

Exercise8

November 17, 2022

1 Exercise 8

```
[1]: import numpy as np
import matplotlib.pyplot as plt
```

1.1 a)

Die Likelihood-Funktion L und die negative log-likelihood-Funktion lauten:

$$L(\lambda) = \prod_i \frac{\lambda^{x_i}}{x_i!} e^{-\lambda}$$

$$l(\lambda) = -\ln(L) = -\sum_i (x_i \ln(\lambda) - \ln(x_i!) - \lambda)$$

$$\Rightarrow l(\lambda) = 3\lambda - (13 + 8 + 9)\ln(\lambda) + \ln(13! \cdot 8! \cdot 9!)$$

```
[2]: #def poisson(x, y): # Poisson-Verteilung (y := lambda)
#     return y**x/np.math.factorial(x)*np.exp(-y)

def l(y): # negative log-likelihood function (y := lambda)
    return 3*y -(13+8+9)*np.log(y) + np.log(np.math.factorial(13)) + np.log(np.
↪math.factorial(8)) + np.log(np.math.factorial(9))
    #np.log(np.math.factorial(13)*np.math.factorial(8)*np.math.factorial(9))
```

```
[3]: fig, ax = plt.subplots(1,1)

x = np.linspace(0.1, 40, 10000)
y = l(x)

ax.plot(x, y, label = "$l(\lambda)$", color = "cornflowerblue")
plt.vlines(10, 0, 120, ls = "dashed", color = "forestgreen", label = ↪
↪"$\lambda_{\min}$")

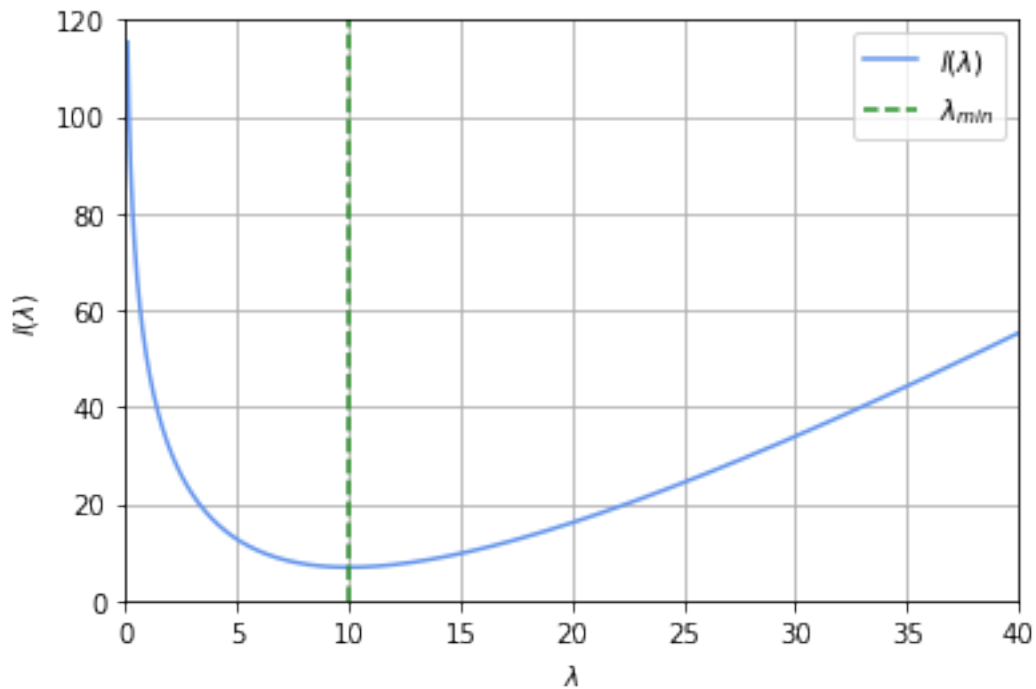
ax.set_xlabel("$\lambda$")
ax.set_ylabel("$l(\lambda)$")
ax.set_xlim(0, 40)
ax.set_ylim(0, 120)

ax.legend()
```

```
plt.grid()

print("Minimum: (", 10, ",", l(10),",")")
```

Minimum: (10 , 6.881041446128762)



1.1.1 b)

Minimum analytisch:

$$\begin{aligned}\frac{dl(\lambda)}{d\lambda} &\stackrel{!}{=} 0 \\ \Rightarrow 3 - \frac{13+8+9}{\lambda} &= 0 \\ \Leftrightarrow \lambda &= 10\end{aligned}$$

