

# Advanced EONIA Curve Calibration

Avoiding unwanted shape oscillation in EUR overnight curve

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# Table of Contents

- 1 Turn-of-Year and Other Jumps
  - Empirical Evidence in EUR Market
  - Estimation of Jumps
  - EONIA Curve with Jumps
- 2 Forward Stub
  - Spot and Forward OIS Overlap
  - Solution
  - Results
- 3 Mixed Interpolation
  - Fitting EONIA Curve Functional Form
  - Solution
  - Results
- 4 Conclusions

# Table of Contents

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# Empirical Evidence in EUR Market

- Bootstrapping quality is usually measured by the smoothness of forward rates
- For even the best interpolation scheme to be effective, market jumps must be removed before calibration, then added back at the end of the process
- The most relevant rate jump is related to the *Turn-Of-Year* (TOY)
- A rate jump is usually related to increased liquidity demand because of end-of-month or end-of-year requirements.

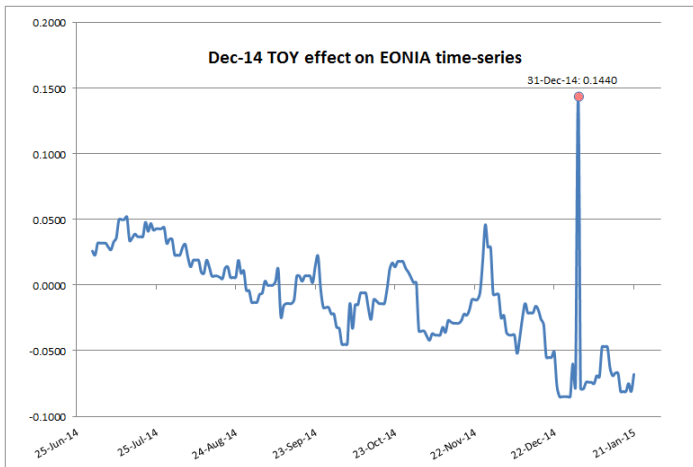


Figure: December 2014 EONIA Index turn-of-year

## The U.S. market case

However, previous definition does not work for the negative jumps observed for the USD Fed Funds rate



Figure: Fed Funds fixing, source: Bloomberg Terminal.

## Jump estimation methodology

In order to estimate jump sizes, Ametrano-Mazzocchi[1] propose a 4-step approach inspired by Burghardt [1]:

- 1 Build an overnight curve using a linear/flat interpolation, including all liquid market instruments
- 2 The first segment out of line with the preceding and following ones can be put back in line dumping the difference into a jump effect. For positive sizes:

$$[F^{original}(t_1, t_2) - F^{interp}(t_1, t_2)] \cdot \tau(t_1, t_2) = J^{Size} * \tau^J$$

- 3 Handle the jump as exogenous multiplicative coefficient for all discount factors after the jump date
- 4 Iterate ad libitum 2 and 3 for subsequent jump dates.

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# Negative Sizes

## Reviewed formula for negative sizes

The preceding formula is good for estimating positive jumps, but it needs a fix for negative jumps:

$$[F^{Interp}(t_1, t_2) - F^{Original}(t_1, t_2)] \cdot \tau(t_1, t_2) = J^{Size} * \tau^J$$

$$J^{Size} = [F^{Interp}(t_1, t_2) - F^{Original}(t_1, t_2)] \cdot \frac{\tau(t_1, t_2)}{\tau^J}$$

# EONIA and USD Overnight Curves Including Jumps

The resulting EONIA and USD overnight curves including jumps estimated through the preceding approach are shown in Figure 3 and 4

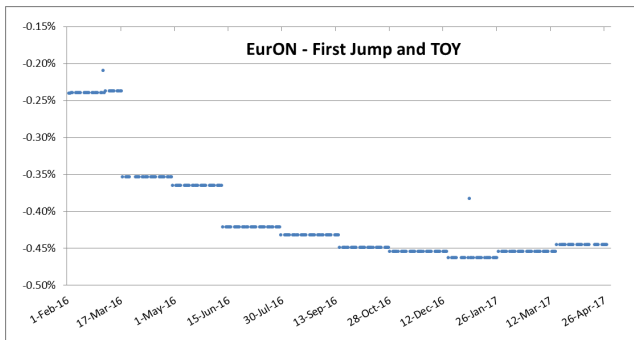


Figure: Eonia curve short end with estimated positive jumps.

