

COE782- ML - Lista2 -Parte prática - E1

Inferência Baysiana Sequencial

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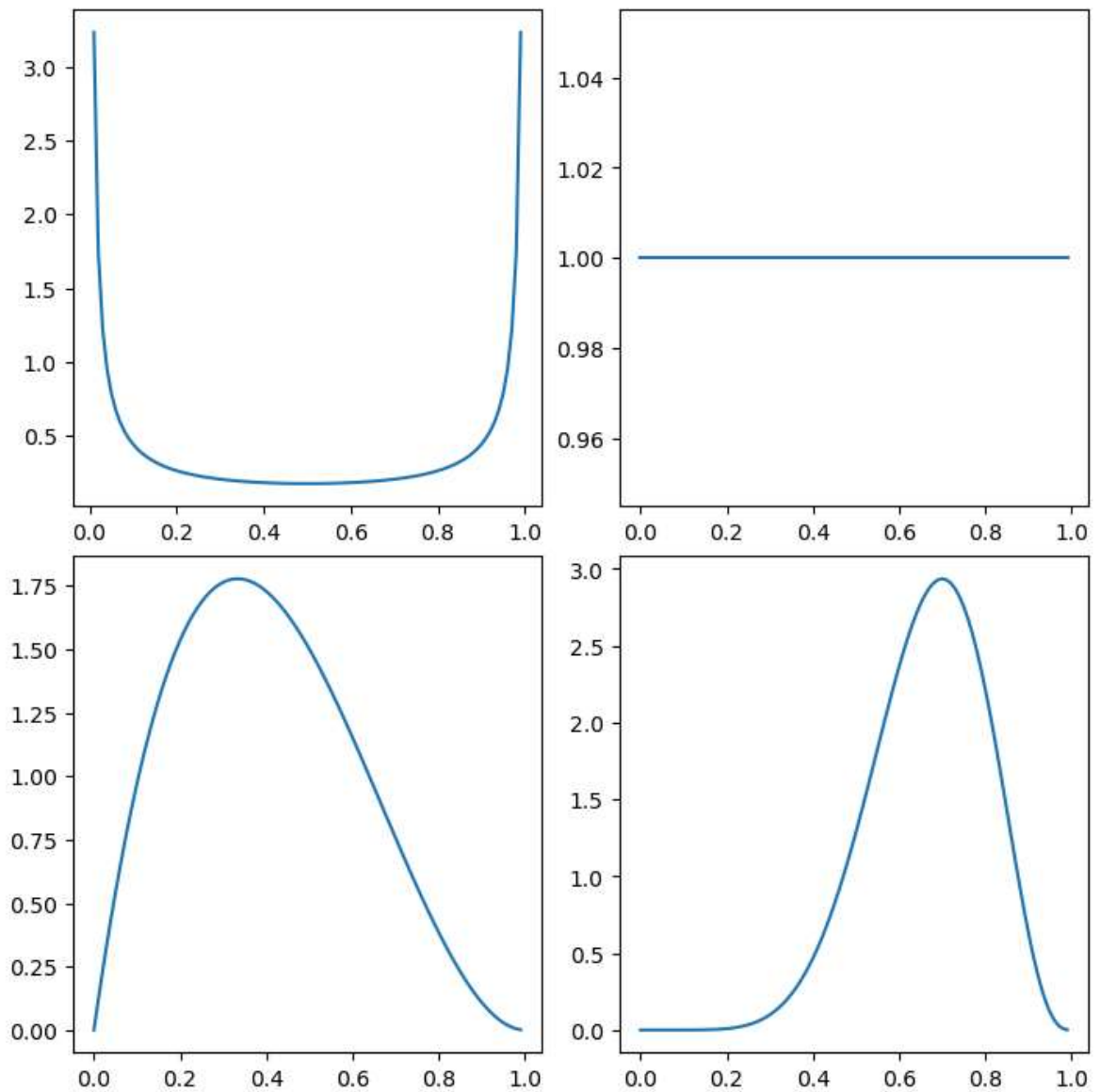
DRE:125228569

```
In [1]: #Referências:  
#https://docs.scipy.org/doc/scipy/reference/generated/scipy.stats.beta.html#scip  
#https://docs.scipy.org/doc/scipy/reference/generated/scipy.stats.binom.html#sci
```

```
import numpy as np  
from scipy.stats import beta, binom  
import matplotlib.pyplot as plt
```

```
In [2]: #Distribuição Beta  
a = [0.1, 1, 2, 8]  
b = [0.1, 1, 3, 4]
```

```
In [3]: #fig 2.2 do Bishop  
Nx = 100  
mub = np.arange(0., 1., 1/Nx).reshape(Nx,1)  
  
fig, axs = plt.subplots(2, 2, figsize=(7, 7), layout='constrained')  
  
axs[0,0].plot(mub, beta.pdf(mub, a[0], b[0]))  
axs[0,1].plot(mub, beta.pdf(mub, a[1], b[1]))  
axs[1,0].plot(mub, beta.pdf(mub, a[2], b[2]))  
axs[1,1].plot(mub, beta.pdf(mub, a[3], b[3]))  
plt.show()
```

