286086, 65.2093197)
[4830]
       15:35:52 INFO: [P3]
                                 Starting to work on Kuwait
                                 Result is (1.4419683, 38.4313975)
[4822]
       15:35:52 INFO: [P1]
[4822]
        15:35:52 INFO: [P1]
                                 Starting to work on Kyrgyzstan
[4819]
       15:35:52 INFO: [P0]
                                 Result is (42.5869578, 20.9021231)
[4819]
       15:35:52 INFO: [P0]
                                 Starting to work on Laos
                                 Result is (41.5089324, 74.724091)
[4822]
       15:35:52 INFO: [P1]
[4822]
       15:35:52 INFO: [P1]
                                 Starting to work on Latvia
[4830]
       15:35:52 INFO: [P3]
                                 Result is (29.2733964, 47.4979476)
       15:35:52 INFO: [P3]
[4830]
                                 Starting to work on Lebanon
[4825]
        15:35:52 INFO: [P2]
                                 Result is (31.1667049, 36.941628)
[4825]
       15:35:52 INFO: [P2]
                                 Starting to work on Liberia
[4819]
       15:35:52 INFO: [PO]
                                 Result is (20.0171109, 103.378253)
[4819]
       15:35:52 INFO: [P0]
                                 Starting to work on Libya
[4822]
       15:35:52 INFO: [P1]
                                 Result is (56.8406494, 24.7537645)
[4822] 15:35:52 INFO: [P1]
                                 Starting to work on Liechtenstein
```

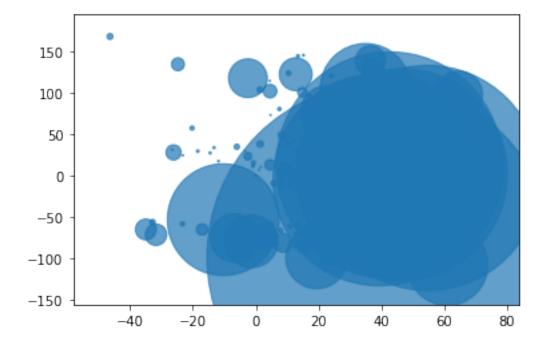
```
[4830]
       15:35:53 INFO: [P3]
                                 Result is (33.8750629, 35.843409)
[4830]
       15:35:53 INFO: [P3]
                                 Starting to work on Lithuania
[4819]
       15:35:53 INFO: [PO]
                                 Result is (26.8234472, 18.1236723)
        15:35:53 INFO: [P0]
                                 Starting to work on Luxembourg
[4819]
                                 Result is (5.7499721, -9.3658524)
[4825]
        15:35:53 INFO: [P2]
[4825]
        15:35:53 INFO: [P2]
                                 Starting to work on Madagascar
[4822]
       15:35:53 INFO: [P1]
                                 Result is (47.1416307, 9.5531527)
[4830]
        15:35:53 INFO: [P3]
                                 Result is (55.3500003, 23.7499997)
[4822]
       15:35:53 INFO: [P1]
                                 Starting to work on Malaysia
[4830]
       15:35:53 INFO: [P3]
                                 Starting to work on Malawi
                                 Result is (49.8158683, 6.1296751)
[4819]
        15:35:53 INFO: [PO]
[4819]
       15:35:53 INFO: [PO]
                                 Starting to work on Maldives
[4825]
        15:35:53 INFO: [P2]
                                 Result is (-18.9249604, 46.4416422)
[4825]
       15:35:53 INFO: [P2]
                                 Starting to work on Mali
[4822]
        15:35:53 INFO: [P1]
                                 Result is (4.5693754, 102.2656823)
       15:35:53 INFO: [P1]
[4822]
                                 Starting to work on Malta
[4830]
       15:35:54 INFO: [P3]
                                 Result is (-13.2687204, 33.9301963)
[4830]
       15:35:54 INFO: [P3]
                                 Starting to work on Mauritania
[4825]
       15:35:54 INFO: [P2]
                                 Result is (16.3700359, -2.2900239)
[4825]
        15:35:54 INFO: [P2]
                                 Starting to work on Mauritius
                                 Result is (35.8885993, 14.4476911)
[4822]
        15:35:54 INFO: [P1]
[4822]
        15:35:54 INFO: [P1]
                                 Starting to work on Mexico
[4819]
       15:35:54 INFO: [PO]
                                 Result is (4.7064352, 73.3287853)
       15:35:54 INFO: [PO]
[4819]
                                 Starting to work on Moldova
[4830]
       15:35:54 INFO: [P3]
                                 Result is (20.2540382, -9.2399263)
[4830]
       15:35:54 INFO: [P3]
                                 Starting to work on Monaco
       15:35:54 INFO: [P2]
                                 Result is (-20.2759451, 57.5703566)
[4825]
[4825]
       15:35:54 INFO: [P2]
                                 Starting to work on Mongolia
        15:35:54 INFO: [P1]
                                 Result is (19.4326296, -99.1331785)
[4822]
[4822]
       15:35:54 INFO: [P1]
                                 Starting to work on Montenegro
[4819]
       15:35:54 INFO: [PO]
                                 Result is (47.2879608, 28.5670941)
[4819]
       15:35:54 INFO: [PO]
                                 Starting to work on Montserrat
[4830]
       15:35:54 INFO: [P3]
                                 Result is (43.738449, 7.4242241)
[4830]
       15:35:54 INFO: [P3]
                                 Starting to work on Morocco
                                 Result is (46.8250388, 103.8499736)
[4825]
       15:35:55 INFO: [P2]
[4825]
        15:35:55 INFO: [P2]
                                 Starting to work on Mozambique
[4822]
       15:35:55 INFO: [P1]
                                 Result is (42.9868853, 19.5180992)
Γ4822
        15:35:55 INFO: [P1]
                                 Starting to work on Myanmar
       15:35:55 INFO: [P0]
                                 Result is (16.7417041, -62.1916844)
[4819]
[4819]
       15:35:55 INFO: [PO]
                                 Starting to work on Namibia
                                 Result is (31.1728205, -7.3362482)
[4830]
       15:35:55 INFO: [P3]
       15:35:55 INFO: [P3]
                                 Starting to work on Nepal
[4830]
[4825]
        15:35:55 INFO: [P2]
                                 Result is (-19.302233, 34.9144977)
[4825]
       15:35:55 INFO: [P2]
                                 Starting to work on Netherlands
[4819]
       15:35:55 INFO: [PO]
                                 Result is (-23.2335499, 17.3231107)
[4819]
       15:35:55 INFO: [PO]
                                 Starting to work on New_Caledonia
[4822]
       15:35:55 INFO: [P1]
                                 Result is (17.1750495, 95.9999652)
[4822] 15:35:55 INFO: [P1]
                                 Starting to work on New_Zealand
```

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[4819]
       15:35:55 INFO: [PO]
                                 Result is (-21.5, 165.5)
[4819]
       15:35:56 INFO: [PO]
                                 Starting to work on Nicaragua
[4830]
       15:35:56 INFO: [P3]
                                 Result is (28.1083929, 84.0917139)
        15:35:56 INFO: [P3]
                                 Starting to work on Niger
[4830]
                                 Result is (-46.4108596, 168.3516142)
[4822]
        15:35:56 INFO: [P1]
[4822]
        15:35:56 INFO: [P1]
                                 Starting to work on Nigeria
[4825]
       15:35:56 INFO: [P2]
                                 Result is (52.5001698, 5.7480821)
                                 Starting to work on North_Macedonia
[4825]
        15:35:56 INFO: [P2]
                                 Result is (12.6090157, -85.2936911)
[4819]
       15:35:56 INFO: [PO]
[4819]
       15:35:56 INFO: [PO]
                                 Starting to work on Northern_Mariana_Islands
       15:35:56 INFO: [P2]
                                 Result is (41.66667, 21.75)
[4825]
[4825]
       15:35:56 INFO: [P2]
                                 Starting to work on Norway
[4830]
       15:35:56 INFO: [P3]
                                 Result is (17.7356214, 9.3238432)
       15:35:56 INFO: [P3]
[4830]
                                 Starting to work on Oman
[4822]
       15:35:56 INFO: [P1]
                                 Result is (9.6000359, 7.9999721)
       15:35:56 INFO: [P1]
[4822]
                                 Starting to work on Pakistan
[4819]
       15:35:56 INFO: [PO]
                                 Result is (15.214, 145.756)
[4819]
       15:35:56 INFO: [PO]
                                 Starting to work on Palestine
[4825]
       15:35:56 INFO: [P2]
                                 Result is (64.5731537, 11.5280364)
[4825]
       15:35:56 INFO: [P2]
                                 Starting to work on Panama
                                 Result is (21.0000287, 57.0036901)
[4830]
       15:35:56 INFO: [P3]
[4830]
       15:35:56 INFO: [P3]
                                 Starting to work on Papua New Guinea
[4822]
       15:35:57 INFO: [P1]
                                 Result is (30.3308401, 71.247499)
       15:35:57 INFO: [P1]
[4822]
                                 Starting to work on Paraguay
[4830]
       15:35:57 INFO: [P3]
                                 Result is (-6.0, 147.0)
[4830]
       15:35:57 INFO: [P3]
                                 Starting to work on Peru
[4819]
       15:35:57 INFO: [PO]
                                 Result is (31.7621153, -95.6307891)
[4819]
       15:35:57 INFO: [PO]
                                 Starting to work on Philippines
       15:35:57 INFO: [P2]
                                 Result is (8.559559, -81.1308434)
[4825]
[4825]
       15:35:57 INFO: [P2]
                                 Starting to work on Poland
       15:35:57 INFO: [P1]
[4822]
                                 Result is (-23.3165935, -58.1693445)
[4822]
       15:35:57 INFO: [P1]
                                 Starting to work on Portugal
[4819]
       15:35:57 INFO: [PO]
                                 Result is (12.7503486, 122.7312101)
[4819]
       15:35:57 INFO: [PO]
                                 Starting to work on Puerto_Rico
       15:35:57 INFO: [P3]
                                 Result is (-6.8699697, -75.0458515)
[4830]
[4830]
        15:35:57 INFO: [P3]
                                 Starting to work on Qatar
[4825]
       15:35:57 INFO: [P2]
                                 Result is (52.215933, 19.134422)
[4825]
       15:35:57 INFO: [P2]
                                 Starting to work on Romania
       15:35:57 INFO: [P1]
                                 Result is (40.0332629, -7.8896263)
[4822]
[4822]
       15:35:57 INFO: [P1]
                                 Starting to work on Russia
       15:35:58 INFO: [PO]
                                 Result is (22.9109866, -98.0759194)
[4819]
       15:35:58 INFO: [P0]
                                 Starting to work on Rwanda
[4819]
        15:35:58 INFO: [P3]
                                 Result is (25.3336984, 51.2295295)
[4830]
[4830]
       15:35:58 INFO: [P3]
                                 Starting to work on Saint_Kitts_and_Nevis
[4825]
       15:35:58 INFO: [P2]
                                 Result is (45.9852129, 24.6859225)
                                 Starting to work on Saint_Lucia
[4825]
       15:35:58 INFO: [P2]
[4822]
       15:35:58 INFO: [P1]
                                 Result is (64.6863136, 97.7453061)
[4819] 15:35:58 INFO: [P0]
                                 Result is (-1.9646631, 30.0644358)
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[4822] 15:35:58 INFO: [P1]
                                 Starting to work on
Saint_Vincent_and_the_Grenadines
[4819]
       15:35:58 INFO: [PO]
                                 Starting to work on San_Marino
       15:35:58 INFO: [P3]
                                 Result is (17.33333, -62.75)
[4830]
                                 Starting to work on Sao Tome and Principe
Г48301
       15:35:58 INFO: [P3]
[4825]
                                 Result is (-27.5, 153.0)
       15:35:58 INFO: [P2]
[4825]
       15:35:58 INFO: [P2]
                                 Starting to work on Saudi_Arabia
[4822]
       15:35:58 INFO: [P1]
                                 Result is (13.08333, -61.2)
[4822]
       15:35:58 INFO: [P1]
                                 Starting to work on Senegal
[4819]
       15:35:58 INFO: [PO]
                                 Result is (43.9458623, 12.458306)
                                 Result is (1.0, 7.0)
[4830]
       15:35:58 INFO: [P3]
[4830]
       15:35:58 INFO: [P3]
                                 Starting to work on Seychelles
[4819]
       15:35:58 INFO: [PO]
                                 Starting to work on Serbia
[4825]
       15:35:58 INFO: [P2]
                                 Result is (25.0, 45.0)
                                 Starting to work on Sierra_Leone
[4825]
       15:35:58 INFO: [P2]
       15:35:59 INFO: [P1]
[4822]
                                 Result is (14.4750607, -14.4529612)
[4822]
       15:35:59 INFO: [P1]
                                 Starting to work on Singapore
[4830]
       15:35:59 INFO: [P3]
                                 Result is (-4.6574977, 55.4540146)
[4825]
       15:35:59 INFO: [P2]
                                 Result is (8.5, -11.5)
[4830]
       15:35:59 INFO: [P3]
                                 Starting to work on Sint Maarten
[4825]
       15:35:59 INFO: [P2]
                                 Starting to work on Slovakia
[4819]
       15:35:59 INFO: [PO]
                                 Result is (44.0243228, 21.0765743)
[4819]
       15:35:59 INFO: [PO]
                                 Starting to work on Slovenia
       15:35:59 INFO: [P3]
                                 Result is (18.04167, -63.06667)
[4830]
[4830]
       15:35:59 INFO: [P3]
                                 Starting to work on Somalia
[4825]
       15:35:59 INFO: [P2]
                                 Result is (48.7411522, 19.4528646)
       15:35:59 INFO: [P2]
                                 Starting to work on South_Africa
[4825]
[4822]
       15:35:59 INFO: [P1]
                                 Result is (1.340863, 103.8303918)
       15:35:59 INFO: [P1]
[4822]
                                 Starting to work on South Korea
[4819]
       15:35:59 INFO: [PO]
                                 Result is (45.8133113, 14.4808369)
[4819]
       15:35:59 INFO: [P0]
                                 Starting to work on South_Sudan
[4825]
       15:36:00 INFO: [P2]
                                 Result is (-26.1694437, 28.1940846)
[4825]
       15:36:00 INFO: [P2]
                                 Starting to work on Spain
[4830]
       15:36:00 INFO: [P3]
                                 Result is (8.3676771, 49.083416)
[4830]
       15:36:00 INFO: [P3]
                                 Starting to work on Sri Lanka
[4822]
        15:36:00 INFO: [P1]
                                 Result is (37.320906, 127.102115)
[4822]
       15:36:00 INFO: [P1]
                                 Starting to work on Sudan
[4819]
       15:36:00 INFO: [P0]
                                 Result is (7.5, 30.0)
       15:36:00 INFO: [P0]
[4819]
                                 Starting to work on Suriname
[4830]
       15:36:00 INFO: [P3]
                                 Result is (7.5554942, 80.7137847)
[4830]
       15:36:00 INFO: [P3]
                                 Starting to work on Sweden
       15:36:00 INFO: [P2]
                                 Result is (39.3262345, -4.8380649)
[4825]
[4825]
        15:36:00 INFO: [P2]
                                 Starting to work on Switzerland
[4822]
       15:36:00 INFO: [P1]
                                 Result is (14.5844444, 29.4917691)
[4822]
       15:36:00 INFO: [P1]
                                 Starting to work on Syria
[4819]
       15:36:00 INFO: [P0]
                                 Result is (4.1413025, -56.0771187)
[4819]
       15:36:00 INFO: [PO]
                                 Starting to work on Taiwan
[4830] 15:36:00 INFO: [P3]
                                 Result is (59.6749712, 14.5208584)
```

