## Symbolic computing 1: Proofs with SymPy

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```
# execute this part to modify the css style
from IPython.core.display import HTML
def css_styling():
    styles = open("./style/custom2.css").read()
    return HTML(styles)
css_styling()
```

```
## loading python libraries
# necessary to display plots inline:
%matplotlib inline
# load the libraries
import matplotlib.pyplot as plt # 2D plotting library
import numpy as np # package for scientific computing
from pylab import *
from math import * # package for mathematics (pi, arctan, sqrt, factori
import sympy as sympy # package for symbolic computation
from sympy import *
```

Using python library SymPy we can perform exact computations. For instance, run and compare the following scripts:

```
print('With Numpy: ')
print('root of two is '+str(np.sqrt(2))+'')
print('the square of (root of two) is '+str(np.sqrt(2)**2)+'')
print('---------')
print('With SymPy: ')
print('root of two is '+str(sympy.sqrt(2))+'')
print('the square of (root of two) is '+str(sympy.sqrt(2)**2)+'')
```


## With Numpy:

root of two is 1.41421356237
the square of (root of two) is 2.0
With SymPy:
root of two is sqrt(2)
the square of (root of two) is 2

One can expand or simplify expressions:

```
print('Simplification of algebraic expressions:')
print('the square root of 40 is '+str(sympy.sqrt(40))+'')
print('(root(3)+root(2))**20 is equal to '+str(expand((sympy.sqrt(3)+sympy.sqrt(2))*
#
print('----------------')
print('Simplification of symbolic expressions:')
var('x') # We declare a 'symbolic' variable
Expression=(x**2 - 2*x + 1)/(x-1)
print(str(Expression) + ' simplifies into '+str(simplify(Expression)))
```

```
Simplification of algebraic expressions:
the square root of 40 is 2*sqrt(10)
(root(3)+root(2))**20 is equal to 4517251249 + 1844160100*sqrt(6)
Simplification of symbolic expressions:
(x**2 - 2*x + 1)/(x - 1) simplifies into x - 1
```

With Sympy one can also obtain Taylor expansions of functions with series:

```
# Real variable
var('x')
Expression=cos(x)
print('Expansion of cos(x) at x=0: '+str(Expression.series(x,0)))
# integer variable
var('n',integer=True)
Expression=cos(1/n)
print('Expansion of cos(1/n) when n -> +oo: '+str(Expression.series(n,oo))) # oo m
```

Expansion of $\cos (x)$ at $x=0: 1-x^{* *} 2 / 2+x^{* *} 4 / 24+0\left(x^{* *} 6\right)$
Expansion of $\cos (1 / n)$ when $n->+o o: 1 /(24 * n * * 4)-1 /\left(2 *_{n} * * 2\right)+1+0(n$
** (-6), ( $\mathrm{n}, \mathrm{oo}$ ) $)$

SymPy can also compute with "big O's". (By default $\mathcal{O}(x)$ is considered for $x \rightarrow 0$.)

```
var('x')
simplify((x+0(x**3))*(x+x**2+0(x**3)))
x**2 + x**3 + 0(x**4)
```

Remark. A nice feature of Sympy is that you can export formulas in LateX . For instance:

```
var('x y')
formula=simplify((cos(x+y)-sin(x+y))**2)
print(formula)
print(latex(formula))
```

$2 * \cos (x+y+p i / 4) * * 2$
$2 \backslash \cos \{2\}\{\backslash l e f t(x+y+\backslash f r a c\{\backslash p i\}\{4\} \backslash r i g h t)\}$

Warning: Fractions such as $1 / 4$ must be introduced with Rational (1,4) to keep Sympy from evaluating the expression. For example:

```
print('(1/4)^3 = '+str((1/4)**3))
print('(1/4)^3 = '+str(Rational(1,4)**3))
```

$(1 / 4)^{\wedge} 3=0.015625$
$(1 / 4)^{\wedge} 3=1 / 64$

## Let SymPy do the proofs

## Exercise 1. A warm-up

Do it yourself.
Set $\phi=\frac{1+\sqrt{5}}{2}$. Use SymPy to simplify $F=\frac{\phi^{4}-\phi}{1+\phi^{7}}$

