

# Taller\_04\_splines\_cubicos\_PintoJuanFrancisco-Luis Lema

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METODOS NUMERICOS ICCD412

Taller 04 Splines Cúbicos

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## 0.0.1 Complete el código del siguiente repositorio

<https://github.com/ztjona/splines>

```
[ ]: #codigo proporcionado por el docente

import sympy as sym
from IPython.display import display

# #####
def cubic_spline(xs: list[float], ys: list[float]) -> list[sym.Symbol]:
    """
    Cubic spline interpolation ``S``. Every two points are interpolated by a
    ↪cubic polynomial
    ``S_j`` of the form ``S_j(x) = a_j + b_j(x - x_j) + c_j(x - x_j)^2 + d_j(x -
    ↪x_j)^3``.

    xs must be different but not necessarily ordered nor equally spaced.

    ## Parameters
    - xs, ys: points to be interpolated

    ## Return
    - List of symbolic expressions for the cubic spline interpolation.
    """
```

```

points = sorted(zip(xs, ys), key=lambda x: x[0]) # sort points by x

xs = [x for x, _ in points]
ys = [y for _, y in points]

n = len(points) - 1 # number of splines

h = [xs[i + 1] - xs[i] for i in range(n)] # distances between contiguous
↪xs

# alpha = # completar
for i in range(1, n):
    alpha[i] = 3 / h[i] * (ys[i + 1] - ys[i]) - 3 / h[i - 1] * (ys[i] -
↪ys[i - 1])

l = [1]
u = [0]
z = [0]

for i in range(1, n):
    l += [2 * (xs[i + 1] - xs[i - 1]) - h[i - 1] * u[i - 1]]
    u += [h[i] / l[i]]
    z # = completar

l.append(1)
z.append(0)
c = [0] * (n + 1)

x = sym.Symbol("x")
splines = []
for j in range(n - 1, -1, -1):
    c[j] = z[j] - u[j] * c[j + 1]
    b = (ys[j + 1] - ys[j]) / h[j] - h[j] * (c[j + 1] + 2 * c[j]) / 3
    d = (c[j + 1] - c[j]) / (3 * h[j])
    a # = completar
    print(j, a, b, c[j], d)
    S # = completar

    splines.append(S)
splines.reverse()
return splines

```

[5]: #codigo completado

```

# el algoritmo realiza el ordenamiento con las coordenadas "x", calcula las
↪distancias "h"

```

```

# calcula alpha , y resuelve el sistema tridiagonal con el algoritmo de Thomas
# con el algoritmo de thomas calcula los coeficientes c, b, d y a de cada
↳ polinomio cubico
# construye los splines para cada intervalo y los devuelve en una lista

import sympy as sym
from IPython.display import display

# #####
def cubic_spline(xs: list[float], ys: list[float]) -> list[sym.Symbol]:
    """
        Cubic spline interpolation ``S``. Every two points are interpolated by a
        ↳ cubic polynomial
        ``S_j`` of the form ``S_j(x) = a_j + b_j(x - x_j) + c_j(x - x_j)^2 + d_j(x -
        ↳ x_j)^3``.

        xs must be different but not necessarily ordered nor equally spaced.

        ## Parameters
        - xs, ys: points to be interpolated

        ## Return
        - List of symbolic expressions for the cubic spline interpolation.
        """

    points = sorted(zip(xs, ys), key=lambda x: x[0])

    xs = [x for x, _ in points]
    ys = [y for _, y in points]

    n = len(points) - 1

    h = [xs[i + 1] - xs[i] for i in range(n)]

    # inicializamos una lista alpha con n+1 elementos en 0
    alpha = [0] * (n + 1)

    # creamos la inicializacion de alpha para que en la compilacion no de error
    ↳
    for i in range(1, n):
        alpha[i] = 3 / h[i] * (ys[i + 1] - ys[i]) - 3 / h[i - 1] * (ys[i] -
        ↳ ys[i - 1])

    l = [1]
    u = [0]
    z = [0]