# EONIA and USD Overnight Curves Including Jumps

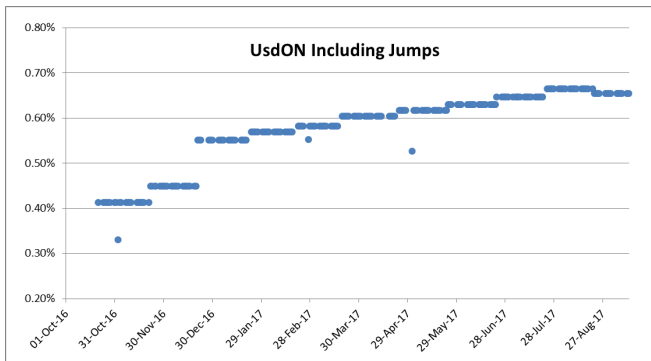


Figure: USDON curve short end with estimated negative jumps.

# Table of Contents

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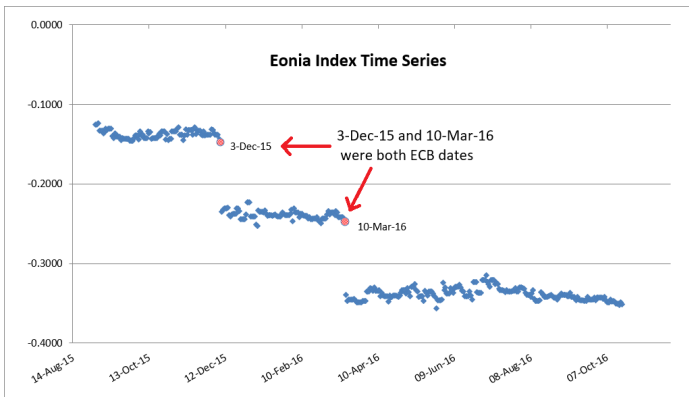


Figure: Piece-wise constant behaviour shown by EONIA fixings

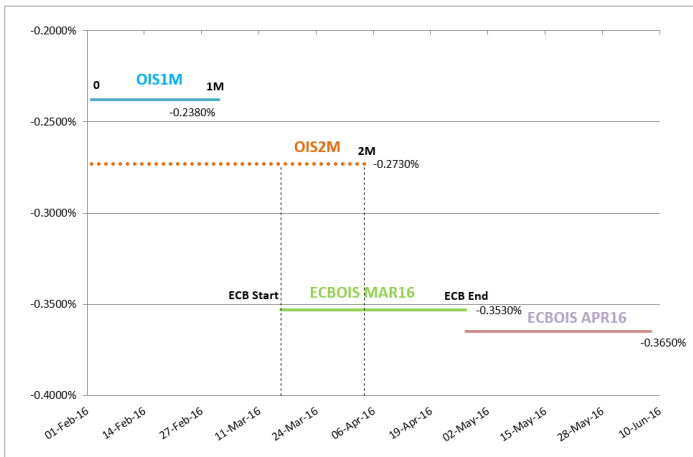


# Spot and Forward OIS Overlap

When mixing spot starting OIS (*Overnight Indexed Swaps*) and forward starting ECB OIS (*European Central Bank OIS*), the ECB OIS are preferred because of their greater liquidity.

## Imperfect Concatenation

In the bootstrapping of EONIA curve the sequential inclusion of a spot starting instrument is performed without knowledge of the forthcoming forward starting instrument, whose information content is more relevant for the overlapping section, as visible in Figure 6.



**Figure:** Overlapping EONIA instruments levels; dataset as of *January 29, 2016*

The calibration algorithm derives the average rate for:

- the interval  $(0; 1M)$  from OIS1M
- the interval  $(1M; 2M)$  from OIS2M
- the interval  $(2M; ECB_{end})$  from 1<sup>st</sup> ECB OIS

## Distortion

As a consequence, the bootstrapping does not use the ECB OIS relevant information for the interval  $(ECB_{start}; 2M)$ .