```
phi=(1+sqrt(5))/2
formula=(phi**4-phi)/(phi**7+1)
print("F = "+str(formula))
print("simplified F = "+str(simplify(formula)))
F = (-sqrt(5)/2 - 1/2 + (1/2 + sqrt(5)/2)**4)/(1 + (1/2 + sqrt(5)/2)**7
)
simplified F = -4*sqrt(5)/29 + 14/29
```


## Exercise 2. A simple (?) recurrence

We will see how to use SymPy to prove a mathematical statement. Our aim is to make as rigorous proofs as possible, as long as we trust SymPy.

Do it yourself.
Let $a, b$ be two real numbers, we define the sequence $\left(u_{n}\right)_{n \geq 0}$ as follows:
$u_{0}=a, u_{1}=b \quad$ and for $n \geq 2$

$$
u_{n}=\frac{1+u_{n-1}}{u_{n-2}}
$$

1. Write a short program which returns the 15 first values of $u_{n}$ in terms of symbolic variables $a, b$. The output should be something like:
$u_{-} 0=a$
$u_{-} 1=b$
$u_{-} 2=(b+1) / a$
2. Use SymPy to make and prove a conjecture for the asymptotic behaviour of the sequence $\left(u_{n}\right)$, for every reals $a, b$.
```
def InductionFormula(x,y):
    return (1+x)/y
var('a b')
Sequence=[a,b]
print('u_0 = a')
print('u_1 = b')
for i in range(2,15):
    Sequence.append(simplify(InductionFormula(Sequence[-1],Sequence[-2])))
    print('u_'+str(i)+' = '+str(Sequence[-1]))
```

$\mathrm{u} \_0=\mathrm{a}$
$u_{-}^{-} 1=b$
$u_{-} 2=(b+1) / a$
$u_{-}^{-} 3=(a+b+1) /(a * b)$
$u_{-}^{-} 4=(a+1) / b$
$u_{-}^{-} 5=a$
$u_{-}^{-6}=b$
$u_{-}^{-7}=(b+1) / a$
$u_{-} 8=(a+b+1) /(a * b)$
$u_{-}^{-} 9=(a+1) / b$
$\mathrm{u}_{-}^{-} 10=\mathrm{a}$
$\mathrm{u}_{-}^{-11}=\mathrm{b}$
$u_{-}^{-} 12=(b+1) / a$
$u_{-} 13=(a+b+1) /(a * b)$
$\mathrm{u}_{-}^{-} 14=(\mathrm{a}+1) / \mathrm{b}$

Answers.

1. See the cell above.
2. If $a, b \neq 0$, the sequence is well defined and we observe that $u_{5}=u_{0} \quad$ and $u_{6}=u_{1}$
Since the sequence is defined by a recurrence of order two (i.e. $u_{n}$ is a function of $u_{n-1}, u_{n-2} \quad$ this implies that the sequence is periodic: $u_{n+5}=u_{n} \quad$ for every $n$. So if we trust Sympy the proof is done.

## Exercise 3. What if Archimedes had known Sympy ?

For $n \geq 1$, let $\mathcal{P}_{n}$ be a regular $3 \times 2^{n}$-gon with radius 1 . Here is $\mathcal{P}_{1}$ :


Archimedes (IIIrd century BC) used the fact that $\mathcal{P}_{n}$ gets closer and closer to the unit circle to obtain good approximations of $\pi$.
We will use SymPy to deduce nice formulas for approximations of $\pi$.

Do it yourself. Let $L_{n}$ be the length of any side of $\mathcal{P}_{n}$. Compute $L_{1}$ and use the following picture to write $L_{n+1}$ as a function of $L_{n}$ :

- $O$ is the center of the circle, $O C=1$.
- $(O B)$ is the bisector of $\widehat{D O C}$.
- $\widehat{O A C}$ is a right angle.


Answers. As $O B$ is the bisector we have that $C B=B D$, which both are sides of $\mathcal{P}_{n+1}$
Besides, $O A C$ is rectangle at $A$. By Pythagora's theorem

$$
1^{2}=O A^{2}+A C^{2}=O A^{2}+\left(L_{n} / 2\right)^{2}
$$

$B A C$ is also rectangle at $A$, therefore

$$
L_{n+1}^{2}=B C^{2}=A B^{2}+B C^{2}
$$

$$
=(1-O A)^{2}+\left(L_{n} / 2\right)^{2}
$$

$$
=\left(1-\sqrt{1-\left(L_{n} / 2\right)^{2}}\right)^{2}+\left(L_{n} / 2\right)^{2}
$$

$$
=1+1-\left(L_{n} / 2\right)^{2}-2 \sqrt{1-\left(L_{n} / 2\right)^{2}}+\left(L_{n} / 2\right)^{2}
$$

$$
=2-2 \sqrt{1-\left(L_{n} / 2\right)^{2}}
$$

Finally we obtain

$$
L_{n+1}=\sqrt{2-2 \sqrt{1-\left(L_{n} / 2\right)^{2}}} .
$$