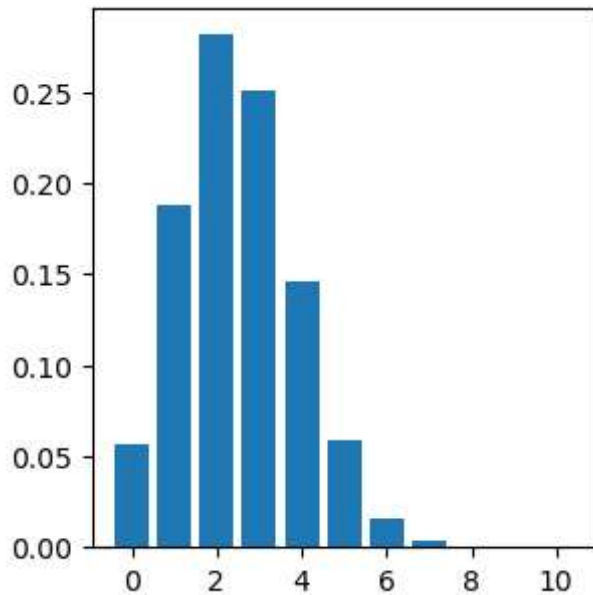


```
In [4]: #distribuição binomial
N, mu = 10, 0.25
m = np.arange(11)

fbin = []

fbin += [binom.pmf(i, N, mu) for i in range(len(m))]
```

```
In [5]: #fig 2.1 do Bishop
fig, axs = plt.subplots(1, 1, figsize=(3, 3), layout='constrained')
axs.bar(m, fbin)
plt.show()
```



```
In [6]: #exemplo da figura 2.3 Bishop
N = 1                                #1 jogada apenas
mu_b = np.arange(0., 1., 1/Nx)

a = 2
b = 2
```

```
In [7]: #Cara = 1 (1 jogada)
m = N      #no exemplo m = 1 (cara = 1 por exemplo)
fpri = []  #priori
lh = []    #verossimilhança
fpos = []  #posteriori
prob = 0.5 #probabilidade de cara/coroa (denominador)

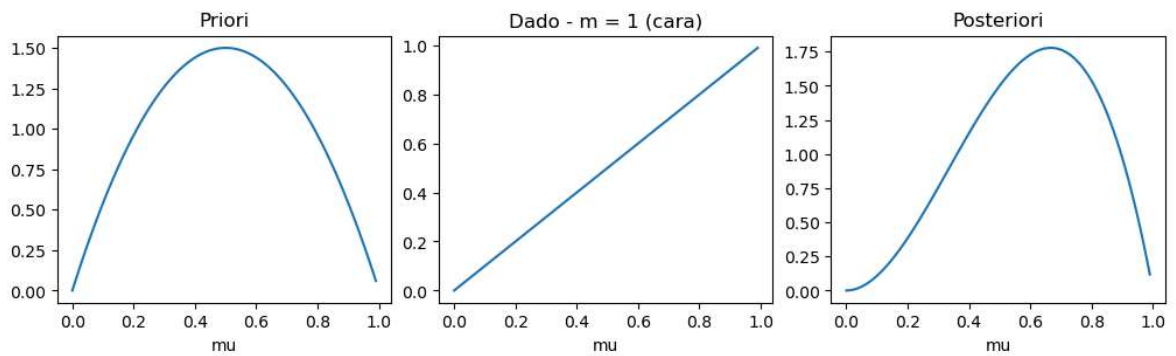
fpri += [beta.pdf(mu_b[i], a, b) for i in range(len(mu_b))]
lh += [binom.pmf(m, N, mu_b[i]) for i in range(len(mu_b))]
fpos += [binom.pmf(m, N, mu_b[i])*beta.pdf(mu_b[i], a, b)/prob for i in range(len(mu_b))]

#fig 2.3 do Bishop
fig, (ax1, ax2, ax3) = plt.subplots(1, 3, figsize=(10, 3), layout='constrained')
ax1.plot(mu_b, fpri)
ax1.set_xlabel("mu")
ax1.set_title("Priori")

ax2.plot(mu_b, lh)
ax2.set_xlabel("mu")
ax2.set_title("Dado - m = 1 (cara)")

ax3.plot(mu_b, fpos)
ax3.set_xlabel("mu")
ax3.set_title("Posteriori")

plt.show()
```



```
In [8]: #Coroa = 0 (1 jogada)
m = 0
fpri = []                                #priori
lh = []                                  #verossimilhança
fpos = []                                #posteriori
prob = 0.5                               #probabilidade de cara/coroa (denominador - p

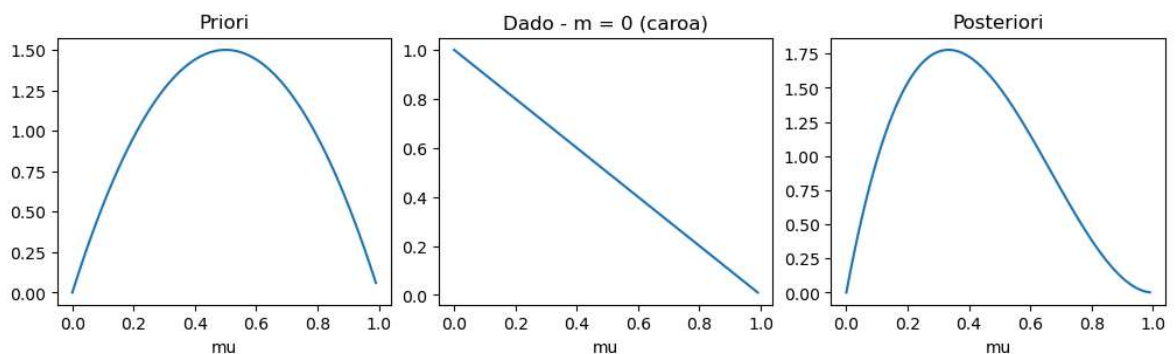
fpri += [beta.pdf(mu_b[i], a, b) for i in range(len(mu_b))]
lh += [binom.pmf(m, N, mu_b[i]) for i in range(len(mu_b))]
fpos += [binom.pmf(m, N, mu_b[i])*beta.pdf(mu_b[i], a, b)/prob for i in range(le

#fig 2.3 do Bishop adaptado
fig, (ax1, ax2, ax3) = plt.subplots(1, 3, figsize=(10, 3), layout='constrained'
ax1.plot(mu_b, fpri)
ax1.set_xlabel("mu")
ax1.set_title("Priori")

ax2.plot(mu_b, lh)
ax2.set_xlabel("mu")
ax2.set_title("Dado - m = 0 (caroa)")

ax3.plot(mu_b, fpos)
ax3.set_xlabel("mu")
ax3.set_title("Posteriori")

plt.show()
```



```
In [9]: #gera as jogadas (Dado m) com distribuição Bernoulli