1.2 c)

```
[4]: sigma1 = x[np.isclose(y, l(10)+0.5, rtol = 0.0001)] # estimating intersection
      ↪ between log-likelihood function and l_min + 1/2

sigma2 = x[np.isclose(y, l(10)+2, rtol = 0.0002)]

sigma3 = x[np.isclose(y, l(10)+9/2, rtol = 0.0003)]

print(sigma1)
```

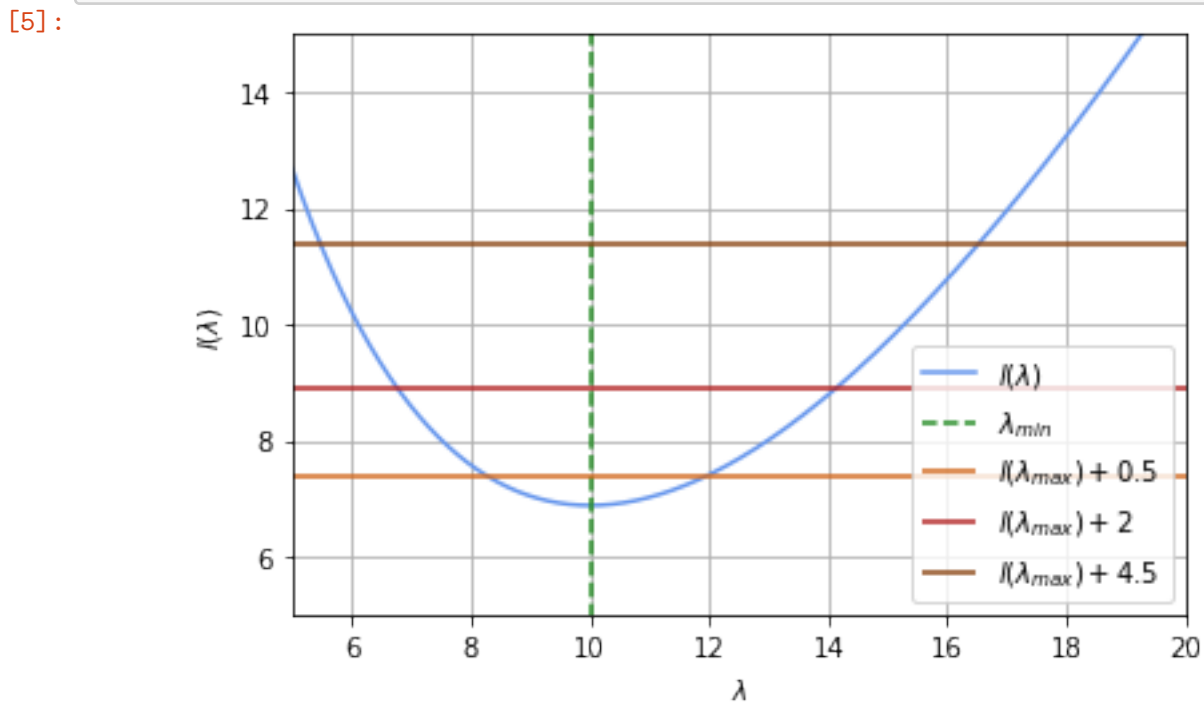
```
print(sigma2)
print(sigma3)
```

```
[ 8.28430843 11.93951395]
[ 6.77992799 14.11029103]
[ 5.47506751 16.52049205]
```

```
[5]: plt.close()
fig1, ax1 = fig, ax

ax1.hlines(l(10)+0.5, 0, 40, color = "chocolate", label = "$l(\lambda_{max}) + \vartriangle \rightarrow 0.5$")
ax1.hlines(l(10)+2, 0, 40, color = "firebrick", label = "$l(\lambda_{max}) + \vartriangle \rightarrow 2$")
ax1.hlines(l(10)+9/2, 0, 40, color = "saddlebrown", label = "$l(\lambda_{max}) \vartriangle \rightarrow + 4.5$")
ax1.set_ylim(5, 15)
ax1.set_xlim(5, 20)

ax1.legend()
fig1
```



Die genannten Intervalle beschreiben die 1, 2 und 3- σ -Umgebungen des Schätzwertes für λ .

