

# exercise\_09

April 8, 2021

## 1 Homework assignment 9 (Lightweight Eastern edition)

This homework assignment considers only the disease spreading models and their numerical solutions already discussed in the interactive lecture from Wednesday

**Deadline:** Monday, 15th of April, 12:00.

```
[1]: import numpy as np
from numpy import pi
from numpy.linalg import solve, norm
import matplotlib.pyplot as plt

plt.xkcd()
newparams = {'figure.figsize': (6.0, 6.0),
             'axes.grid': True,
             'lines.markersize': 8,
             'lines.linewidth': 2,
             'font.size': 14}
plt.rcParams.update(newparams)
```

### 1.1 Problem 1 SIHR model

a) Write down the final ODE system for the SIHR model developed during the first breakout session. Denote the rates for the transition  $I \xrightarrow{\gamma_h} H$ ,  $I \xrightarrow{\gamma_r} R$ , and  $H \xrightarrow{\delta} R$  by  $\gamma_h$  and  $\gamma_r$ ,  $\delta$ , respectively.

b) As the SIHR model is a refinement of the SIR model where we want to distinguish between infectious and hospitalized individuals, we assume the same total  $\gamma$  as for the simpler SIR model; that is,

$$\gamma_r + \gamma_h =: \gamma = 1/18$$

Assume that \* that 3.5% of all infected individuals will be hospitalized which means that  $\gamma_h = 0.035\gamma$  \* hospitalized individuals stay 14 days in the hospital on average, that is  $\delta = 1/14$  \* St. Olav's hospital has roughly 1000 beds with roughly 80% of them being occupied

Use the same initial condition as in the Trondheim scenario as in the lecture, choose a tolerance tol such that your numerical solutions are not off by more than 10 persons. Now compute and plot the solution  $S, I, H, R$  using both the adaptive Euler-Heun and Fehlberg's method. Record and state the number of steps you needed with Euler-Heun vs Fehlberg. What is (approximately) the largest

basic reproduction number  $R_0$  for which we will not exceed the maximal number of available beds?

*Hint* Before you start, it might be helpful to review the [SimpleCovidModel.ipynb notebook]. Some of the code snippets provided below might be helpful as well.

a)

$$S' = -\beta SI \quad (1)$$

$$I' = \beta SI - \gamma_h I - \gamma_r I \quad (2)$$

$$H' = \gamma_h I - \delta H \quad (3)$$

$$R' = \gamma_r I + \delta H, \quad (4)$$

```
[2]: # define SIHR class similar to SIR before
class SIHR:
    # Create model with given parameters
    def __init__(self, beta, gamma_r, gamma_h, delta):
        self.beta = beta # inflectional rate
        self.gamma_r = gamma_r # removal rate
        self.gamma_h = gamma_h # removal rate
        self.delta = delta

    def __call__(self, t, y):
        # TODO: Implement rhs of SIHR model
        return np.array([-self.beta*y[0]*y[1],
                        self.beta*y[0]*y[1] - self.gamma_h*y[1] - self.gamma_r*y[1],
                        self.gamma_h*y[1] - self.delta*y[2],
                        self.gamma_r*y[1] + self.delta*y[2]])
```

```
[3]: from rkm import EmbeddedExplicitRungeKutta

#Heun-Euler metode
a = np.array([[0, 0],
              [1, 0]])
bhat = np.array([1/2, 1/2])
b = np.array([1, 0])
c = np.array([0, 1])
order = 1

euler_heun = EmbeddedExplicitRungeKutta(a, b, c, bhat, order)

#Fehlberg method combines a 4th and 5th order method
a = np.array([[0, 0, 0, 0, 0, 0],
              [1/4, 0, 0, 0, 0, 0],
              [3/32, 9/32, 0, 0, 0, 0],
              [1932/2197, -7200/2197, 7296/2197, 0, 0, 0],
```

```

[ 439/216,          -8,   3680/513, -845/4104,      0,  0],
[-8/27,           2, -3544/2565, 1859/4104, -11/40,  0]])

b = np.array([16/135, 0, 6656/12825, 28561/56430, -9/50, 2/55])
bhat = np.array([25/216, 0, 1408/2565, 2197/4104, -1/5, 0])
c = np.array([
    0,
    1/4,
    3/8,
    12/13,
    1,
    1/2])
order = 4
fehlberg = EmbeddedExplicitRungeKutta(a, b, c, bhat, order)

# max number of steps
Nmax = 10000
tol = 10/200000 #Fraksjonsavvik; 10 personer av 200000 innbyggere