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[4830]
       15:36:00 INFO: [P3]
                                Starting to work on Tajikistan
[4822]
      15:36:00 INFO: [P1]
                                Result is (34.6401861, 39.0494106)
[4822]
       15:36:00 INFO: [P1]
                                Starting to work on Thailand
[4825]
       15:36:01 INFO: [P2]
                                Result is (46.7985624, 8.2319736)
                                Starting to work on Timor Leste
[4825]
       15:36:01 INFO: [P2]
[4830]
       15:36:01 INFO: [P3]
                                Result is (38.6281733, 70.8156541)
[4830]
       15:36:01 INFO: [P3]
                                Starting to work on Togo
[4819]
       15:36:01 INFO: [PO]
                                Result is (23.9739374, 120.9820179)
       15:36:01 INFO: [PO]
[4819]
                                Starting to work on Trinidad and Tobago
[4822]
       15:36:01 INFO: [P1]
                                Result is (14.8971921, 100.83273)
       15:36:01 INFO: [P1]
[4822]
                                Starting to work on Tunisia
       15:36:01 INFO: [P2]
                                Result is (-8.83333, 125.75)
[4825]
[4825]
       15:36:01 INFO: [P2]
                                Starting to work on Turkey
       15:36:01 INFO: [P3]
[4830]
                                Result is (8.7800265, 1.0199765)
[4830]
       15:36:01 INFO: [P3]
                                Starting to work on Turks_and_Caicos_islands
[4819]
       15:36:01 INFO: [P0]
                                Result is (11.0, -61.0)
[4819]
       15:36:01 INFO: [PO]
                                Starting to work on Uganda
[4830]
       15:36:01 INFO: [P3]
                                Result is (21.73333, -71.58333)
[4830]
       15:36:01 INFO: [P3]
                                Starting to work on Ukraine
[4822]
       15:36:01 INFO: [P1]
                                Result is (33.8439408, 9.400138)
       15:36:01 INFO: [P1]
[4822]
                                Starting to work on United Arab Emirates
                                Result is (38.9597594, 34.9249653)
[4825]
       15:36:01 INFO: [P2]
[4825]
       15:36:01 INFO: [P2]
                                Starting to work on United_Kingdom
       15:36:02 INFO: [PO]
[4819]
                                Result is (1.5333554, 32.2166578)
[4819] 15:36:02 INFO: [P0]
                                Starting to work on United_Republic_of_Tanzania
                                Result is (54.75844, -2.69531)
[4825]
       15:36:02 INFO: [P2]
[4825]
       15:36:02 INFO: [P2]
                                Starting to work on United_States_Virgin_Islands
[4819]
       15:36:02 INFO: [PO]
                                Result is (-6.0, 35.0)
       15:36:02 INFO: [P0]
                                Starting to work on United_States_of_America
[4819]
[4822]
       15:36:02 INFO: [P1]
                                Result is (23.75, 54.5)
[4822]
       15:36:02 INFO: [P1]
                                Starting to work on Uruguay
[4830]
       15:36:02 INFO: [P3]
                                Result is (49.4871968, 31.2718321)
[4830]
       15:36:02 INFO: [P3]
                                Starting to work on Uzbekistan
[4825]
       15:36:02 INFO: [P2]
                                Result is (18.5, -64.5)
[4825]
       15:36:02 INFO: [P2]
                                Starting to work on Venezuela
                                Result is (39.76, -98.5)
[4819]
       15:36:02 INFO: [P0]
[4819]
       15:36:02 INFO: [PO]
                                Starting to work on Vietnam
[4830]
       15:36:02 INFO: [P3]
                                Result is (41.32373, 63.9528098)
       15:36:02 INFO: [P3]
                                Starting to work on Western_Sahara
[4830]
                                Result is (-32.8755548, -56.0201525)
[4822]
       15:36:02 INFO: [P1]
[4822]
       15:36:02 INFO: [P1]
                                Starting to work on Yemen
       15:36:02 INFO: [P2]
                                Result is (8.0018709, -66.1109318)
[4825]
[4825]
       15:36:02 INFO: [P2]
                                Starting to work on Zambia
[4830]
       15:36:03 INFO: [P3]
                                Result is (24.49215, -12.65625)
[4819]
       15:36:03 INFO: [PO]
                                Result is (13.2904027, 108.4265113)
[4830]
       15:36:03 INFO: [P3]
                                Starting to work on Zimbabwe
[4819] 15:36:03 INFO: [P0]
                                Ending
[4819] 15:36:03 INFO: [P0]
                                Process ended
```