## Solution: Forward Stub

The error in  $(ECB_{start}; 2M)$  is especially relevant if the ECB OIS is accounting a rates cut/rise expectation

To solve this problem the suggestion is to build a "Forward Stub" meta-quote:

- Start date equal to the maturity of the last spot starting OIS non-overlapping with ECB OIS ( $1M$  in our case)
- Maturity equal to  $ECB_{start}$ , the settlement date of the first ECB OIS

This new meta-quote handle the transition between spot and forward starting instruments without overlap

The Forward Stub value is implied by market rates, ensuring the re-pricing of the discarded overlapping spot instrument:

### Condition

$$\int_0^{1M} f(s)ds + \int_{1M}^{ECB_{start}} f(s)ds + \int_{ECB_{start}}^{2M} f(s)ds = \int_0^{2M} f(s)ds$$

- $\int_0^{1M} f(s)ds = OIS1M$  value
- $\int_{1M}^{ECB_{start}} f(s)ds =$  Forward Stub value (*unknown*)
- $\int_{ECB_{start}}^{2M} f(s)ds =$  it is not a quoted market instrument
- $\int_0^{2M} f(s)ds = OIS2M$  value

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### Average rate in $(ECB_{start}; 2M)$

Which rate level in  $(ECB_{start}; 2M)$ ? There is no market instrument for this period.

### Proposal

Set the rate in  $(ECB_{start}; 2M)$  at the  $(ECB_{start}; ECB_{end})$  level, as this is supported by the empirical evidence of mostly flat rate between ECB meetings

- where the average rate in  $(ECB_{start}; ECB_{end})$  is known and equal to the 1<sup>st</sup> ECB OIS

Since the instantaneous forward rates integral in the interval  $(ECB_{start}; 2M)$  is known, the Forward Stub is the only unknown value, leading to:

### Forward Stub value

$$\int_{1M}^{ECB_{start}} f(s) ds = \frac{\int_0^{2M} f(s) ds}{\int_0^{1M} f(s) ds + \int_{ECB_{start}}^{2M} f(s) ds}$$

### Assuming continuous compounding

$$Forward\ Stub = \frac{\left[ \frac{e^{F(0,2M) \cdot \tau(0,2M)}}{e^{F(0,1M) \cdot \tau(0,1M)} \cdot e^{F(ECB_{start},2M) \cdot \tau(ECB_{start},2M)}} - 1 \right]}{\tau(1M, ECB_{start})}$$

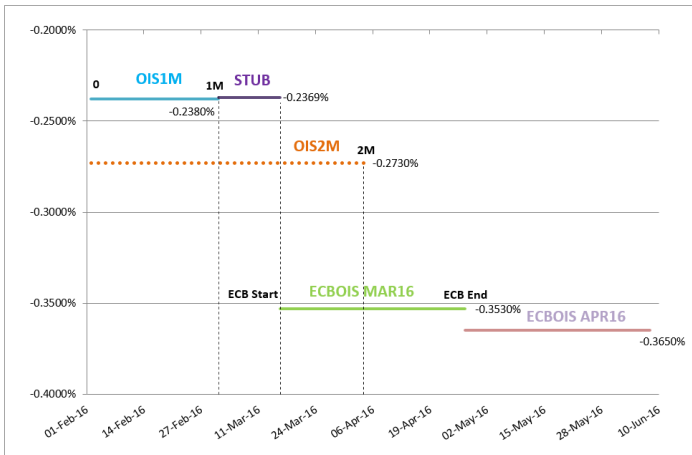


Figure: EONIA levels including the Forward Stub.

The Forward Stub algorithm is stable also in the limiting case of becoming a Spot Stub.

## Spot Stub

In particular calendar conditions, the discarded spot instrument might be the 1W OIS, making the Forward Stub actually spot starting:  $\tau(0, ECB_{start})$  (where  $ECB_{start}$  is the 1<sup>st</sup> ECB OIS fixing date)

## Spot Stub value

The Spot Stub value can be derived using the following formula:

$$Spot\ Stub = \frac{\left[ \frac{e^{F(0, ECB_{end}) \cdot \tau(0, ECB_{end})}}{e^{F(ECB_{start}, ECB_{end}) \cdot \tau(ECB_{start}, ECB_{end})}} - 1 \right]}{\tau(0, ECB_{start})}$$

