

Tarea 6

Temas Selectos de Estadística

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Ejercicio 1

Sea $f_Z = f_X * f_X$ la convolución de f_X consigo misma en donde $f_X = \frac{1}{\sqrt{2\pi}} e^{-\frac{x^2}{2}}$. Calculamos f_Z :

$$\begin{aligned} (f * f)(z) &= \int_{-\infty}^{\infty} f(z-x)f(x)dx \\ &= \int_{-\infty}^{\infty} \frac{1}{\sqrt{2\pi}} e^{-\frac{(z-x)^2}{2}} \frac{1}{\sqrt{2\pi}} e^{-\frac{x^2}{2}} dx \\ &= \frac{1}{2\pi} \int_{-\infty}^{\infty} e^{-\frac{z^2-2xz+2x^2}{2}} dx \\ &= \frac{1}{2\pi} e^{-\frac{z^2}{2}} \int_{-\infty}^{\infty} e^{-(x-z+x^2)} dx \\ &= \frac{1}{2\pi} e^{-\frac{z^2}{2}} e^{\frac{z^2}{4}} \int_{-\infty}^{\infty} e^{-\frac{z^2}{4}} e^{-(x-z+x^2)} dx \\ &= \frac{1}{2\pi} e^{-\frac{z^2}{2}} e^{\frac{z^2}{4}} \int_{-\infty}^{\infty} e^{-(\frac{z^2}{4}-x+z+x^2)} dx \\ &= \frac{1}{2\pi} e^{-\frac{z^2}{2}} e^{\frac{z^2}{4}} \int_{-\infty}^{\infty} e^{(x-\frac{z}{2})^2} dx \end{aligned}$$

Realizando el cambio de variable $u = x - \frac{z}{2}$ entonces tenemos que:

$$\begin{aligned} (f * f)(z) &= \frac{1}{2\pi} e^{-\frac{z^2}{2}} e^{\frac{z^2}{4}} \int_{-\infty}^{\infty} e^{u^2} dx \\ &= \frac{1}{2\pi} e^{-\frac{z^2}{4}} \int_{-\infty}^{\infty} e^{u^2} dx \\ &= \frac{1}{2\pi} e^{-\frac{z^2}{4}} \sqrt{\pi} \\ &= \frac{1}{2\sqrt{\pi}} e^{-\frac{z^2}{4}}. \end{aligned}$$

Por lo tanto:

$$f_Z = \frac{1}{2\sqrt{\pi}} e^{-\frac{z^2}{4}}.$$

Ejercicio 2

Si $\gamma = 1$ entonces la *pdf* de la distribución Cauchy está dada por:

$$f(x) = \frac{1}{\pi(1+x^2)}$$

Para así obtener que la *cdf* es:

$$F(x) = \frac{1}{\pi} \arctan\left(\frac{x}{\gamma}\right) + \frac{1}{2}$$

con inversa

$$F^{-1}(u) = \gamma \tan(\pi(u - 1/2))$$

Para así obtener que $X = F^{-1}(U) \sim \text{Cauchy}$ con $U \sim \text{Uniforme}(0, 1)$

```
In [18]: import matplotlib.pyplot as plt
import numpy as np
import math
import seaborn as sns
```