```

[4] : #Verdier for SIHR-modellen

```

r0 = 1.342 #Ved testing; for å ikke gå over 200 innlagte pga covid,
#på grunn av avvik mellom de metodene kan den være noe høyere også
gamma = 1/18
gamma_h = 0.035*gamma
gamma_r = gamma - gamma_h
beta = r0*gamma
delta = 1/14

# Lager modellen
sihr = SIHR(beta = beta, gamma_r = gamma_r, gamma_h = gamma_h, delta = delta)

```

[5] : #Samme startbetingelser som i fra SimpleCovidModel

```

I_0 = 1/200000
R_0 = 0
H_0 = 0 #Antar her at de okkuperte sengene på sykehuset ved start er andre
#årsaker en COVID
#og at det antallet er konsant gjennom pandemien. Da er det 200 ledige
#senger for COVID-smittede.
S_0 = 1 - I_0

y0 = np.array([S_0,
              I_0,
              H_0,
              R_0])
t0, T = 0, 750

```

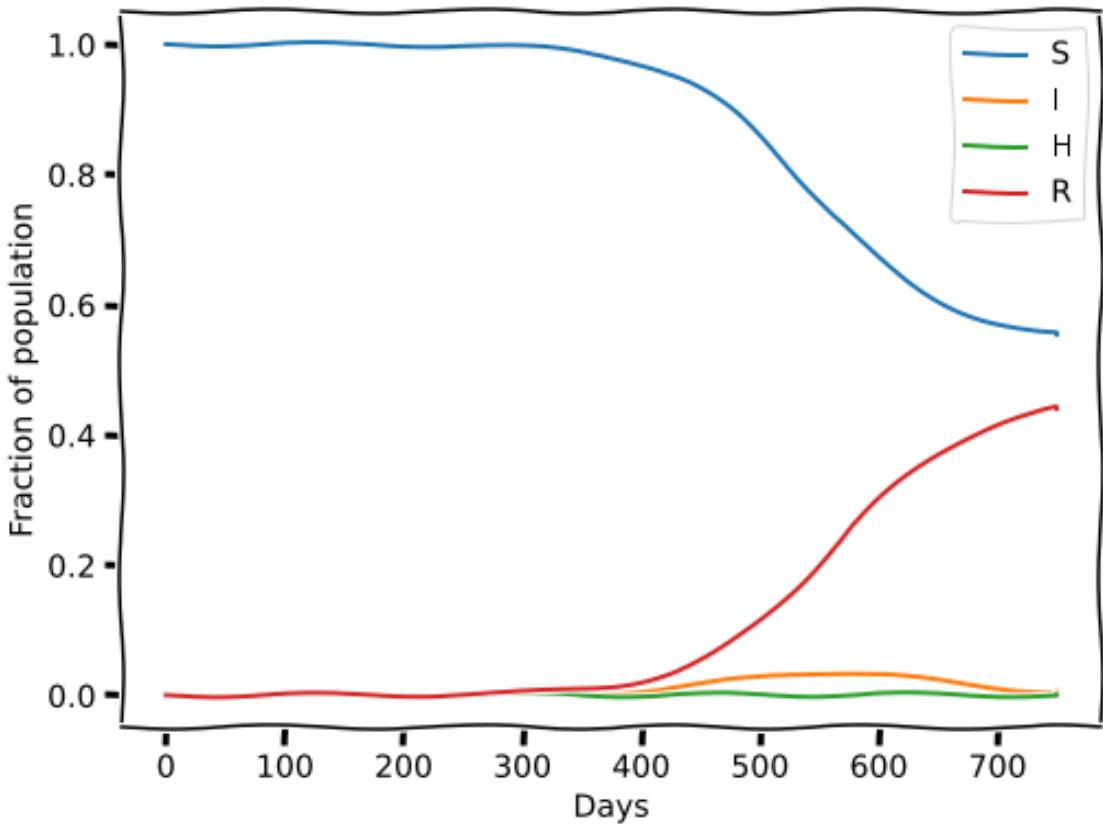
```
[6]: #Kjører metodene og plotter svarene:
#Euler-Heun
ts, ys = euler_heun(y0, t0, T, sihr, Nmax, tol=tol)
plt.close()
newparams['figure.figsize'] = (8,6)
plt.rcParams.update(newparams)
plt.plot(ts, ys, "-")
plt.legend(["S", "I", "H", "R"])
plt.xlabel("Days")
plt.ylabel("Fraction of population")
```

```
#Finner sjukehusinnleggelser pga Corona:
Innlagte = []
for sir in ys:
    Innlagte.append(sir[2])

print(f"Maks antall innlagte på sykehus på grunn av Corona er : {round(max(Innlagte)*200000)}")
```