```

```

for i in range(1, n):
    l += [2 * (xs[i + 1] - xs[i - 1]) - h[i - 1] * u[i - 1]]
    u += [h[i] / l[i]]
    # calculamos z con el algoritmo de Thomas completado
    z += [(alpha[i] - h[i - 1] * z[i - 1]) / l[i]]

l.append(1)
z.append(0)
c = [0] * (n + 1)

x = sym.Symbol("x")
splines = []
for j in range(n - 1, -1, -1):
    c[j] = z[j] - u[j] * c[j + 1]
    b = (ys[j + 1] - ys[j]) / h[j] - h[j] * (c[j + 1] + 2 * c[j]) / 3
    d = (c[j + 1] - c[j]) / (3 * h[j])
    # Asignamos un coeficiente a del polinomio cubico
    a = ys[j]
    print(j, a, b, c[j], d)
    # Definimos el polinomio cubico con Sympy
    S = a + b * (x - xs[j]) + c[j] * (x - xs[j])**2 + d * (x - xs[j])**3

    splines.append(S)
splines.reverse()
return splines

# Ejemplo de uso
xs = [0, 1, 2]
ys = [-5, -4, 3]

splines = cubic_spline(xs=xs, ys=ys)
print("Splines en forma simbólica:")
_ = [display(s) for s in splines]
print("-----")
print("Splines expandidos:")
_ = [display(s.expand()) for s in splines]

```

1 -4 4.0 4.5 -1.5

0 -5 -0.5 0.0 1.5

Splines en forma simbólica:

$1.5x^3 - 0.5x - 5$

$4.0x - 1.5(x - 1)^3 + 4.5(x - 1)^2 - 8.0$

-----

Splines expandidos:

$1.5x^3 - 0.5x - 5$

$$-1.5x^3 + 9.0x^2 - 9.5x - 2.0$$

*compruebe graficamente la solucion de los siguientes ejercicios:* 1.(0,1), (1,5), (2,3)

2.(0,-5), (1,-4), (2,3)

3.(0,-1), (1,1), (2,5), (3,2)

```
[6]: import sympy as sym
import numpy as np
import matplotlib.pyplot as plt

def cubic_spline_clamped(xs, ys, B0=0, B1=0):

    # ordenamiento de puntos
    points = sorted(zip(xs, ys), key=lambda x: x[0])
    xs = np.array([p[0] for p in points], dtype=float)
    ys = np.array([p[1] for p in points], dtype=float)

    n = len(xs) - 1
    h = xs[1:] - xs[:-1]

    # calculamos alpha
    alpha = np.zeros(n + 1)
    alpha[0] = (3 / h[0]) * (ys[1] - ys[0]) - 3 * B0
    alpha[-1] = 3 * B1 - (3 / h[-1]) * (ys[-1] - ys[-2])

    for i in range(1, n):
        alpha[i] = (3 / h[i]) * (ys[i + 1] - ys[i]) - (3 / h[i - 1]) * (ys[i] -
↪ys[i - 1])

    # resolvemos el sistema tridiagonal con Thomas
    l = np.zeros(n + 1)
    u = np.zeros(n + 1)
    z = np.zeros(n + 1)

    l[0] = 2 * h[0]
    u[0] = 0.5
    z[0] = alpha[0] / l[0]

    for i in range(1, n):
        l[i] = 2 * (xs[i + 1] - xs[i - 1]) - h[i - 1] * u[i - 1]
        u[i] = h[i] / l[i]
        z[i] = (alpha[i] - h[i - 1] * z[i - 1]) / l[i]

    l[n] = h[n - 1] * (2 - u[n - 1])
    z[n] = (alpha[n] - h[n - 1] * z[n - 1]) / l[n]
```

```

# calculamos los coeficientes
c = np.zeros(n + 1)
c[n] = z[n]

for j in range(n - 1, -1, -1):
    c[j] = z[j] - u[j] * c[j + 1]

# construimos los splines
x_sym = sym.Symbol("x")
splines = []

for j in range(n):
    a = ys[j]
    b = (ys[j + 1] - ys[j]) / h[j] - h[j] * (c[j + 1] + 2 * c[j]) / 3
    d = (c[j + 1] - c[j]) / (3 * h[j])
    S = a + b*(x_sym - xs[j]) + c[j]*(x_sym - xs[j])**2 + d*(x_sym -
↪xs[j])**3
    splines.append((sym.simplify(S), (xs[j], xs[j + 1])))

# graficar los splines
plt.figure(figsize=(10, 5))

for S, (xi, xf) in splines:
    f = sym.lambdify(x_sym, S, "numpy")
    x_vals = np.linspace(xi, xf, 200)
    plt.plot(x_vals, f(x_vals), label=f"${sym.simplify(S)}$")

# graficar puntos
plt.plot(xs, ys, "o", color="black", label="datos")

plt.title("spline cubico con condiciones de borde (B0 = 0, B1 = 0)")
plt.xlabel("x")
plt.ylabel("S(x)")
plt.legend()
plt.grid(True)
plt.tight_layout()
plt.show()

return [S for S, _ in splines]

```

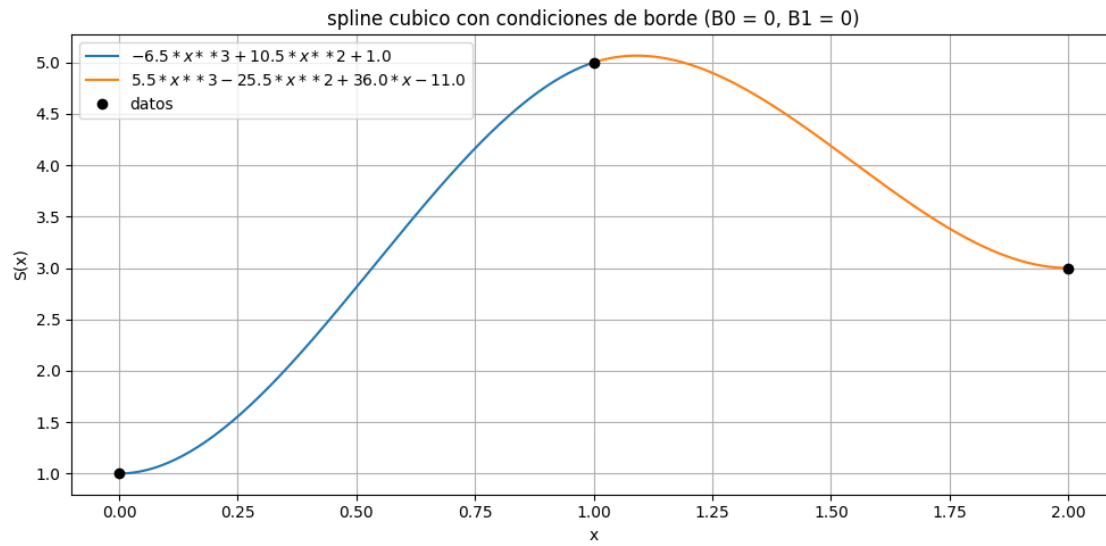
```

[7]: xs = [0, 1, 2]
     ys = [1, 5, 3]

     print("Spline cubico para las cordnadas (0,1),(1,5),(2,3)")
     splines = cubic_spline_clamped(xs, ys)
     splines

```

Spline cubico para las cordnadas (0,1),(1,5),(2,3)

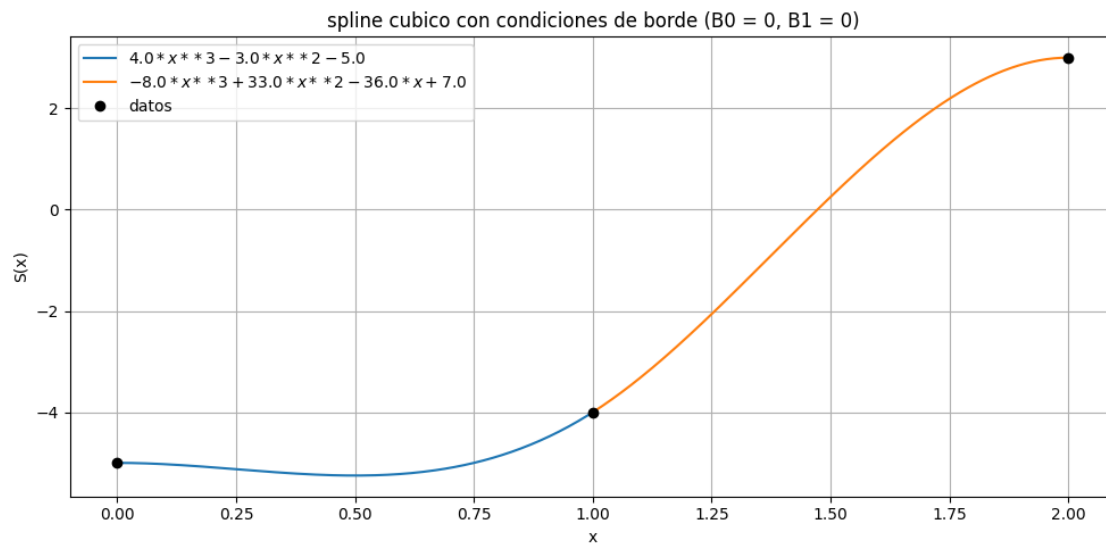


[7]:  $[-6.5x^3 + 10.5x^2 + 1.0, 5.5x^3 - 25.5x^2 + 36.0x - 11.0]$

```
[19]: xs = [0, 1, 2]
ys = [-5, -4, 3]

print("Spline cubico para las coordenadas (0,-5),(1,-4),(2,3)")
splines = cubic_spline_clamped(xs, ys)
splines
```

Spline cubico para las coordenadas (0,-5),(1,-4),(2,3)

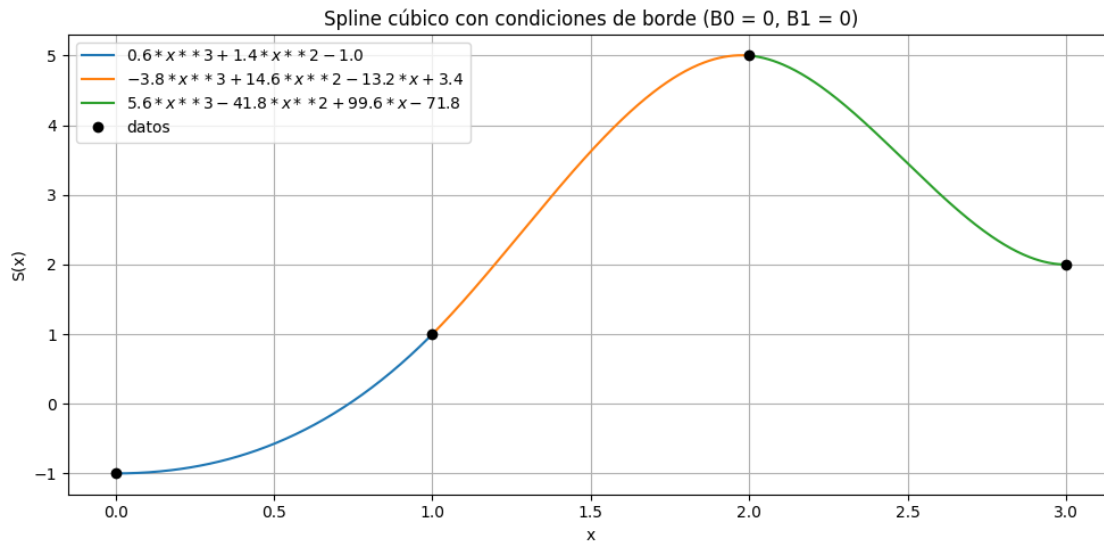


```
[19]: [4.0*x**3 - 3.0*x**2 - 5.0, -8.0*x**3 + 33.0*x**2 - 36.0*x + 7.0]
```

```
[8]: xs = [0, 1, 2, 3]
ys = [-1, 1, 5, 2]

print("Spline cubico para (0,-1),(1,1),(2,5),(3,2)")
splines = cubic_spline_clamped(xs, ys)
splines
```

Spline cubico para (0,-1),(1,1),(2,5),(3,2)



```
[8]: [0.6*x**3 + 1.4*x**2 - 1.0,
      -3.8*x**3 + 14.6*x**2 - 13.2*x + 3.4,
      5.6*x**3 - 41.8*x**2 + 99.6*x - 71.8]
```

-Para cada uno de los ejercicios anteriores, resuelva los splines cúbicos de frontera condicionada con  $B_0 = 1$  para todos los valores de  $B_1 \in \mathbb{R}$

```
[ ]: # Gráfica interactiva con control de B_1
from ipywidgets import interact, FloatSlider
import matplotlib.pyplot as plt
import numpy as np
import sympy as sym

def plot_interactive_spline(xs, ys, B0=0):
    """
    Crea una gráfica interactiva del spline cúbico con control deslizante para  $B_1$ 
    ↪ B_1
```



```

Parámetros:
xs: puntos x
ys: puntos y
B0: condición de borde inicial (fija)
"""

def update_plot(B1):
    # ordenamiento de puntos
    points = sorted(zip(xs, ys), key=lambda x: x[0])
    xs_sorted = np.array([p[0] for p in points], dtype=float)
    ys_sorted = np.array([p[1] for p in points], dtype=float)

    n = len(xs_sorted) - 1
    h = xs_sorted[1:] - xs_sorted[:-1]

    # calculamos alpha
    alpha = np.zeros(n + 1)
    alpha[0] = (3 / h[0]) * (ys_sorted[1] - ys_sorted[0]) - 3 * B0
    alpha[-1] = 3 * B1 - (3 / h[-1]) * (ys_sorted[-1] - ys_sorted[-2])

    for i in range(1, n):
        alpha[i] = (3 / h[i]) * (ys_sorted[i + 1] - ys_sorted[i]) - (3 /
↪h[i - 1]) * (ys_sorted[i] - ys_sorted[i - 1])

    # resolvemos el sistema tridiagonal con Thomas
    l = np.zeros(n + 1)
    u = np.zeros(n + 1)
    z = np.zeros(n + 1)

    l[0] = 2 * h[0]
    u[0] = 0.5
    z[0] = alpha[0] / l[0]

    for i in range(1, n):
        l[i] = 2 * (xs_sorted[i + 1] - xs_sorted[i - 1]) - h[i - 1] * u[i -
↪1]

        u[i] = h[i] / l[i]
        z[i] = (alpha[i] - h[i - 1] * z[i - 1]) / l[i]

    l[n] = h[n - 1] * (2 - u[n - 1])
    z[n] = (alpha[n] - h[n - 1] * z[n - 1]) / l[n]

    # calculamos los coeficientes
    c = np.zeros(n + 1)
    c[n] = z[n]

    for j in range(n - 1, -1, -1):

```

```

        c[j] = z[j] - u[j] * c[j + 1]

# construimos los splines
x_sym = sym.Symbol("x")
splines = []

for j in range(n):
    a = ys_sorted[j]
    b = (ys_sorted[j + 1] - ys_sorted[j]) / h[j] - h[j] * (c[j + 1] + 2
↪ * c[j]) / 3
    d = (c[j + 1] - c[j]) / (3 * h[j])
    S = a + b*(x_sym - xs_sorted[j]) + c[j]*(x_sym - xs_sorted[j])**2 +
↪ d*(x_sym - xs_sorted[j])**3
    splines.append((S, (xs_sorted[j], xs_sorted[j + 1])))

# graficar los splines
plt.figure(figsize=(12, 6))

for S, (xi, xf) in splines:
    f = sym.lambdify(x_sym, S, "numpy")
    x_vals = np.linspace(xi, xf, 200)
    plt.plot(x_vals, f(x_vals), 'b-', linewidth=2)

# graficar puntos
plt.plot(xs_sorted, ys_sorted, "o", color="red", markersize=8,
↪ label="Datos", zorder=5)

# graficar la tangente en el último punto (usando B1)
x_tang = np.linspace(xs_sorted[-1] - 0.5, xs_sorted[-1] + 0.5, 100)
y_tang = ys_sorted[-1] + B1 * (x_tang - xs_sorted[-1])
plt.plot(x_tang, y_tang, 'r--', linewidth=2, label=f'Tangente en
↪ x={xs_sorted[-1]:.2f} (pendiente B={B1:.2f})')

# marcar el punto donde se dibuja la tangente
plt.plot(xs_sorted[-1], ys_sorted[-1], 'go', markersize=10,
↪ label='Punto final', zorder=6)

plt.title(f"Spline Cúbico Interactivo - B = {B0:.2f}, B = {B1:.2f}",
↪ fontsize=14)
plt.xlabel("x", fontsize=12)
plt.ylabel("S(x)", fontsize=12)
plt.legend(fontsize=10)
plt.grid(True, alpha=0.3)
plt.tight_layout()
plt.show()

```

```

# Crear widget interactivo
interact(update_plot,
        B1=FloatSlider(value=0, min=-5, max=5, step=0.1,
                        description='B :',
                        style={'description_width': 'initial'},
                        continuous_update=False))

#Ejemplo de uso:
xs = [0, 1, 2, 3]
ys = [1, 2, 1.5, 3]
plot_interactive_spline(xs, ys, B0=0)

interactive(children=(FloatSlider(value=0.0, continuous_update=False,
    description='B :', max=5.0, min=-5.0, st...

```

```

[ ]: # Ejemplo de uso:
# xs = [0, 1, 2, 3]
# ys = [1, 2, 1.5, 3]
# plot_interactive_spline(xs, ys, B0=0)

```