- Implementación:

```
In [19]: ## Simulación Cauchy

def cauchy(gama,n):
    u = np.random.uniform(0,1,n)
    Fu = gama*np.tan(np.pi*(u-1/2))
    return Fu
```

```
In [20]: cauchy(1,10)
```

```
Out[20]: array([ 0.63263426, -1.68139685, -6.84137233,  1.36035465, -1.1781620
5,
      -0.59165364,   0.18939525,   0.67118608,   2.33032707, -0.0337923
])
```

```
In [21]: #Definicion distribucion gaussiana analitica
def gaussian(x,mu,sigma):
    dist = np.zeros([len(x)])
    for i in range(len(x)):
        dist[i] = 1./np.sqrt(2*math.pi*sigma**2)*math.e**(-(x[i]-mu)**2/(2*sigma**2))
    return dist
points = 100000
t = np.linspace(-5,5,points)
plt.plot(t,gaussian(t,0,1),'-k',label='Atractor')

#Parametro: suma de distribuciones
iteration = 20

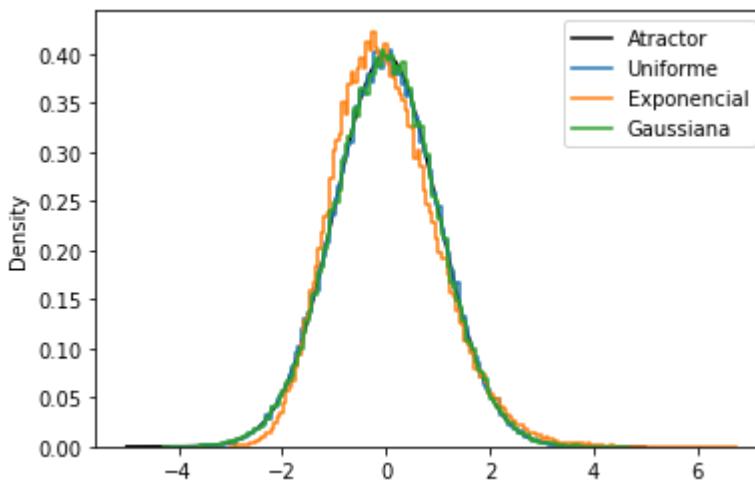
# a) uniforme
a = 1
x = np.zeros([points])
for i in range(points):
    for k in range(iteration):
        x[i] += np.random.uniform(-a,a)

sns.histplot(data=(x-np.mean(x))/np.std(x),stat="density", element="step",
             fill=False,kde=False,label='Uniforme')

# b) exponencial
lam = 1
x = np.zeros([points])
for i in range(points):
    for k in range(iteration):
        x[i] += np.random.exponential(1./lam)
sns.histplot(data=(x-np.mean(x))/np.std(x),stat="density", element="step",
             fill=False,kde=False,label='Exponencial')

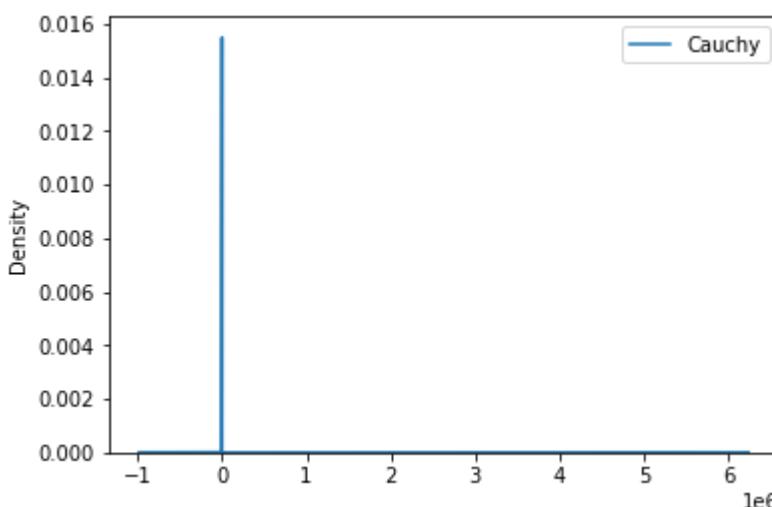
# c) normal
mu = 0
sigma = 1
x = np.zeros([points])
for i in range(points):
    for k in range(iteration):
        x[i] += np.random.normal(mu,sigma)
sns.histplot(data=(x-np.mean(x))/np.std(x),stat="density", element="step",
             fill=False,kde=False,label='Gaussiana')

plt.legend()
plt.show()
```



```
In [22]: # d) Cauchy
#mu = 0
#sigma = 1
for i in range(points):
    for k in range(iteration):
        x[i] += float(cauchy(1,1))
sns.histplot(data=x, stat="density", element="step", fill=False, kde=False, label='Cauchy')

plt.legend()
plt.show()
```



```
In [23]: x
```

```
Out[23]: array([ 34.77036102, -11.68675372,  11.16529017, ..., -247.3757969,
   6,
  11.05863661,  23.0273656 ])
```

Por lo tanto la distribución converge a una solución degenerada.