findfont: Font family ['xkcd', 'xkcd Script', 'Humor Sans', 'Comic Neue', 'Comic Sans MS'] not found. Falling back to DejaVu Sans.

Step is rejected at t = 58.575 with err = 7.360998590063493e-05  
Step is rejected at t = 108.03073921398018 with err = 7.702436688900656e-05  
Step is rejected at t = 139.90742781364702 with err = 5.671061181395657e-05  
Finishing time-stepping reaching t = 750.0 with final time T = 750  
Used 211 steps out of 10000 with 3 being rejected  
Maks antall innlagte på sykehus på grunn av Corona er : 191



[7]: #Kjører metodene og plotter svarene:

```

ts, ys = fehlberg(y0, t0, T, sihr, Nmax, tol)
plt.close()
newparams['figure.figsize'] = (8,6)
plt.rcParams.update(newparams)
plt.plot(ts, ys, "-")
plt.legend(["S", "I", "H", "R"])
plt.xlabel("Days")
plt.ylabel("Fraction of population")

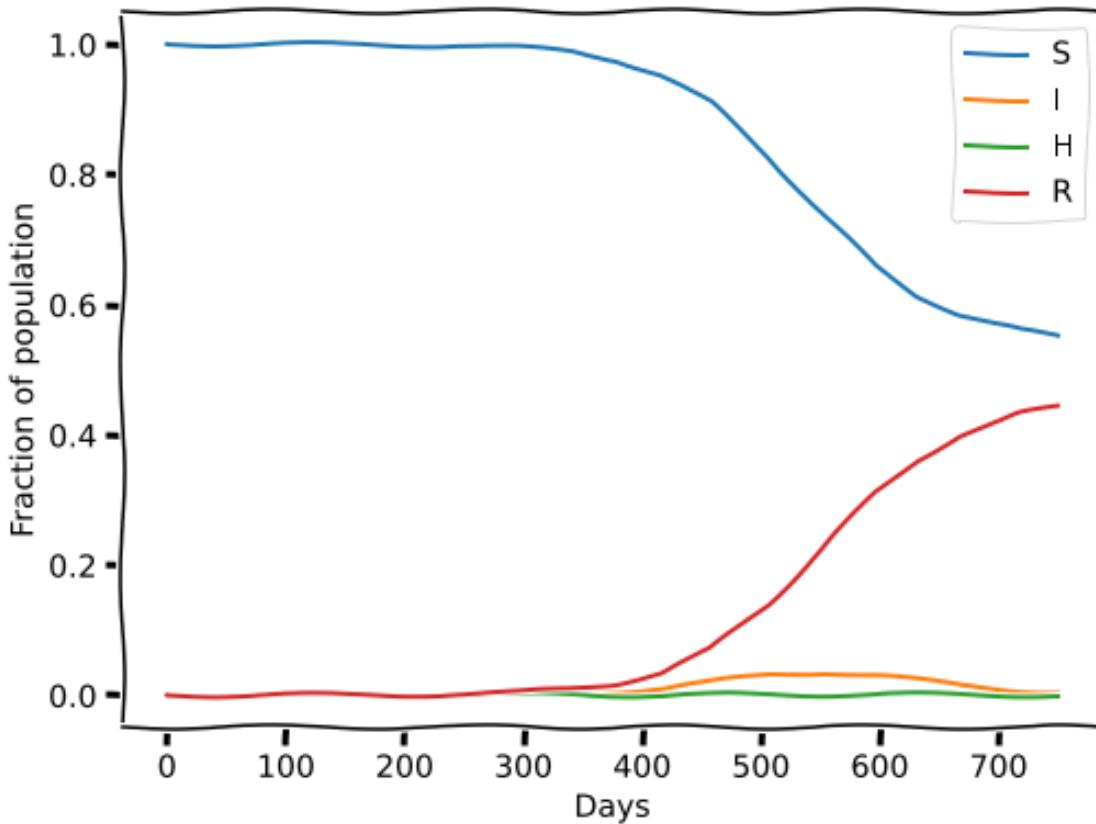
#Finner sjukehusinnleggelse pga Corona:
Innlagte = []
for sir in ys:
    Innlagte.append(sir[2])

print(f"Max antall innlagte på sykehus på grunn av Corona er : {round(max(Innlagte)*200000)}")