```
Do it yourself.
```

1. Write a script which computes exact expressions for the first values $L_{1}, L_{2}, \ldots, L_{n} \quad$. (First try for small $n$ 's.)
2. Find a sequence $a_{n}$ such that $a_{n} L_{n}$ converges to $\pi$ (we don't ask for a proof). Deduce some good algebraic approximations of $\pi$. Export your results in Latex in order to get nice formulas.
(In order to check your formulas, you may compute numerical evaluations. With SymPy , a numerical evaluation is obtained with $N($ expression) .)
```
SuccessiveApproximations=[1]
p=12
for n in range(1,p):
    OldValue=SuccessiveApproximations[-1]
    NewValue=expand(sqrt(2-2*sqrt(1-(OldValue**2)*Rational(1,4))))
    SuccessiveApproximations.append(NewValue)
    print(latex(simplify(3*(2**n)*NewValue)))
    print(N(NewValue*3*2**(n)))
```

```
6 \sqrt{- \sqrt{3} + 2}
3.10582854123025
12 \sqrt{- \sqrt{\sqrt{3} + 2} + 2}
3.13262861328124
24 \sqrt{- \sqrt{\sqrt{\sqrt{3} + 2} + 2} + 2}
3.13935020304687
48 \sqrt{- \sqrt{\sqrt{\sqrt{\sqrt{3} + 2} + 2} + 2} + 2}
3.14103195089051
96 \sqrt{- \sqrt{\sqrt{\sqrt{\sqrt{\sqrt{3} + 2} + 2} + 2} + 2} + 2}
3.14145247228546
192 \sqrt{- \sqrt{\sqrt{\sqrt{\sqrt{\sqrt{\sqrt{3} + 2} + 2} + 2} + 2}
+ 2} + 2}
3.14155760791186
384 \sqrt{- \sqrt{\sqrt{\sqrt{\sqrt{\sqrt{\sqrt{\\sqrt{3} + 2} + 2} + 2}
+2} + 2} + 2} + 2}
3.14158389214832
768 \sqrt{- \sqrt{\sqrt{\sqrt{\sqrt{\sqrt{\sqrt{\sqrt{\sqrt{3} + 2} + 2
} + 2} + 2} + 2} + 2} + 2} + 2}
3.14159046322805
1536 \sqrt{- \sqrt{\sqrt{\sqrt{\sqrt{\sqrt{\sqrt{\sqrt{\\sqrt{\sqrt{3} +
2} + 2} + 2} + 2} + 2} + 2} + 2} + 2} + 2}
3.14159210599927
3072 \sqrt{- \sqrt{\sqrt{\sqrt{\sqrt{\sqrt{\sqrt{\\sqrt{\sqrt{\sqrt{\sqr
t{3}+2}+2}+2}+2}+2}+2}+2}+2}+2}+2}
3.14159251669216
6144 \sqrt{- \sqrt{\sqrt{\sqrt{\sqrt{\sqrt{\sqrt{\sqrt{\sqrt{\sqrt{\\sqr
t{\sqrt{3} + 2} + 2} + 2} + 2} + 2} + 2} + 2} + 2} + 2} + 2} + 2}
3.14159261936538
```

Answers. When $n$ goes large, $\mathcal{P}_{n}$ gets closer and closer to the unit circle. As the perimeter of $\mathcal{P}_{n}$ is $3 \times 2^{n} L_{n}$, we expect that

$$
3 \times 2^{n} L_{n} \rightarrow 2 \pi
$$