Ejercicio 3

Supongamos que:

$$\phi((A - \phi(A))(B - \phi(B)(A - \phi(A))) = 0$$

Desarrollando el lado izquierdo de la igualdad anterior obtenemos que:

$$\begin{aligned} &\Rightarrow \phi((A - \phi(A))[BA - B\phi(A) - \phi(B)A + \phi(B)\phi(A)]) = 0 \\ &\Leftrightarrow \phi(ABA - AB\phi(A) - A\phi(B)A + A\phi(B)\phi(A) - \phi(A)BA + \phi(A)B\phi(A) + \phi(A)\phi(B)A - \\ &\quad \phi(ABA) - \phi(AB)\phi(A) - \phi(A)\phi(B)\phi(A) + \phi(A)\phi(B)\phi(A) - \phi(A)\phi(BA) + \phi(A)\phi(B)\phi(A) \\ &\Rightarrow \phi(ABA) - \phi(AB)\phi(A) - \phi(A)\phi(BA) + \phi(A)\phi(B)\phi(A) = 0 \\ &\Rightarrow \phi(ABA) - \phi(AB)\phi(A) - \phi(A)\phi(B)\phi(A) + \phi(A)\phi(B)\phi(A) = 0 \\ &\Rightarrow \phi(ABA) - \phi(AB)\phi(A) = 0 \\ &\Rightarrow \phi(ABA) = \phi(AB)\phi(A) \\ &\Rightarrow \phi(ABA) = \phi(A)\phi(B)\phi(A) \\ &\Rightarrow \phi(ABA) = \phi(A)\phi(A)\phi(B) \\ &\Rightarrow \phi(ABA) = \phi(A^2)\phi(B) \\ &\Rightarrow \phi(ABA) = \phi(A^2B) \end{aligned}$$

Ejercicio 4

Se utiliza sympy para las soluciones numéricas de las ecuaciones simbólicas.

```
In [24]: import numpy as np
import matplotlib.pyplot as plt
from numpy import linalg as LA
import seaborn as sns
```

```
In [25]: m = 1000
p = 100
n = 200
E_r1 = []
r = 0.2
## Monte CARLO
for i in range(m):
    ### GOE
    H = np.random.normal(size=(p, p))
    H = (H+np.transpose(H))/2
    ### WISHART
    X = np.random.normal(size=(p, n))
    W = np.matmul(X,np.transpose(X))
    ### GOE + WISHART ESCALAMIENTO
    H = r*H/np.sqrt(p) + (1-r)*W/n
    eig = list(LA.eigh(H)[0])
    E_r1 = E_r1 + eig

    #### r2

m = 1000
p = 100
n = 200
E_r2 = []
r = 0.4
## Monte CARLO
for i in range(m):
    ### GOE
    H = np.random.normal(size=(p, p))
    H = (H+np.transpose(H))/2
    ### WISHART
    X = np.random.normal(size=(p, n))
    W = np.matmul(X,np.transpose(X))
    ### GOE + WISHART ESCALAMIENTO
    H = r*H/np.sqrt(p) + (1-r)*W/n
    eig = list(LA.eigh(H)[0])
    E_r2 = E_r2 + eig

    #### r3

m = 1000
p = 100
n = 200
E_r3 = []
r = 0.6
## Monte CARLO
for i in range(m):
    ### GOE
    H = np.random.normal(size=(p, p))
    H = (H+np.transpose(H))/2
    ### WISHART
    X = np.random.normal(size=(p, n))
    W = np.matmul(X,np.transpose(X))
    ### GOE + WISHART ESCALAMIENTO
    H = r*H/np.sqrt(p) + (1-r)*W/n
```

```
eig = list(LA.eigh(H) [0])
E_r3 = E_r3 + eig

#### r4

m = 1000
p = 100
n = 200
E_r4 = []
r = 0.8
## Monte CARLO
for i in range(m):
    ## GOE
    H = np.random.normal(size=(p, p))
    H = (H+np.transpose(H))/2
    ## WISHART
    X = np.random.normal(size=(p, n))
    W = np.matmul(X,np.transpose(X))
    ## GOE + WISHART ESCALAMIENTO
    H = r*H/np.sqrt(p) + (1-r)*W/n
    eig = list(LA.eigh(H) [0])
    E_r4 = E_r4 + eig
```