```

Step is rejected at t = 58.575 with err = 6.560930837891416e-05  
Step is rejected at t = 162.7906858806382 with err = 0.0022878275955145275

Finishing time-stepping reaching  $t = 750.0$  with final time  $T = 750$   
 Used 22 steps out of 10000 with 2 being rejected  
 Maks antall innlagte på sykehus på grunn av Corona er : 198



- Euler-Heun metoden brukte 211 steg
- Fehlbergs metode brukte 22 steg
- Får at  $R_0 \approx 1.342$ , dersom sykehusene ikke skal bli overfylte

## 1.2 Problem 2 SIH<sub>Rt</sub> model

Redo problem 1, but this time develop and use an extension the SIHR model to account for time-limited immunity, assuming 1 year of immunity for each recovered person. Consider a time-period of 5 years and find out how many “infection waves” will occur where the maximum capacity of beds are exceeded.

Får et relativt likt system som i oppgave 1, men må legge til at det tilbakeføres immune til friske. Bruker  $\epsilon$  som raten for at immuniteten går ut. Med samme tankegang som for sykehuset i oppgave 1, er da  $\epsilon = 1/365$ . Vi får da likningssystemet:

$$S' = -\beta SI + \epsilon R \quad (5)$$

$$I' = \beta SI - \gamma_h I - \gamma_r I \quad (6)$$

$$H' = \gamma_h I - \delta H \quad (7)$$

$$R' = \gamma_r I + \delta H - \epsilon R, \quad (8)$$

```
[8]: # Lager SIHrt-klasse
class SIHrt:
    # Create model with given parameters
    def __init__(self, beta, gamma_r, gamma_h, delta, epsilon):
        self.beta = beta # infectional rate
        self.gamma_r = gamma_r # removal rate
        self.gamma_h = gamma_h # removal rate
        self.delta = delta
        self.epsilon = epsilon

    def __call__(self, t, y):
        return np.array([-self.beta*y[0]*y[1] + self.epsilon*y[3],
                        self.beta*y[0]*y[1] - self.gamma_h*y[1] - self.gamma_r*y[1],
                        self.gamma_h*y[1] - self.delta*y[2],
                        self.gamma_r*y[1] + self.delta*y[2] - self.epsilon*y[3]])
```

```
[9]: #Legger inn konstantene

r0 = 2
gamma = 1/18
gamma_h = 0.035*gamma
gamma_r = gamma - gamma_h
beta = r0*gamma
delta = 1/14
epsilon = 1/365

Nmax = 10000
tol = 10/200000 #Fraksjon; 10 personer av 200000 innbyggere

#Samme startbetingelser som i fra SimpleCovidModel
I_0 = 1/200000
R_0 = 0
H_0 = 0 #Antar her at de okkuperte sengene på sykehuset ved start er andre  
→årsaker en COVID
        #og at det antallet er konsant gjennom pandemien. Da er det 200 ledige  
→senger for COVID-smittede.

S_0 = 1 - I_0

y0 = np.array([S_0,
```

```

I_0,
H_0,
R_0])
t0, T = 0, (365*5) #5 år