#https://numpy.org/doc/stable/reference/random/generated/numpy.random.Generator.

m = np.random.default_rng().geometric(p=0.7, size=5)
for i in range(len(m)):
    if m[i] > 1:
        m[i] = 0
m
```

```
Out[9]: array([1, 1, 0, 0, 1], dtype=int64)
```

```
In [10]: len(m)
```

```
Out[10]: 5
```

```
In [11]: #Considerando 5 jogadas aleatórias
fpri= []                                #priori
lh = []                                #verossimilhança
fpos = []                              #posteriori
prob = 0.5                             #probabilidade de cara/coroa (denominador - p

for k in range (len(m)):
    if k == 0:
        fpri += [beta.pdf(mu_b[i], a, b) for i in range(len(mu_b))]
        lh += [binom.pmf(m[k], N, mu_b[i]) for i in range(len(mu_b))]
        fpos += [binom.pmf(m[k], N, mu_b[i])*beta.pdf(mu_b[i], a, b)/prob for i

        #fig 2.3 do Bishop adaptado
        print('Jogada', k+1, 'com resultado =', m[k])
        fig, (ax1, ax2, ax3) = plt.subplots(1, 3, figsize=(10, 3), layout='cons
        ax1.plot(mu_b, fpri)
        ax1.set_xlabel("mu")
        ax1.set_title("Priori")

        ax2.plot(mu_b, lh)
        ax2.set_xlabel("mu")
        ax2.set_title("Dado - m = "+ str(m[k]))

        ax3.plot(mu_b, fpos)
        ax3.set_xlabel("mu")
        ax3.set_title("Posteriori")
        plt.show()

        fpri = fpos                                #atualiza priori
        lh = []                                    #zera joga para próxima rodada
        fpos = []                                  #zera posteriori

    else:

        lh += [binom.pmf(m[k], N, mu_b[i]) for i in range(len(mu_b))]
        fpos += [binom.pmf(m[k], N, mu_b[i])*fpri[i]/prob for i in range(len(mu_

        #fig 2.3 do Bishop adaptado
        print('Jogada', k+1, 'com resultado =', m[k])
        fig, (ax1, ax2, ax3) = plt.subplots(1, 3, figsize=(10, 3), layout='cons
        ax1.plot(mu_b, fpri)
        ax1.set_xlabel("mu")
        ax1.set_title("Priori")

        ax2.plot(mu_b, lh)
        ax2.set_xlabel("mu")
        ax2.set_title("Dado - m = "+ str(m[k]))

        ax3.plot(mu_b, fpos)
        ax3.set_xlabel("mu")
        ax3.set_title("Posteriori")
```

```
plt.show()
```

```
fpri = fpos
```

```
lh = []
```