In [29]:

```
from sympy import *
from sympy.solvers import solve
from sympy import re, im, E, I

#### R1
## DOMINIO
E = E_r1 + E_r2 + E_r3 + E_r4
Z = list(np.linspace(min(E),max(E),100))
## CONSTANTES
q = p/n
w = 0.2
sols = []
## SOLVER
for z in Z:
    G = symbols('G')
    sol = solve(w**2*G/2 + (1-w)/(1-q*(1-w)*G)+1/G-z,G)
    sols.append(sol)
## EXTRACCIÓN SOLUCIONES
fx1 = []
for i in range(len(sols)):
    for k in range(len(sols[i])):
        complex_test = sols[i][k].is_real
        if complex_test == False:
            fx1.append(float(im(sols[i][k])))
            break
fx1 = [abs(fx1[i])/np.pi for i in range(len(fx1))]

#### R2
## CONSTANTES
w = 0.4
sols = []
## SOLVER
for z in Z:
    G = symbols('G')
    sol = solve(w**2*G/2 + (1-w)/(1-q*(1-w)*G)+1/G-z,G)
    sols.append(sol)
## EXTRACCIÓN SOLUCIONES
fx2 = []
for i in range(len(sols)):
    for k in range(len(sols[i])):
        complex_test = sols[i][k].is_real
        if complex_test == False:
            fx2.append(float(im(sols[i][k])))
            break
fx2 = [abs(fx2[i])/np.pi for i in range(len(fx2))]

#### R3
## CONSTANTES
w = 0.6
sols = []
## SOLVER
for z in Z:
    G = symbols('G')
    sol = solve(w**2*G/2 + (1-w)/(1-q*(1-w)*G)+1/G-z,G)
    sols.append(sol)
```

```
## EXTRACCIÓN SOLUCIONES
fx3 = []
for i in range(len(sols)):
    for k in range(len(sols[i])):
        complex_test = sols[i][k].is_real
        if complex_test == False:
            fx3.append(float(im(sols[i][k])))
            break
fx3 = [abs(fx3[i])/np.pi for i in range(len(fx3))]

##### R4
## CONSTANTES
w = 0.8
sols = []
## SOLVER
for z in Z:
    G = symbols('G')
    sol = solve(w**2*G/2 + (1-w)/(1-q*(1-w)*G)+1/G-z, G)
    sols.append(sol)
## EXTRACCIÓN SOLUCIONES
fx4 = []
for i in range(len(sols)):
    for k in range(len(sols[i])):
        complex_test = sols[i][k].is_real
        if complex_test == False:
            fx4.append(float(im(sols[i][k])))
            break
fx4 = [abs(fx4[i])/np.pi for i in range(len(fx4))]
```

```
In [33]: ##### SEMI CÍRCULO
## CONSTANTES
w = 0
sols = []
## SOLVER
for z in Z:
    G = symbols('G')
    sol = solve(w**2*G/2 + (1-w) / (1-q*(1-w)*G)+1/G-z, G)
    sols.append(sol)
## EXTRACCIÓN SOLUCIONES
fx5 = []
for i in range(len(sols)):
    for k in range(len(sols[i])):
        complex_test = sols[i][k].is_real
        if complex_test == False:
            fx5.append(float(im(sols[i][k])))
            break
fx5 = [abs(fx5[i])/np.pi for i in range(len(fx5))]

##### Marcenko Pastur
## CONSTANTES
w = 1
sols = []
## SOLVER
for z in Z:
    G = symbols('G')
    sol = solve(w**2*G/2 + (1-w) / (1-q*(1-w)*G)+1/G-z, G)
    sols.append(sol)
## EXTRACCIÓN SOLUCIONES
fx6 = []
for i in range(len(sols)):
    for k in range(len(sols[i])):
        complex_test = sols[i][k].is_real
        if complex_test == False:
            fx6.append(float(im(sols[i][k])))
            break
fx6 = [abs(fx6[i])/np.pi for i in range(len(fx6))]
```

```
In [32]: len(fx5)
```

```
Out[32]: 68
```

```
In [34]: sns.kdeplot(data=E_r1,color='blue',label='0.2')
sns.kdeplot(data=E_r2,color='red',label='0.4')
sns.kdeplot(data=E_r3,color='green',label='0.6')
sns.kdeplot(data=E_r4,color='yellow',label='0.8')
sns.lineplot(Z, fx1)
sns.lineplot(Z, fx2)
sns.lineplot(Z, fx3)
sns.lineplot(Z, fx4)
#sns.lineplot(Z, fx5,color='black',label='Semi-Circulo')
#sns.lineplot(Z, fx6,color='black',label='MP')
plt.legend()
plt.show()
```