```

[10]: sihrt = SIHrt(beta = beta, gamma\_r = gamma\_r, gamma\_h = gamma\_h, delta = delta,  
 $\hookrightarrow$ epsilon = epsilon)

#Med Euler-Heun

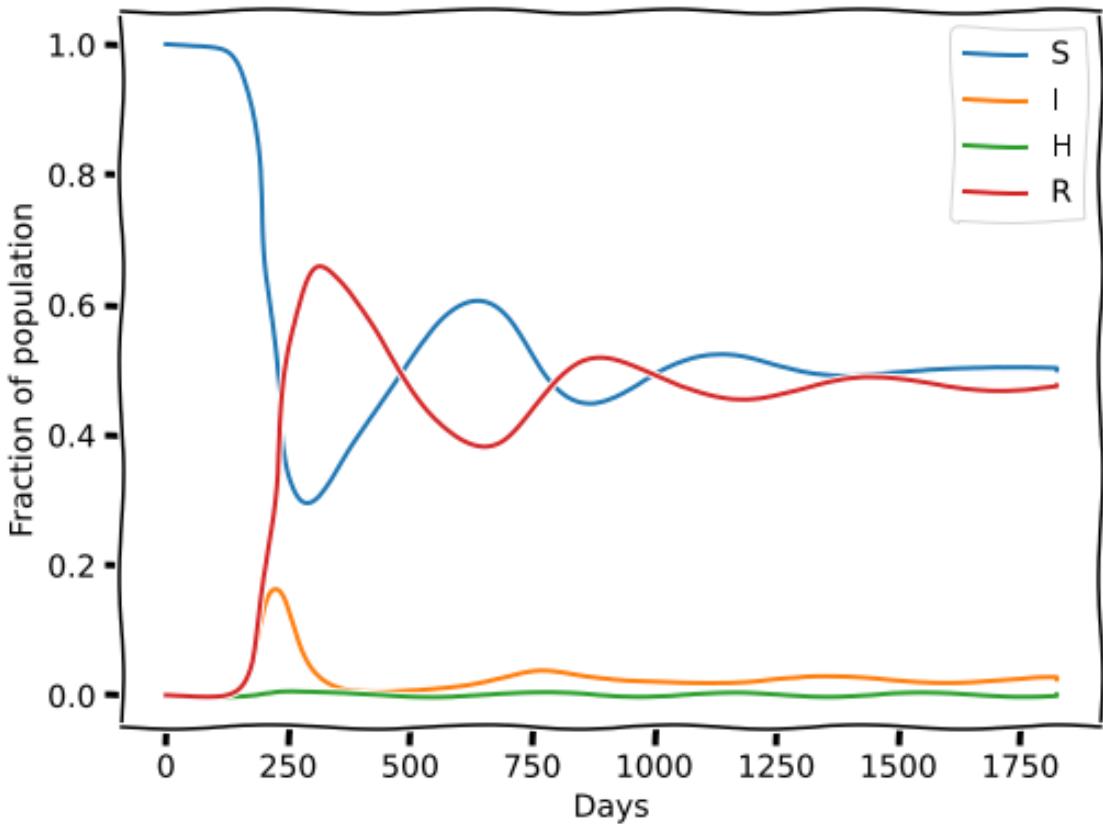
```

ts, ys = euler_heun(y0, t0, T, sihrt, Nmax, tol=tol)

plt.close()
newparams['figure.figsize'] = (8,6)
plt.rcParams.update(newparams)
plt.plot(ts, ys, "-")
plt.legend(["S", "I", "H", "R"])
plt.xlabel("Days")
plt.ylabel("Fraction of population")
plt.show()