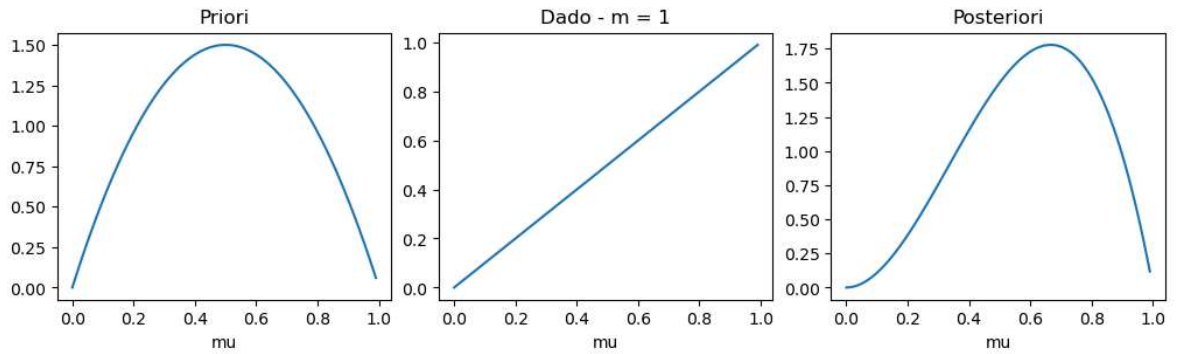
```
fpos = []
```

```
#atualiza priori
```