# Repricing Errors analysis

Repricing Errors in Basis Points (Bps)				
Instruments		Overlapping		Forward Stub
OIS	2M		0.00	0.00
OIS	3M		-1.09	-0.05
OIS	4M		-0.72	0.05
OIS	5M		-0.64	-0.03
OIS	6M		-0.83	-0.32
OIS	7M		-0.45	-0.02
OIS	8M		-0.42	-0.04
OIS	9M		-0.33	0.01
OIS	10M		-0.31	-0.01
OIS	11M		-0.27	0.01
OIS	12M		-0.60	-0.35
OIS	15M		-0.24	-0.04
RMSE			0.57	0.14
ME			-1.09	-0.35

**Figure:** Repricing errors for instruments **not included** in the calibration.

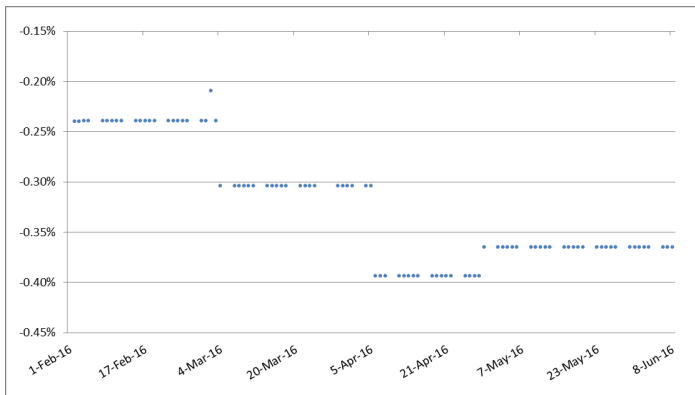


Figure: EONIA curve bootstrapped with overlapping instruments.

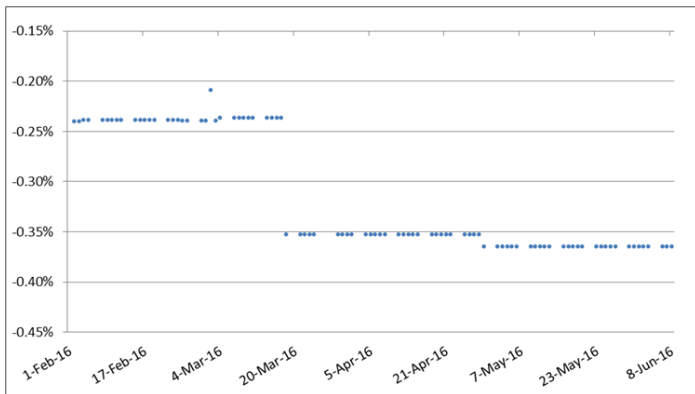


Figure: EONIA curve bootstrapped including the Forward Stub.



# Table of Contents

- 1 Turn-of-Year and Other Jumps
  - Empirical Evidence in EUR Market
  - Estimation of Jumps
  - EONIA Curve with Jumps
- 2 Forward Stub
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# Fitting EONIA Curve Functional Form

- EONIA fixings show an almost flat behaviour between ECB monetary policy meeting dates.
- On the short end we want piece-wise constant forward rates between ECB dates
- On the mid-long section of the curve to have constant forward rates between pillars spaced years apart is unrealistic; smooth interpolation is to be preferred

## Interpolation Problem

We need to accommodate conflicting interpolation requirements to model the overnight curve

# Solution: Mixed Interpolation technique

## Solution

The solution proposed is to build a new interpolation scheme named: "Mixed-Interpolation" that gives the possibility to merge two different interpolation techniques.

## Critical issues

- 1 At which point the interpolation scheme must be switched?
- 2 Which merging approach can be used?

## Our suggestion

- Merge a piecewise constant interpolation on the short end (up to the end of the ECB OIS strip) with a monotone cubic Hyman<sup>a</sup> filtered interpolation on the mid-long end.
- Set the "Switch Pillar" equal to the maturity of the last quoted ECB OIS

---

<sup>a</sup>for more information see [2]

## QuantLib implementation

The Mixed Interpolation algorithm is available in QuantLib for merging two different interpolations at the switch-pillar, using the first one for the short end and the second one for the long end. There are two merging alternatives:

- 1 *Share Range*: each interpolation is defined on the whole curve
- 2 *Split Range*: each interpolation is defined on (and restricted to) its own time period only

