

# Analysis of the EUR/HRK exchange rate and pricing options on the Croatian market: the NGARCH model as the alternative to the Black-Scholes model

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# Outline

- 1 Croatian Market of Derivatives: a Challenge of forming one
  - An explosive increase in trading on the Croatian market
- 2 Non-linear in mean asymmetric GARCH model
  - The NGARCH model for the EUR/HRK time series
  - Risk management
- 3 GARCH option pricing model
  - The European call option on the foreign currency
  - Analysis of foreign currency options

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## Trading on the Croatian market

- The interest of professional investors for financial derivatives on the Croatian market is steadily increasing
- The Croatian market of derivatives exists, but trading is of over-the-counter type only
- trading with nonlinear derivatives-options-does not exist yet
- trading is expected to start after the establishment of the legal framework

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- The interest of market participants has been always attracted by interventions of the Croatian national bank
- Croatia faces a possibility of changing the domestic currency
- We are motivated thus in exploring different kinds of foreign currency options
- We analyze in details the empirical distribution of the EUR/HRK currency time series and the *consequences* of such analysis for pricing foreign currency

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## Connection to the Black-Scholes model

- Prices on option markets are commonly quoted in terms of Black-Scholes implied volatility
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## The goal of this study is:

- to estimate the parameters in the dynamics of the currency time series using the NGARCH model,
- to simulate the prices of foreign currency options by means of the GARCH options pricing model using the estimated parameters
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# Modelling the EUR/HRK time series

- $P_t$  ... the EUR/HRK exchange rate price at time  $t$ , defined as the number of Croatian kunas required to purchase 1 euro
- The dynamics of returns  $R_t$  is described with

a non linear in mean, asymmetric GARCH (1,1) model:

$$R_{t+1} \equiv \ln \left( \frac{P_{t+1}}{P_t} \right) = r_d - r_t + \lambda \sigma_{t+1} - \frac{1}{2} \sigma_{t+1}^2 + \sigma_{t+1} Z_{t+1}, \quad (1)$$

$$\sigma_{t+1}^2 = \omega + \alpha (\sigma_t Z_t - \rho \sigma_t)^2 + \beta \sigma_t^2, \quad (2)$$

where  $Z_t$  are i.i.d.  $N(0, 1)$  and

$$\omega > 0, \quad \alpha \geq 0, \quad \beta \geq 0 \quad \text{and} \quad \alpha(1 + \rho^2) + \beta < 1. \quad (3)$$

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# Interpretation of parameters

- $r_d$  and  $r_f$  denote the one-period continuously compounded domestic and foreign interest rate
- $\lambda$  is the unit risk premium for the exchange rate
- a special attention in the model is devoted to the asymmetry parameter  $\rho$  which is known as the *leverage* effect

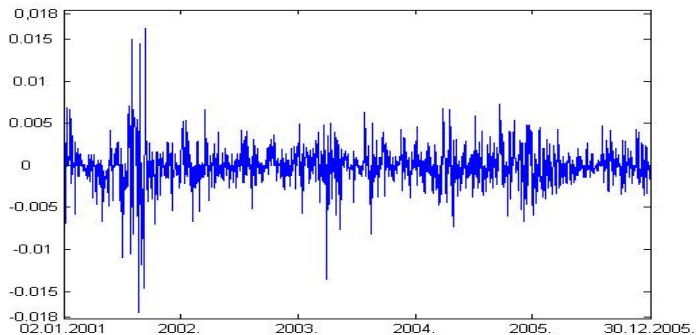
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## EUR/HRK 2001-2005





We use the MLE where the log-likelihood function is

$$L_T = \frac{1}{T} \sum_{t=1}^T \left[ -\frac{1}{2} \ln(2\pi) - \frac{1}{2} \ln(\sigma_t^2) - \frac{1}{2} \frac{(P_t - (r_d - r_f + \lambda\sigma_t - \frac{1}{2}\sigma_t^2))^2}{\sigma_t^2} \right], \quad (4)$$

where  $T = 1297$ .

Maximizing the  $L_T$  function we obtain

Parameter	Value	Sample standard error
$\hat{\omega}$	$1.7339 \cdot 10^{-7}$	$2.92 \cdot 10^{-8}$
$\hat{\lambda}$	-0.0301153	0.11311
$\hat{\alpha}$	0.095345	0.012028
$\hat{\beta}$	0.86840994	0.014289
$\hat{\rho}$	-0.1707379	0.074885
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- A key advantage of GARCH models for risk management is that the one-day ahead forecast of variance,  $E_t[\sigma_{t+1}^2]$ , is given directly by the model as  $\sigma_{t+1}^2$
- The imposed conditions on parameters enable to define the unconditional variance as

$$\sigma^2 \equiv E[\sigma_{t+1}^2] = \frac{\omega}{1 - \alpha(1 + \rho^2) - \beta}$$

- Forecasting the variance of the daily return  $k$  days ahead, using only information available at the end of today:

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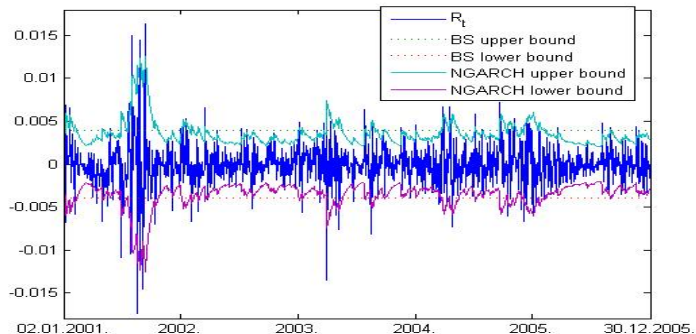
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The NGARCH model gives a more accurate estimation of risk since it incorporates the *heteroscedasticity*.





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We use the GARCH option pricing model of Duan (1995).

Days to maturity are counted in calendar days (365) not in business days per year (256)

$T$  ... maturity

$K$  ... strike

$\tau$  ... number of days remaining to maturity

We introduce some risk neutral criterium, namely the *equilibrium price measure*.

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## Definition

The equilibrium price measure satisfies the **local risk neutral valuation relationship** (LRNVR) if every asset value  $X_t$  measured in domestic currency satisfies

1.  $X_{t+1}/X_t$  is conditionally log-normal distributed w.r.t the equilibrium measure \*

- 2.

$$E_t^* [X_{t+1}/X_t] = e^{r_d}, \quad (5)$$

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$$\text{Var}_t^* [\ln(X_{t+1}/X_t)] = \text{Var}_t [\ln(X_{t+1}/X_t)], \quad (6)$$

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where  $Z_{t+1}^* = Z_{t+1} + \lambda \sim N(0, 1)$ , i.e.  $Z_t^*$  are i.i.d. with respect to the measure  $^*$ , satisfies properties 1, 2 and 3.

Relation (7) enables pricing foreign currency options!

We have even **more**: from relation (8) it follows that the risk premium  $\lambda$  has global influence on the conditional variance even the risk was locally neutralized with respect to  $^*$ .

The option price given by the GARCH model will be a function of the risk premium.

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# The price of the European call option on foreign currency

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The *fair* price of the European call option, in the risk neutral world, in time  $t$  with strike  $K$  and maturity date  $\tau + t$ ,  $\tau > 0$  is given by

$$co_t = \exp(-r_d\tau) E_t^* [\max(P_{t+\tau} - K, 0)]. \quad (9)$$

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## We use Monte Carlo simulations

$$c^{GH} \approx \exp(-r_d \tau) \frac{1}{MC} \sum_{i=1}^{MC} \max \{ P_{i,t+\tau} - K, 0 \}, \quad (10)$$

where  $MC = 50000$ , and for the  $i$  -  $th$  simulation we have

$$P_{i,t+\tau} = P_t \exp \left( \sum_{j=1}^{\tau} R_{i,t+j} \right), \quad i = 1, 2, \dots, MC. \quad (11)$$

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## Illustration: a simulation study

Option prices are calculated for:

- different **days to maturity**:  $\tau = 30, 60$  and 90 days
- different **moneyness**  $m = 0.97, 0.985, 1, 1.015$  and 1.03 which corresponds respectively to strikes  $K = 7.11495, 7.224975, 7.335, 7.445$  and 7.555 for **currency spot price**  $P_t = 7.335$ .
- the obtained prices are then compared to their Black-Scholes counterparts with the average annual volatility 0.036128
- in order to analyze the effect of the **asymmetry** parameter  $\rho$ , we repeat the simulation procedure for  $\rho = -0.461$  and  $\rho = 0$



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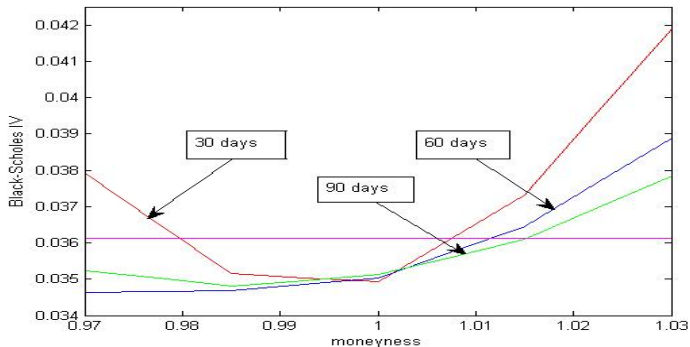
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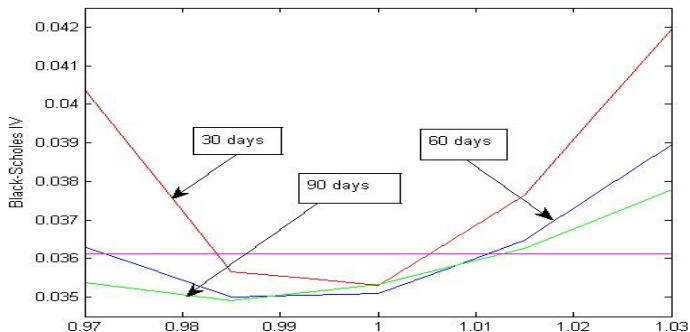
# The comparison: $\rho = -0.17074$

Mild negative asymmetry  $\implies$  options out of the money ( $K/P > 1$ ) are underpriced in the Black-Scholes model with constant volatility



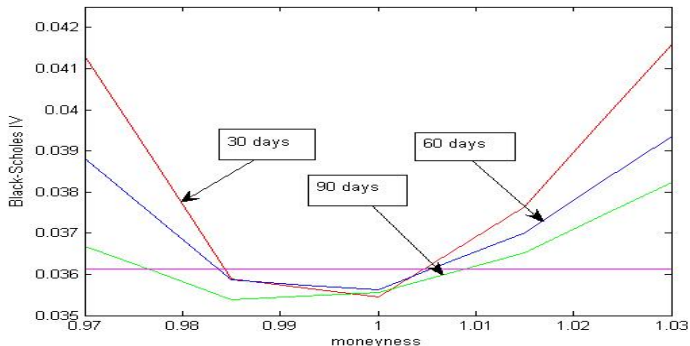
# The comparison: $\rho = -0.461$

- Moderate asymmetry  $\implies$  options out of the money ( $K/P > 1$ ) are underpriced in the Black-Scholes model with constant volatility and also some options ( $\tau = 30$ ) in the money
- the underpricing effect in the constant volatility model is now more pronounced for options in the money



# The comparison: $\rho = 0$

- the asymmetry is completely absent  $\implies$  the graph of implied volatility becomes almost symmetric (centered in  $K/P = 1$ )
- options deeply in the money and deeply out of the money are underpriced in the constant volatility model



### For all the graphs:

- for options out of the money, independently of  $\rho$ , the IV is a **decreasing** function of the maturity
- for options near the money ( $K/P \approx 1$ ) if the asymmetry is absent or very mild the IV is an **increasing** function of the maturity

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# Summary

- introducing **heteroscedasticity** results in better fitting of the empirical distribution of foreign currency
- the locally risk-neutral measure for the domestic economy is identified
- the GARCH model for option pricing in its formulation incorporates the **risk premium**
- Still, it is not a priori obvious what should be the risk premium for the volatility—using the time series data from the underlying we find it not significant
- once the market for derivatives will be formed, data from option markets!

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