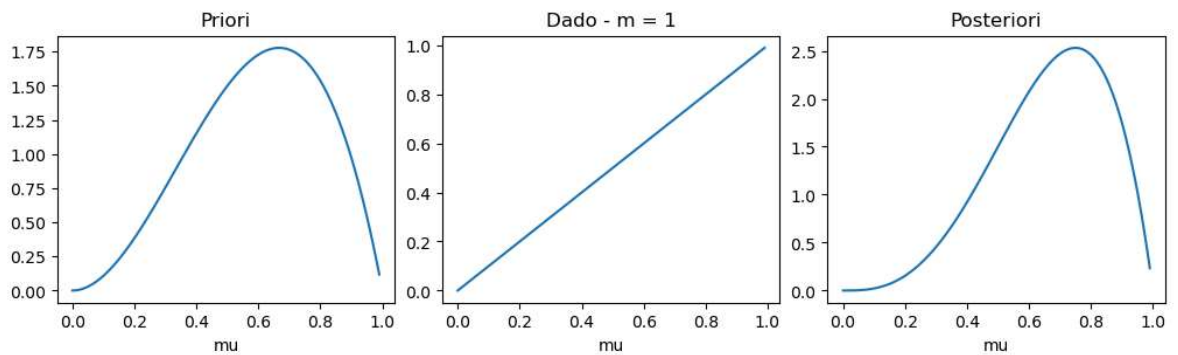
```
#zera joga para próxima rodada
```

```
#zera posteriori
```