1.3 d)

Entwickeln der negativen log-likelihood-Funktion um das Minimum:

$$\frac{dl(\lambda)}{d\lambda} = 3 - \frac{30}{\lambda}$$

$$\Rightarrow l'(10) = 0$$

$$\frac{d^2l(\lambda)}{d\lambda^2} = \frac{30}{\lambda^2}$$

$$\Rightarrow l''(10) = \frac{3}{10}$$

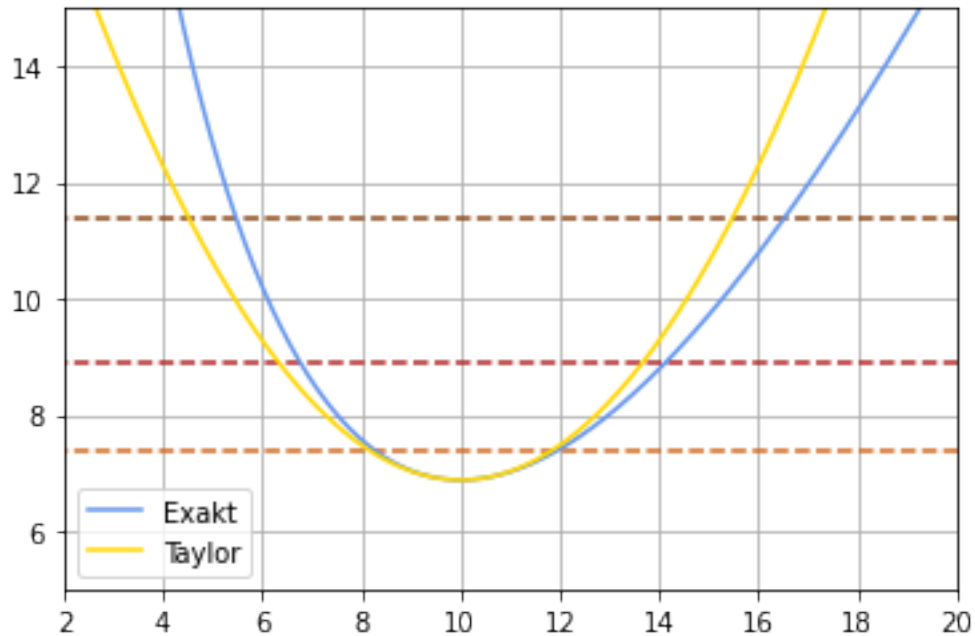
```
[6]: l(10)
```

```
[6]: 6.881041446128762
```

$$l(\lambda_{\min} = 10) \approx 6.88$$

$$\Rightarrow T(\lambda|\lambda_{\min}) \approx 6.88 + \frac{3}{20}(\lambda - 10)^2 + \mathcal{O}(\lambda^3)$$

```
[7]: def T(x):  
    return l(10) + 3/20*(x-10)**2  
  
y2 = T(x)  
  
fig2, ax2 = plt.subplots(1,1)  
  
ax2.hlines(l(10)+0.5, 0, 40, color = "chocolate", ls = "dashed")  
ax2.hlines(l(10)+2, 0, 40, color = "firebrick", ls = "dashed")  
ax2.hlines(l(10)+9/2, 0, 40, color = "saddlebrown", ls = "dashed")  
  
ax2.plot(x, y, label = "Exakt", color = "cornflowerblue")  
ax2.plot(x, y2, label = "Taylor", color = "gold")  
  
ax2.set_ylim(5, 15)  
ax2.set_xlim(2, 20)  
  
plt.legend()  
plt.grid()
```



$$T(\lambda) = l(10) + \frac{3}{20}(\lambda - 10)^2 \stackrel{!}{=} c + l(10)$$

$$\Leftrightarrow \lambda = \pm \sqrt{\frac{20}{3}c} + 10$$

```
[8]: def f(x):
      return -np.sqrt(20/3*x) + 10, np.sqrt(20/3*x) + 10
```

```
[9]: s1 = f(0.5)
      s2 = f(2)
      s3 = f(4.5)

      print("Taylor: \t\t\t\t\t", "Numerisch:")
      print(s1, sigma1)
      print(s2, sigma2)
      print(s3, sigma3)
```

Taylor:	Numerisch:
(8.174258141649446, 11.825741858350554)	[8.28430843 11.93951395]
(6.348516283298892, 13.651483716701108)	[6.77992799 14.11029103]
(4.522774424948339, 15.477225575051662)	[5.47506751 16.52049205]

Für die 1- σ Umgebung ist die Taylorreihe eine gute Näherung, spätestens ab der 3- σ Umgebung weichen die Werte relativ stark ab.