```

Step is rejected at t = 28.47 with err = 9.811729626104958e-05  
Step is rejected at t = 48.82137344383261 with err = 8.856946803260476e-05  
Step is rejected at t = 61.05397483975463 with err = 6.109266190224957e-05  
Step is rejected at t = 69.90691940565716 with err = 5.1564625481079755e-05  
Finishing time-stepping reaching t = 1825.0 with final time T = 1825  
Used 706 steps out of 10000 with 4 being rejected



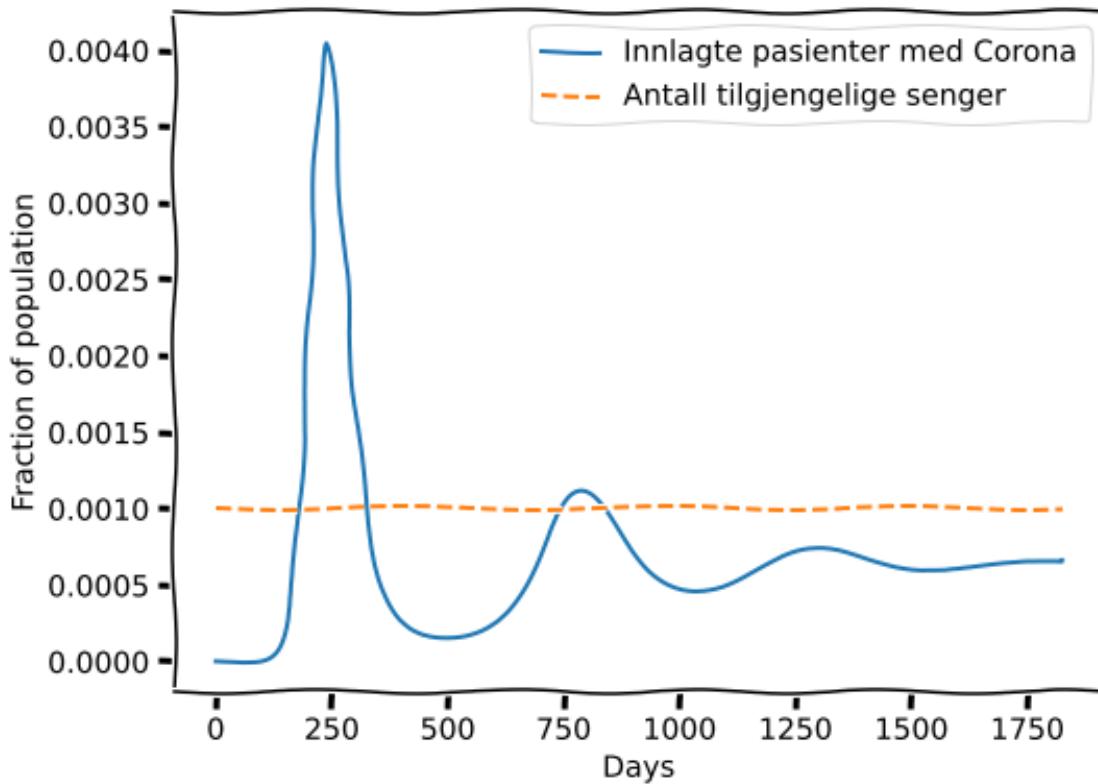
```
[11]: H = []
for SIHR in ys:
    H.append(SIHR[2])

print(f"Max antall innlagte på sykehus på grunn av Corona er : {round(max(H)*200000)}")

x = np.linspace(0, 5*365, 100)
y = 0*x + 200/200000

plt.close()
newparams['figure.figsize'] = (8,6)
plt.rcParams.update(newparams)
plt.plot(ts, H)
plt.plot(x, y, '--')
plt.legend(["Innlagte pasienter med Corona", "Antall tilgjengelige senger"])
plt.xlabel("Days")
plt.ylabel("Fraction of population")
plt.show()
```