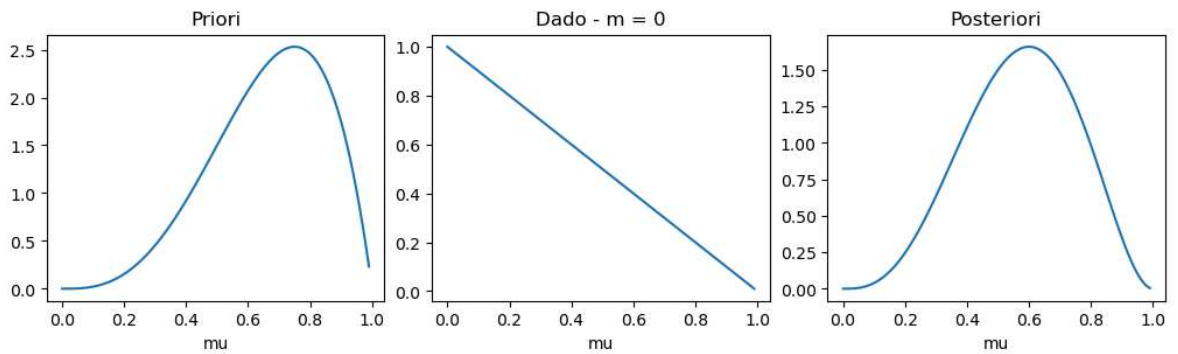
Jogada 1 com resultado = 1



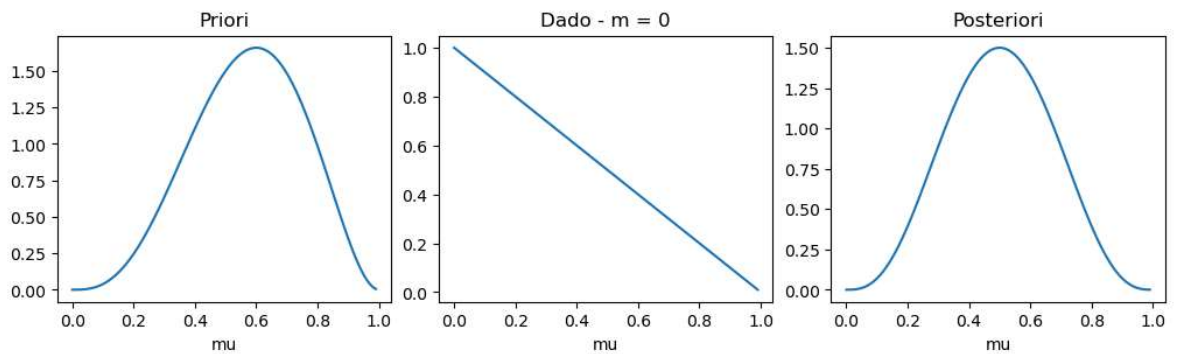
Jogada 2 com resultado = 1



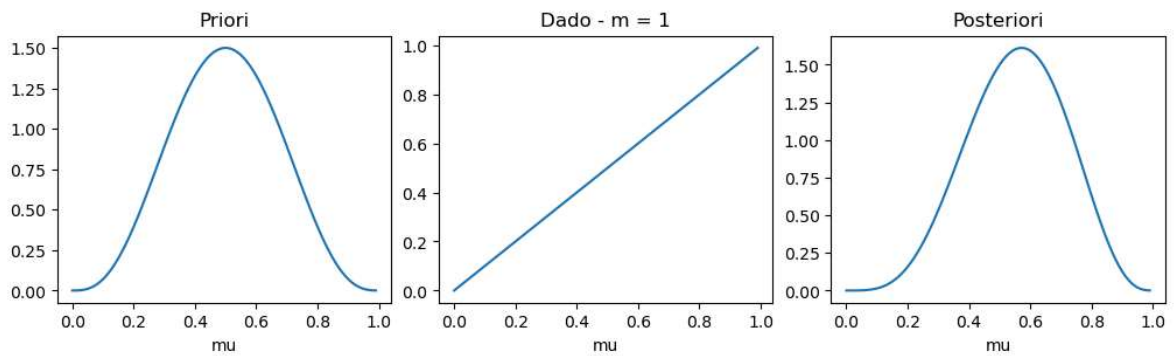
Jogada 3 com resultado = 0



Jogada 4 com resultado = 0



Jogada 5 com resultado = 1



```
In [12]: #Exercício E1
#1º Caso
a = 1
b = 1
prob = 0.7                                     #probabilidade de cair cara(denominador - p(x
```

```
In [13]: #Considerando 5 jogadas aleatórias
fpri = []                                     #priori
lh = []                                       #verossimilhança
fpos = []                                    #posteriori

for k in range (len(m)):
    if k == 0:
        fpri += [beta.pdf(mu_b[i], a, b) for i in range(len(mu_b))]
        lh += [binom.pmf(m[k], N, mu_b[i]) for i in range(len(mu_b))]
        fpos += [binom.pmf(m[k], N, mu_b[i])*beta.pdf(mu_b[i], a, b)/prob for i

        #plota resultados
        print('Jogada', k+1, 'com resultado =', m[k])
        fig, (ax1, ax2, ax3) = plt.subplots(1, 3, figsize=(10, 3), layout='cons
        ax1.plot(mu_b, fpri)
        ax1.set_xlabel("mu")
        ax1.set_title("Priori")

        ax2.plot(mu_b, lh)
        ax2.set_xlabel("mu")
        ax2.set_title("Dado - m = "+ str(m[k]))

        ax3.plot(mu_b, fpos)
        ax3.set_xlabel("mu")
        ax3.set_title("Posteriori")
        plt.show()

        fpri = fpos                             #atualiza priori
        lh = []                                  #zera joga para próxima rodada
        fpos = []                                #zera posteriori

    else:

        lh += [binom.pmf(m[k], N, mu_b[i]) for i in range(len(mu_b))]
        fpos += [binom.pmf(m[k], N, mu_b[i])*fpri[i]/prob for i in range(len(mu_

        #plota resultados
        print('Jogada', k+1, 'com resultado =', m[k])
        fig, (ax1, ax2, ax3) = plt.subplots(1, 3, figsize=(10, 3), layout='cons
```

```

ax1.plot(mu_b, fpri)
ax1.set_xlabel("mu")
ax1.set_title("Priori")

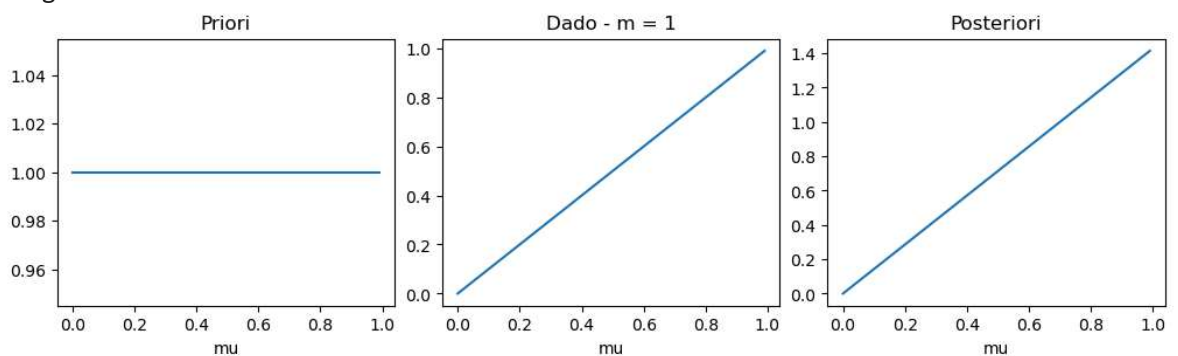
ax2.plot(mu_b, lh)
ax2.set_xlabel("mu")
ax2.set_title("Dado - m = "+ str(m[k]))

ax3.plot(mu_b, fpos)
ax3.set_xlabel("mu")
ax3.set_title("Posteriori")
plt.show()

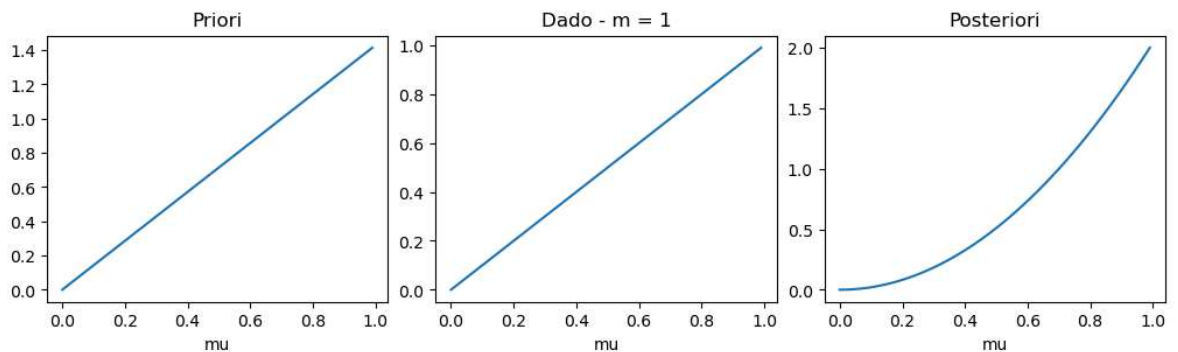
fpri = fpos                                #atualiza priori
lh = []                                    #zera joga para próxima rodada
fpos = []                                  #zera posteriori