```
[4822]
        15:36:03 INFO: [P1]
                                 Result is (16.3471243, 47.8915271)
[4822]
       15:36:03 INFO: [P1]
                                 Ending
[4822]
        15:36:03 INFO: [P1]
                                 Process ended
[4830]
        15:36:03 INFO: [P3]
                                 Result is (-18.4554963, 29.7468414)
Γ4830]
        15:36:03 INFO: [P3]
                                 Ending
[4830]
       15:36:03 INFO: [P3]
                                 Process ended
[4825]
       15:36:03 INFO: [P2]
                                 Result is (-14.5186239, 27.5599164)
[4825]
        15:36:03 INFO: [P2]
                                 Ending
[1754]
        15:36:03 INFO: [M]
                                 Processes joined!
       15:36:03 INFO: [P2]
[4825]
                                 Process ended
CPU times: user 466 ms, sys: 195 ms, total: 662 ms
Wall time: 24.6 s
```



1.2. Implementeu un programa *multithreaded* que generi l'scatter plot especificat. Per fer-ho, penseu quines tasques poden executar-se en diferents *threads*, i quines eines podeu fer servir per a evitar les interferències entre els *threads*.

En aquest cas, farem servir una implementació similar a la versió multiprocés: * Mantindrem l'ús de la JoinableQueue per a coordinar les tasques dels diferents processos. * No ens caldrà fer servir una cua de resultats, ja que els *threads* comparteixen variables. Per tant, crearem directament un diccionari de resultats countries_coords, i els *threads* hi escriuran directament els resultats que vagin obtenint. Farem servir un lock per a evitar interferències en l'actualització del diccionari.

```
[31]: def get_coords_thr(t_index, countries_q, lock, countries_coords):

"""

**Obté tasques (països dels quals en volem saber les coordenades)

**de la cua `countries_q`, realitza les tasques i desa els

**resultats al diccionari `countires_coords`.*
```

```
Finalitza quan ja no hi ha tasques a realitzar.
   logging.info("[T{}]\tStarted".format(t_index))
    # Obtenim la primera tasca
   country = countries q.get()
    # Mentre hi hagi tasques pendents, les realitzem
   while country:
        logging.info("[T{}]\tStarting to work on {}".format(t_index, country))
       r = get_geo_cords(country)
       logging.info("[T{}]\tResult is {}".format(t_index, r))
        # Desem el resultat al diccionari de resultats, obtenint primer
        # el lock, i alliberant-lo quan acabem d'actualitzar el diccionari
       lock.acquire()
        countries_coords[country] = r
       lock.release()
        # Indiquem que hem finalitzat la tasca
       countries_q.task_done()
        # Obtenim la propera tasca
        country = countries_q.get()
   logging.info("[T{}]\tEnding".format(t_index))
    # Indiquem que hem finalitzat l'última tasca obtinguda de la cua
    # (que era None, el marcador de final de tasques)
    countries q.task done()
   logging.info("[T{}]\tThread ended".format(t_index))
def get_coords_multithr(countries, num_threads, lock, countries_coords):
    Obté les coordenades geogràfiques d'una llista de països, fent servir
    `num_threads` threads per a l'obtenció de les dades.
    # Creem la cua de tasques a realitzar
   countries_q = JoinableQueue()
    # Afegim els països a la cua de tasques
   for country in countries:
        countries_q.put(country)
    # Afegim un indicador de final de tasca al final de la llista
    # de tasques per a cada thread
   for _ in range(num_threads):
       countries_q.put(None)
    # Iniciem els `num_threads` fils amb la tasca d'obtenir
```

```
# les coordenades i passant la cua com a paràmetre
         for i in range(num_threads):
             thread = Thread(target=get_coords thr, args=(i, countries q, lock, __

→countries_coords))
             thread.start()
         # Esperem a que s'hagin completat totes les tasques
         logging.info("[M]\tWaiting to join threads")
         countries_q.join()
         logging.info("[M]\tThreads joined!")
[32]: \%\time
     # Carreguem les dades del fitxer covid-19
     data = pd.read_csv("data/COVID-19.csv")
     # Sumem les defuncions per país
     deaths_by_country = data.groupby(["countriesAndTerritories"])["deaths"].sum()
     # Obtenim les coordenades, paralulelitzant la feina amb 4 threads
     lock = Lock()
     countries_coords = {}
     get_coords_multithr(deaths_by_country.index, 4, lock, countries_coords)
     # Mostrem els resultats
     plot_results(deaths_by_country, countries_coords)
    [1754] 15:36:04 INFO: [TO]
                                     Started
    [1754] 15:36:04 INFO: [TO]
                                     Starting to work on Afghanistan
    [1754] 15:36:04 INFO: [T1]
                                     Started
    [1754] 15:36:04 INFO: [T1]
                                     Starting to work on Albania
    [1754] 15:36:04 INFO: [T2]
                                     Started
    [1754] 15:36:04 INFO: [T2]
                                     Starting to work on Algeria
    [1754] 15:36:04 INFO: [T3]
                                     Started
    [1754] 15:36:04 INFO: [M]
                                     Waiting to join threads
    [1754] 15:36:04 INFO: [T3]
                                     Starting to work on Andorra
    [1754] 15:36:04 INFO: [TO]
                                     Result is (33.7680065, 66.2385139)
    [1754] 15:36:04 INFO: [TO]
                                     Starting to work on Angola
    [1754] 15:36:04 INFO: [T2]
                                     Result is (28.0000272, 2.9999825)
    [1754] 15:36:04 INFO: [T2]
                                     Starting to work on Anguilla
    [1754] 15:36:04 INFO: [T3]
                                     Result is (42.5407167, 1.5732033)
    [1754] 15:36:04 INFO: [T3]
                                     Starting to work on Antigua_and_Barbuda
    [1754] 15:36:04 INFO: [T3]
                                     Result is (17.05, -61.8)
    [1754] 15:36:04 INFO: [T3]
                                     Starting to work on Argentina
    [1754] 15:36:05 INFO: [TO]
                                     Result is (-11.8775768, 17.5691241)
    [1754] 15:36:05 INFO: [TO]
                                     Starting to work on Armenia
    [1754] 15:36:05 INFO: [T1]
                                     Result is (41.000028, 19.9999619)
    [1754] 15:36:05 INFO: [T1]
                                     Starting to work on Aruba
    [1754] 15:36:05 INFO: [T3]
                                    Result is (-34.9964963, -64.9672817)
    [1754] 15:36:05 INFO: [T3]
                                    Starting to work on Australia
    [1754] 15:36:05 INFO: [T2]
                                    Result is (18.1954947, -63.0750234)
```