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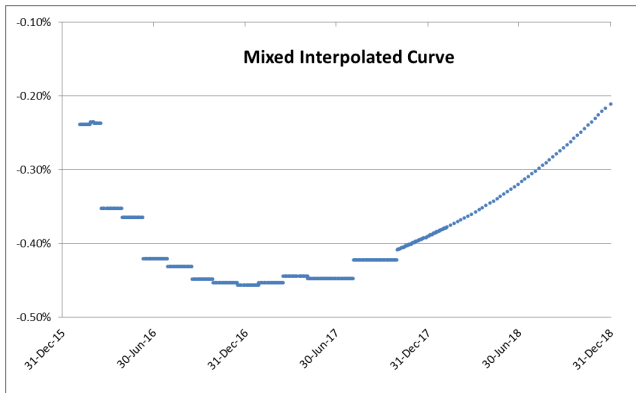
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# Repricing Errors Analysis

Repricing Errors in Basis Points (Bps)					
Instruments		Linear + Stub	MonotoneCubic + Stub	SplitRange	ShareRange
OIS	2M	0.00	0.00	0.00	0.00
OIS	3M	-0.05	-0.52	-0.05	-0.05
OIS	4M	0.05	-0.21	0.05	0.05
OIS	5M	-0.03	-0.12	-0.03	-0.03
OIS	6M	-0.32	-0.55	-0.32	-0.32
OIS	7M	-0.02	-0.19	-0.02	-0.02
OIS	8M	-0.04	-0.18	-0.04	-0.04
OIS	9M	0.01	-0.13	0.01	0.01
OIS	10M	-0.01	-0.13	-0.01	-0.01
OIS	11M	-0.03	-0.11	-0.03	-0.03
OIS	12M	-0.35	-0.47	-0.35	-0.35
OIS	15M	-0.04	-0.13	-0.04	-0.04
RMSE		0.14	0.29	0.14	0.14
ME		-0.35	-0.55	-0.35	-0.35

**Figure:** Repricing errors for instruments **not included** in the calibration.





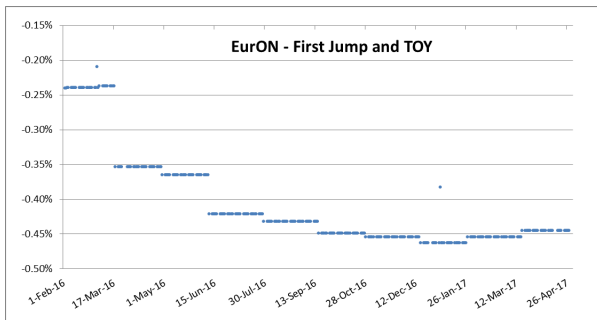
**Figure:** A mixed interpolated EONIA curve linearly interpolating log-discounts up to the last ECB OIS and then switching to a monotone log-cubic Hyman filtered interpolation.

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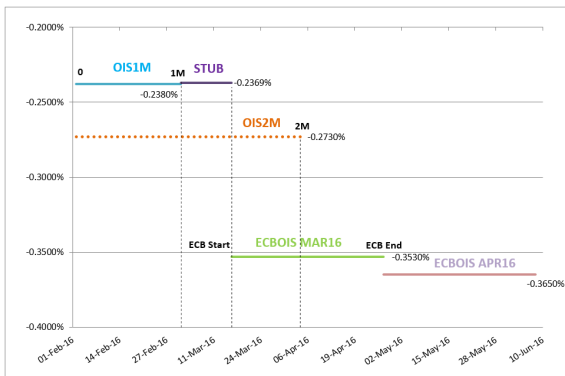
# Conclusions

- 1) Estimate TOYs and other jumps, account them before calibration



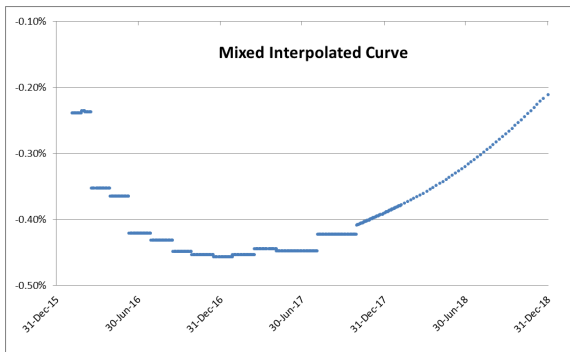
# Conclusions

- 2) Link spot instruments to forward instruments using the Forward Stub in order to avoid error in the overlapping section







# Conclusions





- 3) Use a mixed (log) linear-cubic (discount factor) interpolator to account for different requirements on the short and long end of the curve



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