```

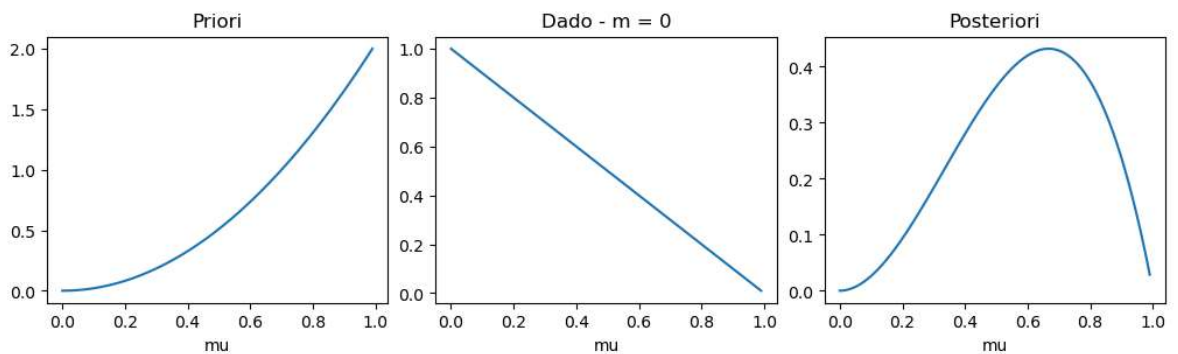
Jogada 1 com resultado = 1



Jogada 2 com resultado = 1



Jogada 3 com resultado = 0



Jogada 4 com resultado = 0


```

fpos = []                                     #zera posteriori

else:

    lh += [binom.pmf(m[k], N, mu_b[i]) for i in range(len(mu_b))]
    fpos += [binom.pmf(m[k], N, mu_b[i])*fpri[i]/prob for i in range(len(mu_b))]

    #plota resultados
    print('Jogada', k+1, 'com resultado =', m[k])
    fig, (ax1, ax2, ax3) = plt.subplots(1, 3, figsize=(10, 3), layout='constrained')
    ax1.plot(mu_b, fpri)
    ax1.set_xlabel("mu")
    ax1.set_title("Priori")

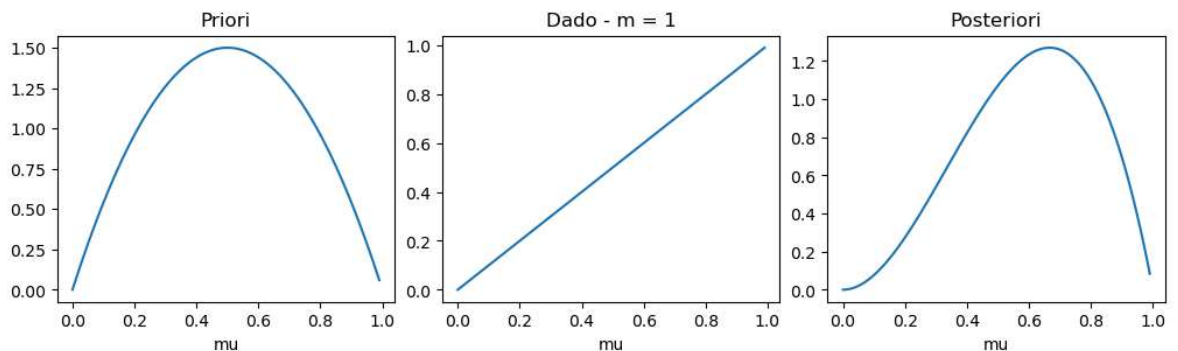
    ax2.plot(mu_b, lh)
    ax2.set_xlabel("mu")
    ax2.set_title("Dado - m = "+ str(m[k]))

    ax3.plot(mu_b, fpos)
    ax3.set_xlabel("mu")
    ax3.set_title("Posteriori")
    plt.show()

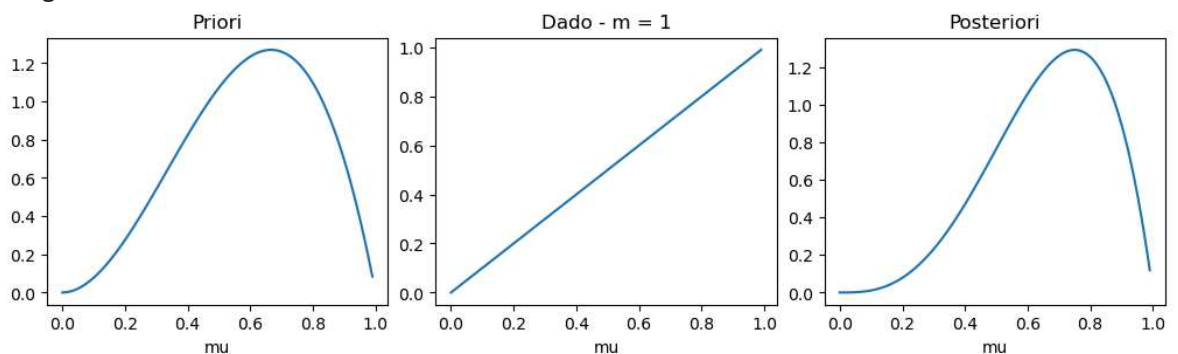
    fpri = fpos                               #atualiza priori
    lh = []                                   #zera joga para próxima rodada
    fpos = []                                 #zera posteriori