```
[1754]
       15:36:05 INFO: [T2]
                                Starting to work on Austria
                                Result is (40.7696272, 44.6736646)
[1754] 15:36:05 INFO: [TO]
[1754]
       15:36:05 INFO: [TO]
                                Starting to work on Azerbaijan
[1754]
       15:36:05 INFO: [T1]
                                Result is (12.4902998, -69.9609842)
                                Starting to work on Bahamas
Γ17547
       15:36:05 INFO: [T1]
[1754]
       15:36:05 INFO: [T2]
                                Result is (47.2000338, 13.199959)
[1754]
       15:36:05 INFO: [T2]
                                Starting to work on Bahrain
                                Result is (-24.7761086, 134.755)
Γ17547
       15:36:05 INFO: [T3]
                                Starting to work on Bangladesh
[1754]
       15:36:06 INFO: [T3]
                                Result is (40.3936294, 47.7872508)
Γ17547
       15:36:06 INFO: [TO]
       15:36:06 INFO: [TO]
                                Starting to work on Barbados
[1754]
                                Result is (24.7736546, -78.0000547)
[1754]
       15:36:06 INFO: [T1]
[1754]
       15:36:06 INFO: [T1]
                                Starting to work on Belarus
       15:36:06 INFO: [T2]
                                Result is (26.1551249, 50.5344606)
[1754]
[1754]
       15:36:06 INFO: [T2]
                                Starting to work on Belgium
[1754]
       15:36:06 INFO: [TO]
                                Result is (13.1500331, -59.5250305)
[1754]
       15:36:06 INFO: [TO]
                                Starting to work on Belize
[1754] 15:36:06 INFO: [T3]
                                Result is (24.4768783, 90.2932426)
[1754]
       15:36:06 INFO: [T3]
                                Starting to work on Benin
[1754]
       15:36:06 INFO: [T1]
                                Result is (53.4250605, 27.6971358)
Γ17547
       15:36:06 INFO: [T1]
                                Starting to work on Bermuda
                                Result is (50.6402809, 4.6667145)
[1754]
       15:36:06 INFO: [T2]
Γ1754]
       15:36:06 INFO: [T2]
                                Starting to work on Bhutan
[1754]
       15:36:06 INFO: [T3]
                                Result is (9.5293472, 2.2584408)
[1754] 15:36:06 INFO: [T3]
                                Starting to work on Bolivia
                                Result is (16.8259793, -88.7600927)
[1754]
       15:36:06 INFO: [TO]
[1754]
       15:36:06 INFO: [TO]
                                Starting to work on Bonaire, Saint Eustatius and
Saba
[1754]
       15:36:07 INFO: [T2]
                                Result is (27.549511, 90.5119273)
[1754]
       15:36:07 INFO: [T2]
                                Starting to work on Bosnia_and_Herzegovina
Γ1754]
       15:36:07 INFO: [T1]
                                Result is (32.3018217, -64.7603583)
[1754]
       15:36:07 INFO: [T1]
                                Starting to work on Botswana
[1754]
       15:36:07 INFO: [T3]
                                Result is (-17.0568696, -64.9912286)
[1754]
       15:36:07 INFO: [T3]
                                Starting to work on Brazil
       15:36:07 INFO: [TO]
                                Result is (12.167, -68.2909614)
[1754]
[1754]
       15:36:07 INFO: [TO]
                                Starting to work on British_Virgin_Islands
                                Result is (44.25, 17.83333)
[1754]
       15:36:07 INFO: [T2]
Γ1754]
       15:36:07 INFO: [T2]
                                Starting to work on Brunei Darussalam
       15:36:07 INFO: [T1]
                                Result is (-23.1681782, 24.5928742)
[1754]
[1754]
       15:36:07 INFO: [T1]
                                Starting to work on Bulgaria
       15:36:07 INFO: [TO]
                                Result is (18.5, -64.5)
[1754]
       15:36:07 INFO: [TO]
                                Starting to work on Burkina_Faso
[1754]
[1754]
       15:36:07 INFO: [T2]
                                Result is (4.5, 114.66667)
[1754]
       15:36:07 INFO: [T2]
                                Starting to work on Burundi
                                Result is (-10.3333333, -53.2)
[1754]
       15:36:07 INFO: [T3]
[1754]
       15:36:07 INFO: [T3]
                                Starting to work on Cambodia
[1754]
       15:36:07 INFO: [T1]
                                Result is (42.6073975, 25.4856617)
[1754] 15:36:07 INFO: [T1]
                                Starting to work on Cameroon
```

```
[1754]
       15:36:08 INFO: [T2]
                                Result is (-3.3634357, 29.8870575)
[1754] 15:36:08 INFO: [T2]
                                Starting to work on Canada
[1754]
       15:36:08 INFO: [TO]
                                Result is (12.0753083, -1.6880314)
       15:36:08 INFO: [TO]
                                Starting to work on Cape_Verde
[1754]
                                Result is (4.6125522, 13.1535811)
[1754]
       15:36:08 INFO: [T1]
[1754]
       15:36:08 INFO: [T1]
                                Starting to work on
Cases on an international conveyance Japan
Γ17547
       15:36:08 INFO: [T3]
                                Result is (13.5066394, 104.869423)
[1754] 15:36:08 INFO: [T3]
                                Starting to work on Cayman Islands
[1754] 15:36:08 INFO: [TO]
                                Result is (16.0, -24.0)
                                Starting to work on Central_African_Republic
[1754] 15:36:08 INFO: [TO]
                                Result is (61.0666922, -107.9917071)
[1754]
       15:36:08 INFO: [T2]
                                Starting to work on Chad
[1754]
       15:36:08 INFO: [T2]
                                Result is (19.5, -80.66667)
[1754]
       15:36:08 INFO: [T3]
[1754]
       15:36:08 INFO: [T3]
                                Starting to work on Chile
[1754]
       15:36:08 INFO: [T1]
                                Result is (35.68536, 139.75309)
[1754]
       15:36:08 INFO: [T1]
                                Starting to work on China
[1754] 15:36:08 INFO: [T0]
                                Result is (7.0, 21.0)
[1754]
       15:36:08 INFO: [TO]
                                Starting to work on Colombia
Γ1754]
       15:36:09 INFO: [T2]
                                Result is (15.6134137, 19.0156172)
[1754]
       15:36:09 INFO: [T2]
                                Starting to work on Comoros
                                Result is (-31.7613365, -71.3187697)
[1754]
       15:36:09 INFO: [T3]
[1754] 15:36:09 INFO: [T3]
                                Starting to work on Congo
[1754]
       15:36:09 INFO: [T1]
                                Result is (35.000074, 104.999927)
[1754] 15:36:09 INFO: [T1]
                                Starting to work on Costa_Rica
                                Result is (2.8894434, -73.783892)
[1754]
       15:36:09 INFO: [TO]
[1754]
       15:36:09 INFO: [TO]
                                Starting to work on Cote_dIvoire
[1754]
       15:36:09 INFO: [T2]
                                Result is (-12.2045176, 44.2832964)
[1754]
       15:36:09 INFO: [T2]
                                Starting to work on Croatia
[1754]
       15:36:09 INFO: [TO]
                                Result is (8.0, -5.5)
[1754]
       15:36:09 INFO: [TO]
                                Starting to work on Cuba
[1754]
       15:36:09 INFO: [T3]
                                Result is (-0.7264327, 15.6419155)
[1754]
       15:36:09 INFO: [T3]
                                Starting to work on CuraÃğao
[1754]
       15:36:09 INFO: [T1]
                                Result is (45.8302419, 10.2568862)
       15:36:09 INFO: [T1]
                                Starting to work on Cyprus
[1754]
                                Result is (23.0131338, -80.8328748)
[1754]
       15:36:09 INFO: [TO]
[1754]
       15:36:09 INFO: [TO]
                                Starting to work on Czechia
Γ17547
       15:36:10 INFO: [T2]
                                Result is (45.5643442, 17.0118954)
[1754] 15:36:10 INFO: [T2]
                                Starting to work on
Democratic_Republic_of_the_Congo
[1754] 15:36:10 INFO: [T1]
                                Result is (34.9823018, 33.1451285)
[1754]
       15:36:10 INFO: [T1]
                                Starting to work on Denmark
[1754]
       15:36:10 INFO: [TO]
                                Result is (49.8167003, 15.4749544)
       15:36:10 INFO: [TO]
                                Starting to work on Djibouti
[1754]
[1754]
       15:36:10 INFO: [TO]
                                Result is (11.8145966, 42.8453061)
[1754]
       15:36:10 INFO: [TO]
                                Starting to work on Dominica
[1754] 15:36:10 INFO: [T1]
                                Result is (55.670249, 10.3333283)
[1754] 15:36:10 INFO: [T1]
                                Starting to work on Dominican_Republic
```