Maks antall innlagte på sykehus på grunn av Corona er : 810



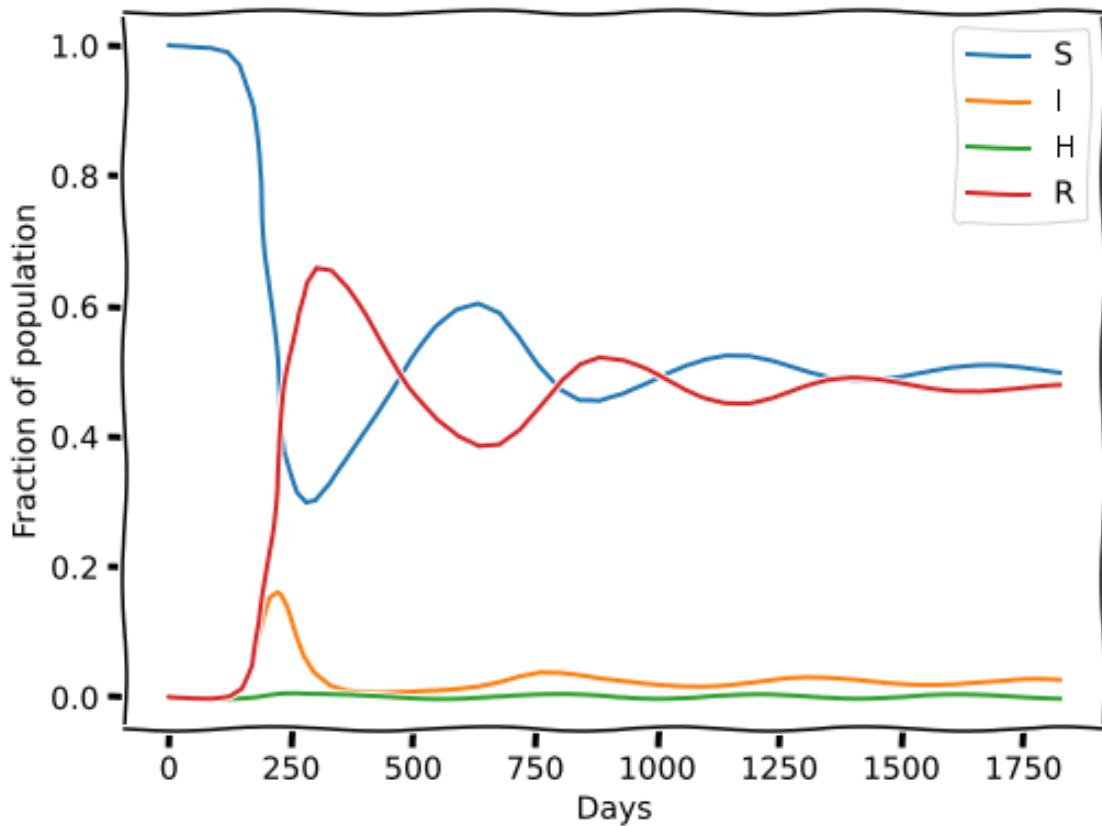
[12]: #Med Fehlberg

```
ts, ys = fehlberg(y0, t0, T, sihrt, Nmax, tol=tol)

plt.close()
newparams['figure.figsize'] = (8,6)
plt.rcParams.update(newparams)
plt.plot(ts, ys, "-")
plt.legend(["S", "I", "H", "R"])
plt.xlabel("Days")
plt.ylabel("Fraction of population")
plt.show()
```

```
Step is rejected at t = 28.47 with err = 6.864940620636603e-05
Step is rejected at t = 86.90599360302808 with err = 0.0005929149935678104
Step is rejected at t = 122.0529257544298 with err = 0.00010613534763288317
Step is rejected at t = 209.64466135167322 with err = 0.00021710812755961707
Step is rejected at t = 494.78731349424845 with err = 9.377350274870878e-05
Step is rejected at t = 548.3298720102617 with err = 6.755186104993603e-05
Step is rejected at t = 1661.4239201362643 with err = 5.584308451594294e-05
```

```
Finishing time-stepping reaching t = 1825.0 with final time T = 1825
Used 58 steps out of 10000 with 7 being rejected
```



```
[13]: H = []
for SIHR in ys:
    H.append(SIHR[2])

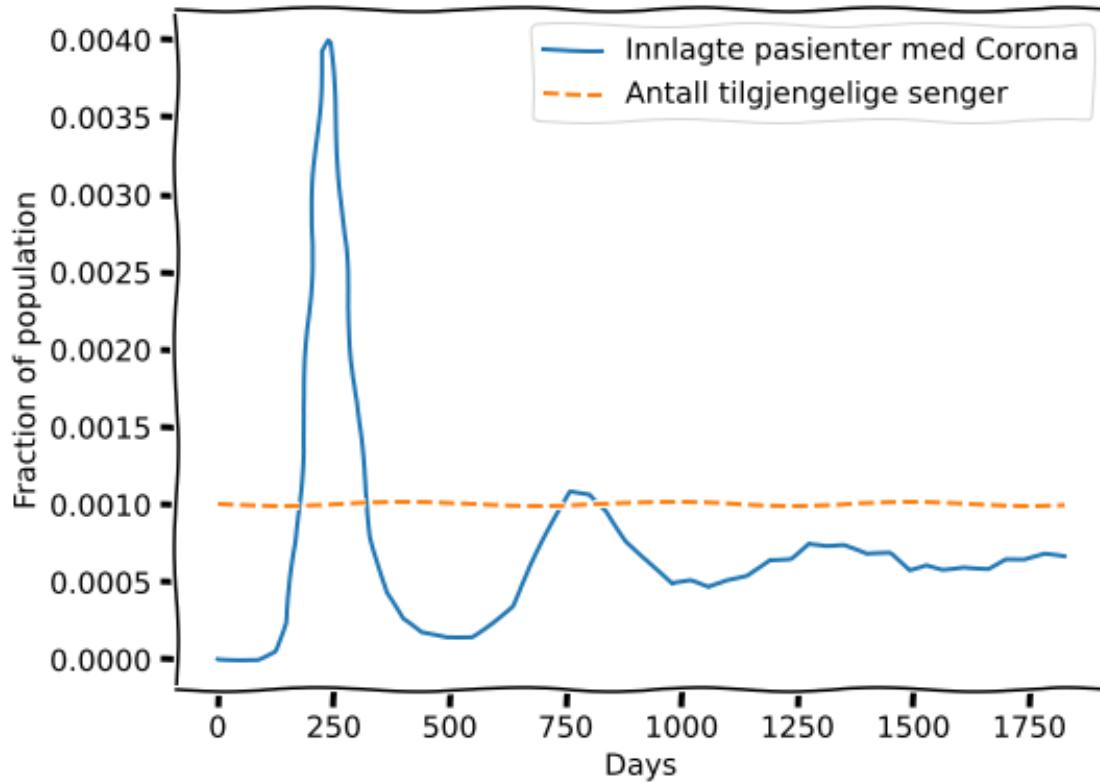
print(f"Maks antall innlagte på sykehus på grunn av Corona er :"
      f"\n{round(max(H)*200000)}")

x = np.linspace(0, 5*365, 100)
y = 0*x + 200/200000

plt.close()
newparams['figure.figsize'] = (8,6)
plt.rcParams.update(newparams)
plt.plot(ts, H)
plt.plot(x, y, '--')
plt.legend(["Innlagte pasienter med Corona", "Antall tilgjengelige senger"])
plt.xlabel("Days")
```

```
plt.ylabel("Fraction of population")
plt.show()
```

Maks antall innlagte på sykehus på grunn av Corona er : 798



- Det blir to smittebølger hvor det er flere innlagte enn antallet senger med  $R_0 = 2$
- Euler-Heuns metode brukte 706 steg
- Fehlbergs metode brukte 58 steg

[ ]:

[ ]: