Modeling interest rates	Negative rates	Model extensions	Conclusion

## Modeling Negative Rates YSM, Vorau 2021

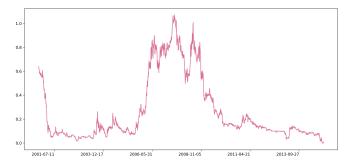
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2021. október 14.

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Interest rates			

### Japan Govt Bond 2Yr Compound Yield



Japan government bond 2 year compound yield from 2000.10.02 to 2014.12.17

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Purpose			

- goal: modeling yield curves
- trajectories similar to what we have seen in the past
- trajectories that contain future information (implied statistical features which can be observed in current prices)

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• purpose: pricing, risk managament

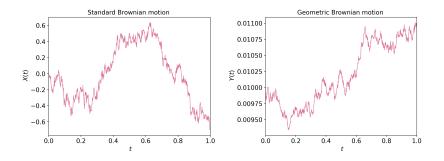
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Steps of the an	alysis		

- 4 main steps in the analysis
  - Inding the right trajectories, model class
  - O calibration
  - opricing financial assets
  - Isk management (hedging)
- the focus is on the first point  $\rightarrow$  finding statistically appropriate trajectories

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## Brownian motion



- Brownian motion  $\rightarrow$  normal distribution
- geometric Brownian motion  $\rightarrow$  lognormal distribution

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• drive processes in the models

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SABR model			

- standard practice in the financial world
- stochastic volatility model [Hagan (2002)]
- captures the volatility smile

$$df(t) = f^{\beta}(t)\nu(t)dW(t)$$
$$d\nu(t) = \alpha\nu(t)dZ(t)$$

- where  $\nu(0), \alpha \in \mathbb{R}^+$  and  $0 \le \beta \le 1$
- W(t) and Z(t) are one dimensional Wiener processes and  $d[W, Z](t) = \rho dt$ , where  $\rho \in [-1, 1]$ .

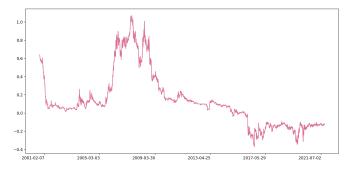
Modeling interest rates $000000$	Negative rates	$Model \ extensions$	Conclusion 000
SABR model			

- four parameter set:  $(\alpha, \nu, \beta, \rho)$
- $\alpha = \nu(0)$ : initial volatility
- $\nu(s)$ : the volatility of the volatility
- $\rho$ : correlation between the two Wiener process  $\rightarrow$  also the correlation between the rate and the volatility, the so-called skew
- $\beta$ : CEV (Constant Elasticity Variance) parameter (the power of the forward rates)

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Modeling interest rates	Negative rates $\bullet \circ \circ$	$Model\ extensions$ 00000	Conclusion 000
Negative rates			

#### Japan Govt Bond 2Yr Compound Yield



Japan government bond 2 year compound yield from 2000.10.02 to 2021.10.01

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Modeling interest rates 000000	Negative rates $0 \bullet 0$	$Model \ extensions$ 00000	Conclusion 000
Phenomean of	negative rate	25	

- due to economical conditions central banks were forced to lower interest rates
- negative interest rates appeared
- $\bullet\,$  new phenomean in the markets  $\rightarrow\,$  uncertainty
- models for pricing financial assets haven't worked anymore

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• mathematical models have to be extended

Modeling interest rates 000000	Negative rates $00 \bullet$	$Model \ extensions$	Conclusion 000
Desirable featur	res		

- heavy-tailed distribution: the probability of extreme values is higher than in the case of normal distribution
- left oblique-right extending distribution: lower interest rates are more common than high ones

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• appearance of **negative values** 



- taking the absolute value of the forward rate
- natural extension of the SABR model

 $df(t) = |f(t)|^{\beta} \nu(t) dW(t)$  $d\nu(t) = h(t)\nu(t) dZ(t)$ 

• W(t) and Z(t) are correlating Wiener-processes, where  $d[W, Z](t) = \rho dt$ 

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• the power  $0 \leq \beta < 0, 5$ .

Modeling interest rates	Negative rates	$Model \ extensions$	Conclusion 000
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Shifted SABR r	nodel		

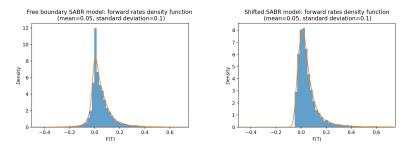
- add a displacement parameter to the SABR model
- s > 0: the shift size chosen apriori

$$df(t) = (f(t) + s)^{\beta} \nu(t) dW(t)$$
$$d\nu(t) = h(t)\nu(t) dZ(t)$$

- $\bullet \ 0 \leq \beta \leq 1$
- W(t) and Z(t) are two correlating one-dimensional Wiener processes,  $d[W, Z](t) = \rho dt$

Modeling interest rates	$Negative \ rates$ 000	$\begin{array}{c} Model \ extensions \\ \circ \circ \bullet \circ \circ \end{array}$	Conclusion
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### Simulations



Histograms of the free boundary SABR model and of the shifted SABR-LMM when the expected value is 5% and the standard deviation is 10%.

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Modeling interest rates 000000	$Negative \ rates$ 000	Model extensions 000●0	Conclusion 000		
Other extensions					

- Mixed model: mix between the Gaussian affine model and the Black model
- Heath-Jarrow-Morton framework: captures the dynamics of the yield curve

 Modeling interest rates
 Negative rates
 Model extensions
 Conclusion

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Important features in the practice

- how fast the model runs
- how flexible and accurate the model is
- how easy to interpret the parameters
- how well it can be calibrated

Modeling interest rates 000000	$Negative \ rates$ 000	$Model \ extensions$	Conclusion
Conclusion			

- both models have advantages and disadvantages
- the models meet the expectations of the statistical features
- the next step would be the calibration of the parameters
- after that they can be used to price financial assets

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Modeling interest rates	$Negative \ rates$ 000	$Model\ extensions$ 00000	$Conclusion \\ \circ \bullet \circ$
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Modeling interest rates	Negative rates	Model extensions	Conclusion
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# Thank you for your attention! Any questions?