```
[1754]
       15:36:10 INFO: [T3]
                                Result is (0, 0)
[1754] 15:36:10 INFO: [T3]
                                Starting to work on Ecuador
[1754]
       15:36:10 INFO: [T1]
                                Result is (19.0, -70.66667)
[1754]
       15:36:10 INFO: [T1]
                                Starting to work on Egypt
       15:36:11 INFO: [TO]
                                Result is (19.0974031, -70.3028026)
Γ17547
[1754]
       15:36:11 INFO: [TO]
                                Starting to work on El Salvador
[1754]
       15:36:11 INFO: [T2]
                                Result is (-2.5, 23.5)
Γ17547
       15:36:11 INFO: [T2]
                                Starting to work on Equatorial Guinea
                                Result is (-1.3397668, -79.3666965)
[1754]
       15:36:11 INFO: [T3]
Γ17547
       15:36:11 INFO: [T3]
                                Starting to work on Eritrea
       15:36:11 INFO: [TO]
[1754]
                                Result is (10.4975281, 124.03134)
       15:36:11 INFO: [TO]
[1754]
                                Starting to work on Estonia
       15:36:11 INFO: [T1]
                                Result is (26.2540493, 29.2675469)
[1754]
       15:36:11 INFO: [T1]
[1754]
                                Starting to work on Eswatini
[1754]
       15:36:11 INFO: [T3]
                                Result is (15.9500319, 37.9999668)
[1754]
       15:36:11 INFO: [T3]
                                Starting to work on Ethiopia
[1754]
       15:36:11 INFO: [T2]
                                Result is (1.613172, 10.5170357)
[1754] 15:36:11 INFO: [T2]
                                Starting to work on Falkland_Islands_(Malvinas)
[1754]
       15:36:11 INFO: [T1]
                                Result is (-26.5624806, 31.3991317)
[1754]
       15:36:11 INFO: [T1]
                                Starting to work on Faroe Islands
       15:36:11 INFO: [TO]
                                Result is (58.7523778, 25.3319078)
Γ17547
       15:36:11 INFO: [TO]
                                Starting to work on Fiji
[1754]
Γ1754]
       15:36:11 INFO: [T3]
                                Result is (10.2116702, 38.6521203)
[1754]
       15:36:11 INFO: [T3]
                                Starting to work on Finland
[1754] 15:36:12 INFO: [T2]
                                Result is (-51.75, -59.16667)
[1754]
       15:36:12 INFO: [T2]
                                Starting to work on France
[1754]
       15:36:12 INFO: [T1]
                                Result is (62.0, -7.0)
[1754]
       15:36:12 INFO: [T1]
                                Starting to work on French_Polynesia
                                Result is (-18.1239696, 179.0122737)
[1754]
       15:36:12 INFO: [TO]
[1754]
       15:36:12 INFO: [TO]
                                Starting to work on Gabon
[1754]
       15:36:12 INFO: [T1]
                                Result is (-15.0, -140.0)
[1754]
       15:36:12 INFO: [T1]
                                Starting to work on Gambia
[1754]
       15:36:12 INFO: [T3]
                                Result is (63.2467777, 25.9209164)
[1754]
       15:36:12 INFO: [T3]
                                Starting to work on Georgia
       15:36:12 INFO: [T2]
                                Result is (46.603354, 1.8883335)
[1754]
[1754]
       15:36:12 INFO: [T2]
                                Starting to work on Germany
                                Result is (13.470062, -15.4900464)
[1754]
       15:36:12 INFO: [T1]
Γ1754]
       15:36:12 INFO: [T1]
                                Starting to work on Ghana
       15:36:12 INFO: [TO]
                                Result is (-0.8999695, 11.6899699)
[1754]
Γ17547
       15:36:12 INFO: [TO]
                                Starting to work on Gibraltar
       15:36:12 INFO: [T3]
                                Result is (41.6809707, 44.0287382)
[1754]
       15:36:12 INFO: [T3]
                                Starting to work on Greece
[1754]
[1754]
       15:36:12 INFO: [T2]
                                Result is (51.0834196, 10.4234469)
       15:36:12 INFO: [T2]
[1754]
                                Starting to work on Greenland
[1754]
       15:36:13 INFO: [T3]
                                Result is (38.9953683, 21.9877132)
[1754]
       15:36:13 INFO: [T3]
                                Starting to work on Grenada
                                Result is (36.106747, -5.3352772)
[1754]
       15:36:13 INFO: [TO]
[1754] 15:36:13 INFO: [TO]
                                Starting to work on Guam
```

```
[1754]
       15:36:13 INFO: [T1]
                                Result is (8.0300284, -1.0800271)
[1754] 15:36:13 INFO: [T1]
                                Starting to work on Guatemala
[1754]
       15:36:13 INFO: [T3]
                                Result is (12.1360374, -61.6904045)
[1754]
       15:36:13 INFO: [T3]
                                Starting to work on Guernsey
                                Result is (13.4501257, 144.757551)
Γ1754]
       15:36:13 INFO: [TO]
[1754]
       15:36:13 INFO: [TO]
                                Starting to work on Guinea
[1754]
       15:36:13 INFO: [T1]
                                Result is (15.6356088, -89.8988087)
                                Starting to work on Guinea_Bissau
Γ17547
       15:36:13 INFO: [T1]
                                Result is (77.6192349, -42.8125967)
[1754]
       15:36:13 INFO: [T2]
Γ1754]
       15:36:13 INFO: [T2]
                                Starting to work on Guyana
                                Result is (12.0, -15.0)
[1754]
       15:36:14 INFO: [T1]
                                Starting to work on Haiti
[1754]
       15:36:14 INFO: [T1]
                                Result is (49.5795202, -2.5290434)
[1754]
       15:36:14 INFO: [T3]
       15:36:14 INFO: [T3]
[1754]
                                Starting to work on Holy See
[1754]
       15:36:14 INFO: [TO]
                                Result is (10.7226226, -10.7083587)
[1754]
       15:36:14 INFO: [TO]
                                Starting to work on Honduras
[1754]
       15:36:14 INFO: [T3]
                                Result is (41.90225, 12.4533)
[1754]
       15:36:14 INFO: [T3]
                                Starting to work on Hungary
[1754]
       15:36:14 INFO: [T1]
                                Result is (19.1399952, -72.3570972)
Γ17547
       15:36:14 INFO: [T1]
                                Starting to work on Iceland
       15:36:14 INFO: [T2]
Γ1754]
                                Result is (4.8417097, -58.6416891)
[1754]
       15:36:14 INFO: [T2]
                                Starting to work on India
[1754]
       15:36:14 INFO: [TO]
                                Result is (15.2572432, -86.0755145)
[1754]
       15:36:14 INFO: [TO]
                                Starting to work on Indonesia
[1754]
      15:36:14 INFO: [T3]
                                Result is (47.1817585, 19.5060937)
[1754]
       15:36:14 INFO: [T3]
                                Starting to work on Iran
[1754]
       15:36:14 INFO: [T1]
                                Result is (64.9841821, -18.1059013)
[1754]
       15:36:14 INFO: [T1]
                                Starting to work on Iraq
[1754]
       15:36:15 INFO: [T2]
                                Result is (22.3511148, 78.6677428)
[1754]
       15:36:15 INFO: [T2]
                                Starting to work on Ireland
[1754]
       15:36:15 INFO: [TO]
                                Result is (-2.4833826, 117.8902853)
[1754]
       15:36:15 INFO: [TO]
                                Starting to work on Isle_of_Man
[1754]
       15:36:15 INFO: [T1]
                                Result is (33.0955793, 44.1749775)
[1754]
       15:36:15 INFO: [T1]
                                Starting to work on Israel
       15:36:15 INFO: [TO]
                                Result is (54.1714196, -4.4958104)
[1754]
[1754]
       15:36:15 INFO: [TO]
                                Starting to work on Italy
                                Result is (52.865196, -7.9794599)
[1754]
       15:36:15 INFO: [T2]
Γ1754]
       15:36:15 INFO: [T2]
                                Starting to work on Jamaica
       15:36:15 INFO: [T3]
                                Result is (32.6475314, 54.5643516)
[1754]
Γ1754]
       15:36:15 INFO: [T3]
                                Starting to work on Japan
                                Result is (31.5313113, 34.8667654)
[1754]
       15:36:15 INFO: [T1]
       15:36:15 INFO: [T1]
                                Starting to work on Jersey
[1754]
[1754]
       15:36:15 INFO: [TO]
                                Result is (42.6384261, 12.674297)
[1754]
       15:36:15 INFO: [TO]
                                Starting to work on Jordan
[1754]
       15:36:16 INFO: [T2]
                                Result is (18.1152958, -77.1598455)
[1754]
       15:36:16 INFO: [T2]
                                Starting to work on Kazakhstan
[1754]
       15:36:16 INFO: [T3]
                                Result is (36.5748441, 139.2394179)
[1754] 15:36:16 INFO: [T3]
                                Starting to work on Kenya
```

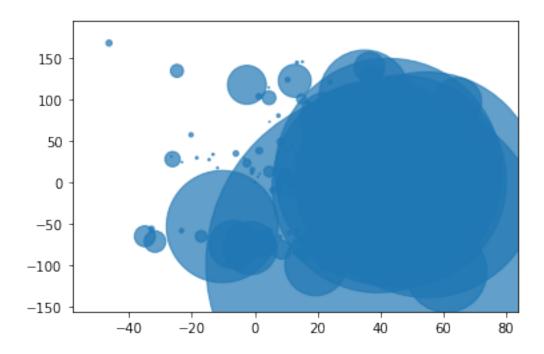
```
[1754]
       15:36:16 INFO: [T1]
                                Result is (49.2123066, -2.1256)
[1754] 15:36:16 INFO: [T1]
                                Starting to work on Kosovo
[1754]
       15:36:16 INFO: [TO]
                                Result is (31.1667049, 36.941628)
       15:36:16 INFO: [TO]
                                Starting to work on Kuwait
[1754]
                                Result is (47.2286086, 65.2093197)
Γ1754]
       15:36:16 INFO: [T2]
[1754]
       15:36:16 INFO: [T2]
                                Starting to work on Kyrgyzstan
[1754]
       15:36:16 INFO: [T3]
                                Result is (1.4419683, 38.4313975)
Γ1754]
       15:36:16 INFO: [T3]
                                Starting to work on Laos
                                Result is (42.5869578, 20.9021231)
[1754]
       15:36:16 INFO: [T1]
Γ1754]
       15:36:16 INFO: [T1]
                                Starting to work on Latvia
       15:36:16 INFO: [TO]
                                Result is (29.2733964, 47.4979476)
[1754]
       15:36:16 INFO: [TO]
[1754]
                                Starting to work on Lebanon
[1754]
       15:36:16 INFO: [T2]
                                Result is (41.5089324, 74.724091)
       15:36:16 INFO: [T2]
[1754]
                                Starting to work on Liberia
[1754]
       15:36:17 INFO: [T1]
                                Result is (56.8406494, 24.7537645)
[1754]
       15:36:17 INFO: [T1]
                                Starting to work on Libya
[1754]
       15:36:17 INFO: [T3]
                                Result is (20.0171109, 103.378253)
[1754]
       15:36:17 INFO: [T3]
                                Starting to work on Liechtenstein
[1754]
       15:36:17 INFO: [TO]
                                Result is (33.8750629, 35.843409)
Γ1754]
       15:36:17 INFO: [TO]
                                Starting to work on Lithuania
       15:36:17 INFO: [T2]
[1754]
                                Result is (5.7499721, -9.3658524)
       15:36:17 INFO: [T2]
[1754]
                                Starting to work on Luxembourg
[1754]
       15:36:17 INFO: [T1]
                                Result is (26.8234472, 18.1236723)
[1754]
       15:36:17 INFO: [T1]
                                Starting to work on Madagascar
[1754]
       15:36:17 INFO: [TO]
                                Result is (55.3500003, 23.7499997)
       15:36:17 INFO: [TO]
[1754]
                                Starting to work on Malawi
       15:36:17 INFO: [T3]
                                Result is (47.1416307, 9.5531527)
[1754]
[1754]
       15:36:17 INFO: [T3]
                                Starting to work on Malaysia
       15:36:17 INFO: [T2]
                                Result is (49.8158683, 6.1296751)
[1754]
[1754]
       15:36:17 INFO: [T2]
                                Starting to work on Maldives
[1754]
       15:36:17 INFO: [T1]
                                Result is (-18.9249604, 46.4416422)
[1754]
       15:36:17 INFO: [T1]
                                Starting to work on Mali
[1754]
       15:36:17 INFO: [TO]
                                Result is (-13.2687204, 33.9301963)
[1754]
       15:36:17 INFO: [TO]
                                Starting to work on Malta
       15:36:18 INFO: [T3]
                                Result is (4.5693754, 102.2656823)
[1754]
[1754]
       15:36:18 INFO: [T3]
                                Starting to work on Mauritania
[1754]
       15:36:18 INFO: [T2]
                                Result is (4.7064352, 73.3287853)
Γ1754]
       15:36:18 INFO: [T2]
                                Starting to work on Mauritius
       15:36:18 INFO: [TO]
                                Result is (35.8885993, 14.4476911)
[1754]
[1754]
       15:36:18 INFO: [TO]
                                Starting to work on Mexico
       15:36:18 INFO: [T1]
                                Result is (16.3700359, -2.2900239)
[1754]
       15:36:18 INFO: [T1]
                                Starting to work on Moldova
[1754]
[1754]
       15:36:18 INFO: [T3]
                                Result is (20.2540382, -9.2399263)
[1754]
       15:36:18 INFO: [T3]
                                Starting to work on Monaco
[1754]
       15:36:18 INFO: [T2]
                                Result is (-20.2759451, 57.5703566)
[1754]
       15:36:18 INFO: [T2]
                                Starting to work on Mongolia
[1754]
       15:36:18 INFO: [TO]
                                Result is (19.4326296, -99.1331785)
[1754] 15:36:18 INFO: [TO]
                                Starting to work on Montenegro
```

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[1754]
       15:36:18 INFO: [T1]
                                Result is (47.2879608, 28.5670941)
[1754]
       15:36:18 INFO: [T1]
                                Starting to work on Montserrat
[1754]
       15:36:19 INFO: [T3]
                                Result is (43.738449, 7.4242241)
       15:36:19 INFO: [T3]
                                Starting to work on Morocco
[1754]
                                Result is (46.8250388, 103.8499736)
Γ1754]
       15:36:19 INFO: [T2]
[1754]
       15:36:19 INFO: [T2]
                                Starting to work on Mozambique
[1754]
       15:36:19 INFO: [TO]
                                Result is (42.9868853, 19.5180992)
Γ1754]
       15:36:19 INFO: [TO]
                                Starting to work on Myanmar
       15:36:19 INFO: [T1]
                                Result is (16.7417041, -62.1916844)
[1754]
Γ1754]
       15:36:19 INFO: [T1]
                                Starting to work on Namibia
       15:36:19 INFO: [T3]
                                Result is (31.1728205, -7.3362482)
[1754]
[1754]
       15:36:19 INFO: [T3]
                                Starting to work on Nepal
                                Result is (17.1750495, 95.9999652)
[1754]
       15:36:19 INFO: [TO]
       15:36:19 INFO: [TO]
[1754]
                                Starting to work on Netherlands
                                Result is (-19.302233, 34.9144977)
[1754]
       15:36:19 INFO: [T2]
[1754]
       15:36:19 INFO: [T2]
                                Starting to work on New_Caledonia
[1754]
       15:36:19 INFO: [T1]
                                Result is (-23.2335499, 17.3231107)
[1754]
       15:36:19 INFO: [T1]
                                Starting to work on New_Zealand
[1754]
       15:36:20 INFO: [T2]
                                Result is (-21.5, 165.5)
Γ17547
       15:36:20 INFO: [T2]
                                Starting to work on Nicaragua
                                Result is (28.1083929, 84.0917139)
Γ1754]
       15:36:20 INFO: [T3]
                                Starting to work on Niger
[1754]
       15:36:20 INFO: [T3]
[1754]
       15:36:20 INFO: [TO]
                                Result is (52.5001698, 5.7480821)
[1754]
       15:36:20 INFO: [TO]
                                Starting to work on Nigeria
[1754]
       15:36:20 INFO: [T2]
                                Result is (12.6090157, -85.2936911)
[1754]
       15:36:20 INFO: [T2]
                                Starting to work on North_Macedonia
                                Result is (17.7356214, 9.3238432)
[1754]
       15:36:20 INFO: [T3]
[1754]
       15:36:20 INFO: [T3]
                                Starting to work on Northern_Mariana_Islands
[1754]
       15:36:20 INFO: [T0]
                                Result is (9.6000359, 7.9999721)
[1754]
       15:36:20 INFO: [TO]
                                Starting to work on Norway
[1754]
       15:36:20 INFO: [T1]
                                Result is (-46.4108596, 168.3516142)
[1754]
       15:36:20 INFO: [T1]
                                Starting to work on Oman
[1754]
       15:36:20 INFO: [T2]
                                Result is (41.66667, 21.75)
[1754]
       15:36:20 INFO: [T2]
                                Starting to work on Pakistan
                                Result is (15.214, 145.756)
[1754]
       15:36:20 INFO: [T3]
[1754]
       15:36:20 INFO: [T3]
                                Starting to work on Palestine
[1754]
       15:36:21 INFO: [TO]
                                Result is (64.5731537, 11.5280364)
Γ1754]
       15:36:21 INFO: [TO]
                                Starting to work on Panama
       15:36:21 INFO: [T1]
                                Result is (21.0000287, 57.0036901)
[1754]
Γ1754]
       15:36:21 INFO: [T1]
                                Starting to work on Papua_New_Guinea
       15:36:21 INFO: [T2]
                                Result is (30.3308401, 71.247499)
[1754]
       15:36:21 INFO: [T2]
                                Starting to work on Paraguay
[1754]
[1754]
       15:36:21 INFO: [T3]
                                Result is (31.7621153, -95.6307891)
[1754]
       15:36:21 INFO: [T3]
                                Starting to work on Peru
[1754]
       15:36:21 INFO: [TO]
                                Result is (8.559559, -81.1308434)
[1754]
       15:36:21 INFO: [TO]
                                Starting to work on Philippines
                                Result is (-6.0, 147.0)
[1754]
       15:36:21 INFO: [T1]
[1754] 15:36:21 INFO: [T1]
                                Starting to work on Poland
```