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

FutureWarning

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

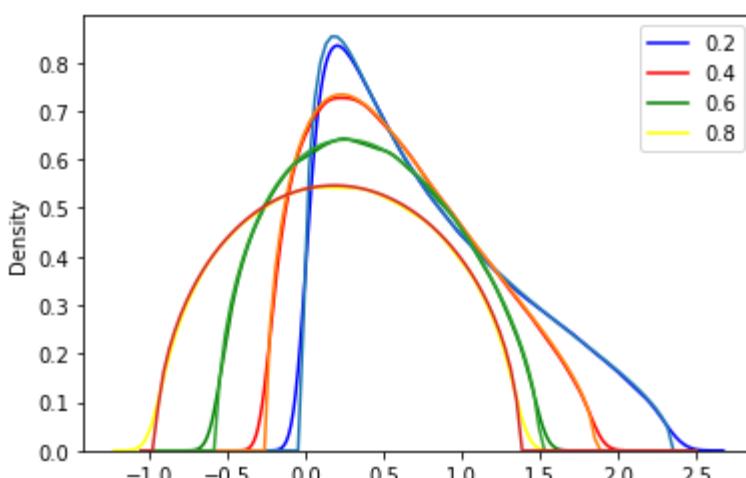
FutureWarning

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

FutureWarning

/usr/local/lib/python3.7/dist-packages/seaborn/_decorators.py:43: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

FutureWarning



Ejercicio 5

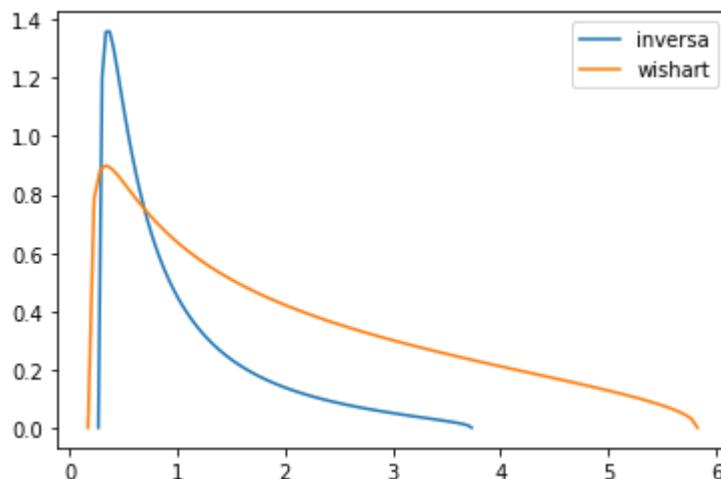
- Wishart Inversa

```
In [35]: r = 1/2
x_plus = 2*r+ 1.0+ np.sqrt(2*(r+1))
x_minus = 2*r+1.0-np.sqrt(2*(r+1))
x = np.linspace(x_minus,x_plus, num = 100, endpoint = True)
rho1 = np.sqrt((x_plus-x)*(x-x_minus)) / (2*np.pi*r*x**2)
```

- Wishart normal

```
In [36]: q = 1/2
y_plus = (1+(q)**(-1/2))**2
y_minus = (1-(q)**(-1/2))**2
y = np.linspace(y_minus,y_plus, num = 100, endpoint = True)
rho2 = np.sqrt((y-y_minus)*(y_plus-y)) / (2*np.pi*y*q)
```

```
In [38]: plt.plot(x,rho1,label='inversa')
plt.plot(y,rho2,label='wishart')
plt.legend()
plt.show()
```



Ejercicio 6

```
In [40]: ##### PARAMETROS
b=1.5
q=0.17

G_im=[]
G_real=[]
Z = list(np.linspace(min(E),max(E),100))
for i in range(Npts):
    imag=np.array([10e-20,10e-20,10e-20,10e-20])
    z=x[i]
    '''SOLUCION SIMBOLICA'''
    t = symbols('t') # Simbolos
    Solve = solve(q*2*t**4+2*q*(q-b*z)*t**3+(z2-2*b*q*z+q2-1)*t**2-2*t-1,t) # Ecuación

    solution=np.array(Solve)
    n=solution.shape[0]
    for j in range (n):
        imag[j]=im(Solve[j])

    G_im.append(max(imag[0],imag[1],imag[2],imag[3]))


G_imaginarios=np.array(G_im)
res_2=G_imaginarios*(1/(np.pi**2*x))
```

```
-----
NameError                                 Traceback (most recent call
last)
<ipython-input-40-3b3b48665659> in <module>()
      5 G_im=[]
      6 G_real=[]
----> 7 for i in range(Npts):
      8     imag=np.array([10e-20,10e-20,10e-20,10e-20])
      9     z=x[i]

NameError: name 'Npts' is not defined
```

```
In [ ]: !jupyter nbconvert --to html T5_TSE.ipynb
```