therefore we choose $a_{n}=3 \times 2^{n-1} \quad$. For $n=8$ we obtain:

$$
\pi \approx 384 \sqrt{-\sqrt{\sqrt{\sqrt{\sqrt{\sqrt{\sqrt{\sqrt{\sqrt{3}+2}+2}+2+2+2}+2}}}+2}}=3.141583892 \ldots
$$

## Exercise 4. Matrices with SymPy

In Lab 2 we proved that if $a_{n}, b_{n}$ are integers defined by

$$
a_{n}+b_{n} \sqrt{2}=(1+\sqrt{2})^{n},
$$

then

$$
\binom{a_{n}}{b_{n}}=\left(\begin{array}{ll}
1 & 2 \\
1 & 1
\end{array}\right)^{n-1} \times\binom{ 1}{1}
$$

Do it yourself.

1. Use SymPy to find an explicit formula for $a_{n}$.
(In SymPy matrices are defined by Matrix ([ $[a, b],[c, d]]$ ) .)
2. (Theory) Use the formula obtained at Question 1 to find real numbers $c, R$ such that

$$
a_{n} \stackrel{n \rightarrow+\infty}{\sim} c R^{n}
$$

```
#Question 1
A=Matrix([[1, 2],[1, 1]])
var('n', integer=True)
Power=A** (n-1)
#print(Power)
an=latex(simplify(Power[0,0]+Power[0,1]))
bn=latex(simplify(Power[1,0]+Power[1,1]))
print('a_n ='+str(an))
print('b_n ='+str(bn))
```

$a_{-n}=\backslash f r a c\{1\}\{2\} \backslash \operatorname{left}(1+\backslash \operatorname{sqrt}\{2\} \backslash r i g h t)^{\wedge}\{n\}+\backslash f r a c\{1\}\{2\} \backslash l e f t(-\backslash s$
$q \bar{r} t\{2\}+1 \backslash r i g h t)^{\wedge}\{n\}$
b_n $=\backslash f r a c\{\backslash \operatorname{sqrt}\{2\}\}\{4\} \backslash l e f t\left(\backslash l e f t(1+\backslash \operatorname{sqrt}\{2\} \backslash r i g h t)^{\wedge}\{n\}-\backslash l e f t(-\backslash\right.$
sq̄rt $\{2\}+1 \backslash r i g h t) \wedge\{n\} \backslash r i g h t)$

Answers.

1. We export the result in LateX:

$$
\begin{aligned}
& a_{n}=\frac{1}{2}(1+\sqrt{2})^{n}+\frac{1}{2}(-\sqrt{2}+1)^{n} \\
& b_{n}=\frac{\sqrt{2}}{4}\left((1+\sqrt{2})^{n}-(-\sqrt{2}+1)^{n}\right) \\
& \text { 2. As }|-\sqrt{2}+1|<1 \quad \text {, we have that }(-\sqrt{2}+1)^{n} \rightarrow 0 \quad \text {. It follows that }
\end{aligned}
$$

$$
\begin{aligned}
a_{n} & =\frac{1}{2}(1+\sqrt{2})^{n}+\mathrm{o}(1) \\
& \sim \frac{1}{2}(1+\sqrt{2})^{n}
\end{aligned}
$$

## Solving equations with SymPy

One can solve equations with Sympy. The following script shows how to solve $x^{2}=x+1 \quad$ :