```

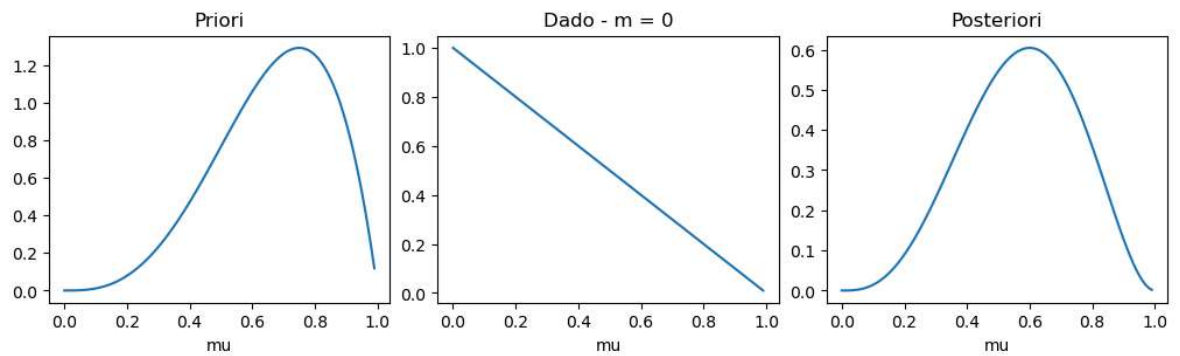
Jogada 1 com resultado = 1



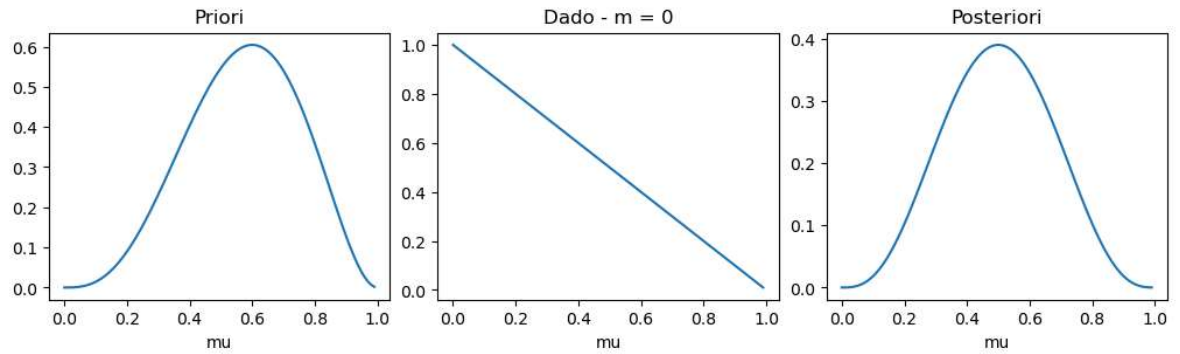
Jogada 2 com resultado = 1



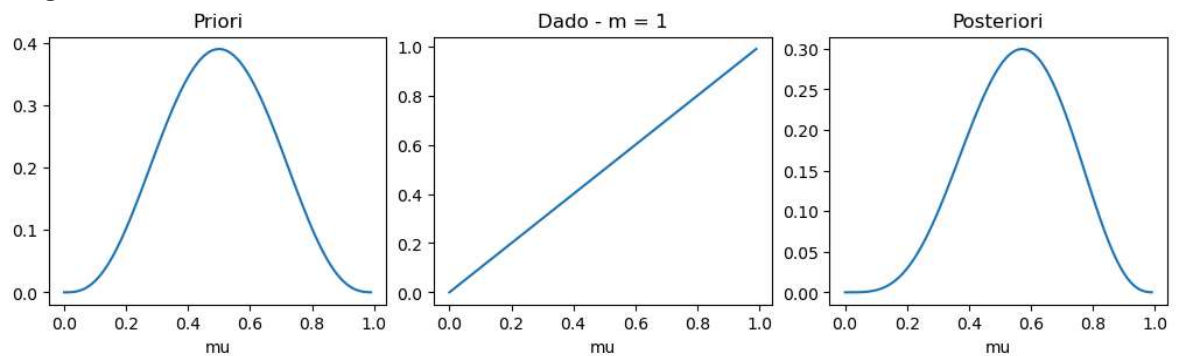
Jogada 3 com resultado = 0



Jogada 4 com resultado = 0



Jogada 5 com resultado = 1



Conclusão : A distribuição a priori influencia apenas a posteriori para 1 jogada. A medida que o número de jogadas aumenta, os dois casos convergem para a mesma distribuição a posteriori.

In []: