Nelson Siegel Model Calibration in python

October 17, 2024

0.0.1 Introuction

The Nelson-Siegel-Svensson (NSS) model is an extension of the Nelson-Siegel model used for modeling the term structure of interest rates. It's widely used to fit and forecast interest rates across different maturities. The first form describes the yield curve by capturing the level, slope, and curvature of interest rates. The Svensson extension (1994) added two more parameters, making the model more flexible, especially for yield curves with hump.

Interpretation of Parameters

- (_0): Determines the long-term level of rates (when t->+infinite)
- (_1): Controls the steepness of the curve at short maturities.
- (_2): Controls the curvature or hump in the middle of the curve.
- (_3): Adds flexibility to capture multiple humps.
- (_1) and (_2): Control how fast the short-term and medium-term effects decay.

Advantages of NSS Model

- Flexibility: Captures complex yield curve shapes (e.g., multiple humps).
- Smoothness: Produces smooth yield curves, ideal for fitting real-world data.
- Parameter Interpretability: Intuitive economic interpretations of the parameters.

Use Cases

- Fitting Yield Curves: Fits observed yields across different maturities.
- Forecasting Interest Rates: Used for forecasting term structures.
- Risk Management: Helps in interest rate risk management and pricing fixed-income instruments.

. Limitations

- Overfitting: With more parameters, there's a risk of overfitting.
- Interpretability of Extra Terms: The additional term can be harder to justify economically.

0.0.2 Calbrating in python

The calibration of the Nelson-Siegel-Svensson (NSS) model involves estimating the model parameters (0, 1, 2, 3, 1, 2) by fitting the model to observed bond yield data. In Python, you can use optimization techniques to minimize the error between the observed yields and the yields predicted by the NSS model.

```
[111]: import numpy as np
               import matplotlib.pyplot as plt
               from scipy.optimize import minimize
               maturities = np.array([1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12, 13, 14, 1])
                 →15, 16, 17,18, 19, 20, 21, 22, 23, 24, 25, 26, 27, 28, 29, 30])
                                           np.array([-0.003937, 0.000992, 0.000701, 0.001704, 0.002338, _
                 →0.002821,0.003286, 0.003762, 0.00422, 0.004628, 0.005017, 0.005345, 0.
                  →005644, 0.005881, 0.006056, 0.006178, 0.006248, 0.006265,0.006251, 0.
                 →006204, 0.006137, 0.006048, 0.005949, 0.00584, 0.005709, 0.005579, 0.
                 →005439, 0.005289, 0.00515, 0.005022])
               def nelson_zc_rate(t, bo,b1,b2,b3, a1, a2):
                        return bo + b1* (1 - np.exp(-a1*t))/(a1*t) + b2* ((1 - np.exp(-a1*t))/(a
                  \Rightarrow (a1*t) - np.exp(-a1*t)) + b3* ((1 - np.exp(-a2*t))/(a2*t) - np.exp(-a2*t))
               def solve(params, maturities, yields):
                        def fit(params, maturities, yields):
                                 bo,b1,b2,b3, a1, a2 = params
                                 computed yield = nelson zc rate(maturities, bo,b1,b2,b3, a1, a2)
                                 return np.sum((computed yield-yields)**2)
                        opt sol = minimize(fit, params, args=(maturities, yields), method="BFGS", ...
                  \Rightarrowtol= 1.4e-6)
                        return opt_sol
               initial_params =(0.1, 0.1, 0.1, 0.1, 1.0, 1.0)
               opt_sol = solve(initial_params, maturities, yields)
               predicted_yield = nelson_zc_rate(maturities, *opt_sol.x)
               print('Computed params :' , opt_sol.x)
               print('Output : ',opt_sol)
               plt.figure(figsize=(16, 8))
               plt.plot(maturities, yields, marker='o', linestyle='-', color='b', __
                   ⇔label='Curve')
               plt.plot(maturities, predicted_yield, marker='s', linestyle='--', color='r',u
                  ⇒label='Rates with Nelson Siegel')
               plt.xlabel('Maturity')
```

```
plt.ylabel('Yield')
plt.title('Nelson Siegel calibration')
plt.grid(True)
plt.legend()
plt.show()

Compute params: [ 0 00686161 -0 25033285 0 44927459 -0 16238054 2 60574426
```

Output: message: Optimization terminated successfully.

success: True
status: 0

fun: 7.038498572658566e-06

x: [6.862e-03 -2.503e-01 4.493e-01 -1.624e-01 2.606e+00 1.651e+00]

nit: 135

jac: [-6.621e-07 2.272e-07 1.699e-07 3.052e-07 -1.114e-09

4.419e-08]

> [-8.090e+01 -2.822e+05 ... 5.873e+05 5.040e+05] [-7.393e+01 -2.424e+05 ... 5.040e+05 4.342e+05]]

nfev: 1099 njev: 157