```
var('x') # we declare the variable
SetOfSolutions=solve( }x**2-x-1,x
print(SetOfSolutions)
```

$[1 / 2+\operatorname{sqrt}(5) / 2,-\operatorname{sqrt}(5) / 2+1 / 2]$

## Exercise 5. Solving equations with Sympy: the easy case

We will use solve to handle a more complicated equation.
Let $n \geq 1$ be an integer, we are interested in solving the equation

$$
x^{3}+n x=1 .
$$

With the above script we plot $x \mapsto x^{3}$, and $x \mapsto 1-n x$ for $0 \leq x \leq 1$ and for several (large) values of $n$. This suggests that Equation ( $\star$ ) has a unique real solution in the interval [ 0,1 ] , that we will denote by $S_{n}$.

```
RangeOf_x=np.arange(0,1,0.01)
plt.plot(RangeOf_x,RangeOf_x**3,label='$x\mapsto x$**3')
for n in [10, 20, 30]:
    f=[1-n*x for x in RangeOf_x]
    plt.plot(RangeOf_x,f,label='n ='+str(n)+' ')
plt.xlim(0, 1),plt.ylim(-1, 1)
plt.xlabel('Value of x')
plt.legend()
plt.title('Location of S_n')
plt.show()
```



Do it yourself. (Theory)

1. Prove that indeed for every $n \geq 1$. Equation $(\star)$ has a unique real solution in the interval [0, 1]
2. According to the plot, what can we conjecture for the limit $S_{n}$ ?

Answers.

1. The map $x \mapsto f(x)=x^{3}+n x-1 \quad$ is continuous and increasing on $[0,1]$. since

$$
f^{\prime}(x)=3 x^{2}+n>n>0
$$

Besides,
$f(0)=0^{3}-n \times 0-1=-1, \quad f(1)=1^{3}+n \times 1-1=n>0$.
By the intermediate value theorem, this implies that there is a unique $S_{n} \in(0,1)$ such that $f\left(S_{n}\right)=0$, i.e.

$$
\left(S_{n}\right)^{3}+n S_{n}=1
$$

2. On the figure above we observe that when $n \rightarrow+\infty$, the solution of Equation $(\star)$ seems to get closer and closer to zero. We therefore conjecture

$$
\lim _{n \rightarrow+\infty} S_{n}=0
$$

Do it yourself.

1. Write a script which computes the exact expression of $S_{n}$.
2. Use SymPy to get the asymptotic expansion of $S_{n}$ (up to $\mathcal{O}\left(1 / n^{5}\right)$ ). Check your previous conjecture.
```
var('x')
var('n',integer=True)
# Question 1.
Solutions=solve(x**3+n*x-1,x)
Sn=simplify(Solutions[0]) # The two other solutions are complex numbers
print("Sn = "+str(latex(Sn)))
# Question 2.
Taylor=series(Sn,n,oo,5)
print("Taylor expansion when epsilon -> 0 : "+str(Taylor))
Sn = \frac{- 2 \sqrt[3]{18} n + \sqrt[3]{12} \left(\sqrt{3} \sqrt{4 n^{
3} + 27} + 9\right)^{\frac{2}{3}}}{6 \sqrt[3]{\sqrt{3} \sqrt{4 n^{3} +
27} + 9}}
Taylor expansion when epsilon -> 0 : -1/n**4 + 1/n + 0(n**(-5), (n, oo)
)
```

Answers.

1. According to the above script,

$$
\frac{-2 \sqrt[3]{18} n+\sqrt[3]{12}\left(\sqrt{3} \sqrt{4 n^{3}+27}+9\right)^{\frac{2}{3}}}{6 \sqrt[3]{\sqrt{3} \sqrt{4 n^{3}+27}+9}}
$$

2. SymPy gives

$$
S_{n}=\frac{1}{n}-\frac{1}{n^{4}}+\mathcal{O}\left(1 / n^{5}\right)
$$

Indeed, this goes to zero as expected.

## (Bonus) Exercise 6. Solving equations: when SymPy needs help

We consider the following equation:

$$
X^{5}-3 \varepsilon X^{4}-1=0
$$

where $\varepsilon$ is a positive parameter. A quick analysis shows that if $\varepsilon>0$ is small enough then ( $\star$ ) has a unique real solution, that we denote by $S_{\varepsilon}$.

The degree of this equation is too high to be solved by SymPy :

```
var('x')
var('e')
solve(x**5-3*e*x**4-1,x)
```

[]

Indeed, SymPy needs help to handle this equation.

In the above script we plotted the function $f(x)=x^{5}-3 \varepsilon x^{4}-1 \quad$ for some small $\varepsilon$. This suggests that $\lim _{\varepsilon \rightarrow 0} S_{\varepsilon}=1$

```
RangeOf_x=np.arange(0, 2,0.01)
def ToBeZero(x,eps):
    return x**5+x**4*(-3*eps) -1
eps=0.05
plt.plot(RangeOf_x,[ToBeZero(x,eps) for x in RangeOf_x],label='x**5+x**4*(-3*eps)-1'
plt.xlim(0, 2)
plt.ylim(-1, 1)
plt.plot([-2,2],[0,0])
plt.plot([1,1],[-2,2])
plt.xlabel('Value of x')
plt.title('Location of S_eps, with eps ='+str(eps))
plt.legend()
plt.show()
```



Do it yourself.
We admit that $S_{\varepsilon}$ can be written as

$$
S_{\varepsilon}=1+r \varepsilon+s \varepsilon^{2}+\mathcal{O}\left(\varepsilon^{3}\right)
$$

for some real $r, s$. Use SymPy to find $r, s$.
(You can use any SymPy function already seen in this notebook.)

```
var('r')
var('s')
var('eps')
Expression=ToBeZero(1+r*eps+s*eps**2+0(eps**3),eps)
Simple=simplify(Expression)
print(Simple)
solve([-3+5*r,5*s-12*r+10*r**2],[r,s])
-3*eps + 5*eps*r + 5*eps**2*s - 12*eps**2*r + 10*eps**2*r**2 + 0(eps**3
)
[(3/5, 18/25)]
```

Answers. If we plug $1+r \varepsilon+s \varepsilon^{2}+\mathcal{O}\left(\varepsilon^{3}\right) \quad$ into equation ( $\star$ ) we obtain (with the script):

$$
\begin{equation*}
0=-3 \varepsilon+5 r \varepsilon+5 s \varepsilon^{2}-12 r \varepsilon^{2}+10 r^{2} \varepsilon^{2}+\mathcal{O}\left(\varepsilon^{3}\right) \tag{E}
\end{equation*}
$$

If we divide equation $(\mathcal{E})$ by $\boldsymbol{\varepsilon}$ we obtain
$0=-3+5 r+5 s \varepsilon-12 r \varepsilon+10 r^{2} \varepsilon+\mathcal{O}\left(\varepsilon^{2}\right)$,
which yields $-3+5 r=0 \quad$ by letting $\varepsilon \rightarrow 0$, i.e. $r=3 / 5$.
If we plug this into $(\mathcal{E})$ and divide by $\varepsilon^{2}$ we obtain

$$
0=5 s-12 r+10 r^{2}+\mathcal{O}(\varepsilon)
$$

which gives $5 s-12 r+10 r^{2}=0 \quad$, i.e. $s=18 / 25$
Finally,

$$
S_{\varepsilon}=1+\frac{3}{5} \varepsilon+\frac{18}{25} \varepsilon^{2}+\mathcal{O}\left(\varepsilon^{2}\right)
$$