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[1754]
       15:36:21 INFO: [T2]
                                Result is (-23.3165935, -58.1693445)
[1754] 15:36:21 INFO: [T2]
                                Starting to work on Portugal
[1754]
       15:36:21 INFO: [TO]
                                Result is (12.7503486, 122.7312101)
       15:36:21 INFO: [TO]
                                Starting to work on Puerto Rico
[1754]
                                Result is (-6.8699697, -75.0458515)
Γ17547
       15:36:21 INFO: [T3]
[1754]
       15:36:21 INFO: [T3]
                                Starting to work on Qatar
[1754]
       15:36:22 INFO: [T1]
                                Result is (52.215933, 19.134422)
Γ17547
       15:36:22 INFO: [T1]
                                Starting to work on Romania
                                Result is (22.9109866, -98.0759194)
[1754]
       15:36:22 INFO: [TO]
[1754]
       15:36:22 INFO: [TO]
                                Starting to work on Russia
                                Result is (40.0332629, -7.8896263)
[1754] 15:36:22 INFO: [T2]
[1754]
       15:36:22 INFO: [T2]
                                Starting to work on Rwanda
                                Result is (25.3336984, 51.2295295)
[1754]
       15:36:22 INFO: [T3]
                                Starting to work on Saint Kitts and Nevis
[1754]
       15:36:22 INFO: [T3]
                                Result is (17.33333, -62.75)
[1754]
       15:36:22 INFO: [T3]
[1754]
       15:36:22 INFO: [T3]
                                Starting to work on Saint_Lucia
[1754]
       15:36:22 INFO: [T2]
                                Result is (-1.9646631, 30.0644358)
[1754] 15:36:22 INFO: [T2]
                                Starting to work on
Saint_Vincent_and_the_Grenadines
[1754] 15:36:22 INFO: [T1]
                                Result is (45.9852129, 24.6859225)
[1754]
       15:36:22 INFO: [T1]
                                Starting to work on San Marino
                                Result is (64.6863136, 97.7453061)
[1754] 15:36:22 INFO: [TO]
[1754] 15:36:22 INFO: [TO]
                                Starting to work on Sao_Tome_and_Principe
[1754]
       15:36:22 INFO: [TO]
                                Result is (1.0, 7.0)
[1754] 15:36:22 INFO: [TO]
                                Starting to work on Saudi_Arabia
                                Result is (-27.5, 153.0)
[1754]
       15:36:22 INFO: [T3]
[1754]
       15:36:22 INFO: [T3]
                                Starting to work on Senegal
[1754]
       15:36:23 INFO: [T2]
                                Result is (13.08333, -61.2)
[1754]
       15:36:23 INFO: [T2]
                                Starting to work on Serbia
[1754]
       15:36:23 INFO: [T1]
                                Result is (43.9458623, 12.458306)
[1754]
       15:36:23 INFO: [T1]
                                Starting to work on Seychelles
[1754]
       15:36:23 INFO: [TO]
                                Result is (25.0, 45.0)
[1754]
       15:36:23 INFO: [TO]
                                Starting to work on Sierra_Leone
[1754]
       15:36:23 INFO: [T2]
                                Result is (44.0243228, 21.0765743)
                                Starting to work on Singapore
[1754]
       15:36:23 INFO: [T2]
                                Result is (8.5, -11.5)
[1754]
       15:36:23 INFO: [TO]
[1754]
       15:36:23 INFO: [TO]
                                Starting to work on Sint Maarten
Γ1754]
       15:36:23 INFO: [T1]
                                Result is (-4.6574977, 55.4540146)
       15:36:23 INFO: [T1]
                                Starting to work on Slovakia
[1754]
                                Result is (18.04167, -63.06667)
[1754]
       15:36:23 INFO: [TO]
       15:36:23 INFO: [TO]
                                Starting to work on Slovenia
[1754]
       15:36:24 INFO: [T2]
                                Result is (1.340863, 103.8303918)
[1754]
[1754]
       15:36:24 INFO: [T2]
                                Starting to work on Somalia
                                Result is (14.4750607, -14.4529612)
[1754]
       15:36:24 INFO: [T3]
[1754]
       15:36:24 INFO: [T3]
                                Starting to work on South_Africa
[1754]
       15:36:24 INFO: [T1]
                                Result is (48.7411522, 19.4528646)
[1754] 15:36:24 INFO: [T1]
                                Starting to work on South_Korea
[1754] 15:36:24 INFO: [TO]
                                Result is (45.8133113, 14.4808369)
```

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[1754]
       15:36:24 INFO: [TO]
                                Starting to work on South_Sudan
[1754] 15:36:24 INFO: [T2]
                                Result is (8.3676771, 49.083416)
[1754]
       15:36:24 INFO: [T2]
                                Starting to work on Spain
[1754]
       15:36:24 INFO: [T3]
                                Result is (-26.1694437, 28.1940846)
                                Starting to work on Sri Lanka
Γ17547
       15:36:24 INFO: [T3]
[1754]
       15:36:24 INFO: [TO]
                                Result is (7.5, 30.0)
[1754]
       15:36:24 INFO: [TO]
                                Starting to work on Sudan
Γ17547
       15:36:24 INFO: [T1]
                                Result is (37.320906, 127.102115)
                                Starting to work on Suriname
[1754]
      15:36:24 INFO: [T1]
[1754]
       15:36:24 INFO: [T2]
                                Result is (39.3262345, -4.8380649)
[1754] 15:36:24 INFO: [T2]
                                Starting to work on Sweden
                                Result is (7.5554942, 80.7137847)
[1754]
       15:36:24 INFO: [T3]
                                Starting to work on Switzerland
[1754]
       15:36:24 INFO: [T3]
       15:36:25 INFO: [TO]
                                Result is (14.5844444, 29.4917691)
[1754]
[1754]
       15:36:25 INFO: [TO]
                                Starting to work on Syria
[1754]
       15:36:25 INFO: [T1]
                                Result is (4.1413025, -56.0771187)
[1754]
       15:36:25 INFO: [T1]
                                Starting to work on Taiwan
[1754] 15:36:25 INFO: [T2]
                                Result is (59.6749712, 14.5208584)
[1754]
       15:36:25 INFO: [T2]
                                Starting to work on Tajikistan
[1754]
       15:36:25 INFO: [T3]
                                Result is (46.7985624, 8.2319736)
       15:36:25 INFO: [T3]
[1754]
                                Starting to work on Thailand
                                Result is (23.9739374, 120.9820179)
[1754]
       15:36:25 INFO: [T1]
[1754] 15:36:25 INFO: [T1]
                                Starting to work on Timor Leste
[1754]
       15:36:25 INFO: [TO]
                                Result is (34.6401861, 39.0494106)
[1754] 15:36:25 INFO: [TO]
                                Starting to work on Togo
                                Result is (38.6281733, 70.8156541)
[1754]
       15:36:25 INFO: [T2]
[1754]
       15:36:25 INFO: [T2]
                                Starting to work on Trinidad_and_Tobago
                                Result is (14.8971921, 100.83273)
[1754]
       15:36:25 INFO: [T3]
[1754]
       15:36:25 INFO: [T3]
                                Starting to work on Tunisia
[1754]
       15:36:25 INFO: [T1]
                                Result is (-8.83333, 125.75)
[1754]
       15:36:25 INFO: [T1]
                                Starting to work on Turkey
       15:36:25 INFO: [T2]
[1754]
                                Result is (11.0, -61.0)
[1754]
       15:36:25 INFO: [T2]
                                Starting to work on Turks_and_Caicos_islands
[1754]
       15:36:26 INFO: [TO]
                                Result is (8.7800265, 1.0199765)
       15:36:26 INFO: [TO]
                                Starting to work on Uganda
[1754]
                                Result is (33.8439408, 9.400138)
[1754]
       15:36:26 INFO: [T3]
[1754]
       15:36:26 INFO: [T3]
                                Starting to work on Ukraine
Γ1754]
       15:36:26 INFO: [T1]
                                Result is (38.9597594, 34.9249653)
       15:36:26 INFO: [T1]
                                Starting to work on United_Arab_Emirates
[1754]
                                Result is (21.73333, -71.58333)
[1754]
       15:36:26 INFO: [T2]
       15:36:26 INFO: [T2]
                                Starting to work on United_Kingdom
[1754]
       15:36:26 INFO: [T1]
                                Result is (23.75, 54.5)
[1754]
[1754]
       15:36:26 INFO: [T1]
                                Starting to work on United_Republic_of_Tanzania
                                Result is (49.4871968, 31.2718321)
[1754]
       15:36:26 INFO: [T3]
[1754]
       15:36:26 INFO: [T3]
                                Starting to work on United_States_Virgin_Islands
[1754]
       15:36:26 INFO: [TO]
                                Result is (1.5333554, 32.2166578)
[1754] 15:36:26 INFO: [TO]
                                Starting to work on United_States_of_America
[1754] 15:36:26 INFO: [T2]
                                Result is (54.75844, -2.69531)
```

```
[1754] 15:36:26 INFO: [T2]
                                Starting to work on Uruguay
[1754] 15:36:26 INFO: [T1]
                                Result is (-6.0, 35.0)
[1754]
       15:36:26 INFO: [T1]
                                Starting to work on Uzbekistan
[1754] 15:36:26 INFO: [T3]
                                Result is (18.5, -64.5)
       15:36:26 INFO: [T3]
                                Starting to work on Venezuela
[1754]
                                Result is (39.76, -98.5)
[1754]
       15:36:27 INFO: [TO]
[1754]
       15:36:27 INFO: [TO]
                                Starting to work on Vietnam
[1754]
       15:36:27 INFO: [T1]
                                Result is (41.32373, 63.9528098)
[1754] 15:36:27 INFO: [T1]
                                Starting to work on Western Sahara
       15:36:27 INFO: [T3]
                                Result is (8.0018709, -66.1109318)
[1754]
[1754] 15:36:27 INFO: [T3]
                                Starting to work on Yemen
[1754]
       15:36:27 INFO: [T2]
                                Result is (-32.8755548, -56.0201525)
       15:36:27 INFO: [T2]
                                Starting to work on Zambia
[1754]
[1754]
       15:36:27 INFO: [TO]
                                Result is (13.2904027, 108.4265113)
       15:36:27 INFO: [TO]
[1754]
                                Starting to work on Zimbabwe
[1754]
       15:36:27 INFO: [T1]
                                Result is (24.49215, -12.65625)
[1754]
       15:36:27 INFO: [T1]
                                Ending
[1754] 15:36:27 INFO: [T1]
                                Thread ended
[1754]
       15:36:27 INFO: [T3]
                                Result is (16.3471243, 47.8915271)
[1754]
       15:36:27 INFO: [T3]
                                Ending
[1754]
       15:36:27 INFO: [T3]
                                Thread ended
       15:36:27 INFO: [TO]
                                Result is (-18.4554963, 29.7468414)
[1754]
[1754] 15:36:27 INFO: [TO]
                                Ending
[1754]
       15:36:27 INFO: [TO]
                                Thread ended
[1754] 15:36:28 INFO: [T2]
                                Result is (-14.5186239, 27.5599164)
[1754] 15:36:28 INFO: [T2]
                                Ending
[1754] 15:36:28 INFO: [T2]
                                Thread ended
[1754] 15:36:28 INFO: [M]
                                Threads joined!
CPU times: user 1.9 s, sys: 3.23 s, total: 5.14 s
Wall time: 24.6 s
```



1.3. Reflexioneu sobre quina de les dues implementacions hauria de ser la més eficient per a resoldre el problema plantejat.

Experimentalment podem comprovar com el temps d'execució d'ambdues versions és molt similar (27.8 segons per a l'execució original del *notebook*).

Conceptualment, la tasca que executem en els múltiples fils o processos és una tasca limitada per la xarxa (ja sigui per l'ample de banda de la nostra màquina o pel temps de resposta del servidor), i que requereix de molt poc càlcul de CPU. Per tant, tant l'execució paralulela en diversos processos com la concurrent en una única CPU tenen un temps d'execució similar, limitada per la xarxa i no pas per la CPU. Filant molt prim, podríem dir que la versió *multithreaded* genera menys *overhead* (crear *threads* és més ràpid que no pas crear processos), però per a l'execució concreta que hem realitzat, això no arriba a tenir un impacte notable en el rendiment. També podríem dir que la versió multiprocés aprofita millor els recursos de la màquina (ja que executa, paralulelament, diverses crides a la API), però de nou això no té un impacte significatiu, ja que el temps de càlcul de CPU que requereix aquesta aplicació és mínim.

6 5.- Bibliografia

6.1 5.1.- Bibliografia bàsica

La bibliografia bàsica d'aquesta unitat és el contingut explicat en el notebook (no és necessari consultar cap enllaç extern).

6.2 5.2.- Bibliografia addicional - Ampliació de coneixements

A la introducció d'aquesta unitat s'ha simplificat una mica el detall de com funciona la gestió de memòria en l'execució de programes, ja que no és l'objectiu principal d'aquest mòdul. Si esteu

interessats en explorar en més detall què diferencia, a nivell de sistema operatiu, els *threads* dels processos, us recomanem que visiteu els enllaços següents (1, 2, 3, 4, 5).

En aquesta unitat s'ha presentat una introducció a la programació multiprocés i *multithread*, revisant algunes de les principals eines que ofereix Python en aquest context. Ara bé, això és només un petit tast! Si esteu interessats en conèixer altres eines per a realitzar programació concurrent i paralůlela en Python, us recomanem explorar altres eines de la llibreria multiprocessing com ara les *pools* de processos (1, 2); l'ús de semàfors, events i *conditions* de de la llibreria threading (1); o la llibreria asyncio. Si preferiu la consulta en format llibre (en comptes de diversos enllaços), us recomanem la lectura dels capítols 1 fins a 4 del llibre *Python Parallel Programming Cookbook*, de Giancarlo Zaccone.

Hem vist com el mòdul multiprocessing ofereix un parell de classes, Value i Array, que representen objectes que s'assignen en un espai de memòria compartida entre els diversos processos. Value retorna un objecte de tipus ctype, que ofereix tipus de dades compatibles amb C. Podeu fer un cop d'ull als tipus de dades que ofereix en el següent enllaç.

Tot i que no era l'objectiu principal d'aquesta unitat, en aquest notebook hem fet servir el mòdul logging per a crear *logs* que registraven què estaven fent els diferents fils i processos en cada moment. Us recomanem la lectura dels tutorials oficials (tant el bàsic com el més avançat) per tal de conèixer les funcionalitats d'aquest mòdul, que us poden ser útils no només per a seguir el flux d'execució de programes *multithread* o multiprocés, sinó també per a monitorejar qualsevol tipus de programa.