

Residential property price forecasts within a short-sample environment

Alexander Karšay, MSc. Národná banka Slovenska

This article documents a method used by the Národná banka Slovenska in the Eurosystem projection process for the purpose of creating a forecast regarding the average price level of housing in the Slovak Republic. It also describes the analytical model applied to this end. Since available quarterly data only dates back to the first quarter of 2005, the application of standard econometric procedures provides questionable values of estimated parameters. For this reason, the selected approach uses calibrated elasticities of house prices with respect to various determinants from various international sources and based on this develops a single equation error correction model. Using NBS' and other forecasts of individual explanatory variables, the model is able to yield house price forecasts for the required period. Forecast evaluation shows some encouraging results since ex-post one step ahead forecasts and to some extent also medium term dynamic ex post forecasts do not deviate from the actual price observations.

- 1 Residential property prices the Slovak average – published quarterly on the NBS website: http://www.nbs. sk/sk/statisticke-udaje/vybrane-makroekonomicke-ukazovatele
- 2 Some authors also use real volume of loans. Due to this we include below the following two alternative methods of creating price forecasts: one without applying the volume of loans and one including this variable while it is expressed as the volume of loans to households divided by the gross disposable household income (I/v). The model is thus capable of depicting to a certain extent the adequacy of loan supply relative to incomes as well some imperfection in the credit market resulting in interest rates not fully reflecting the development of demand and supply in this market
- 3 The real interest rate can be calculated by subtracting the core inflation rate (the annual HICP inflation rate without unprocessed food and energy) from the nominal interest rate on new loans for property purchase in the relevant quarter.
- 4 Rhp = real house prices, i.e. the average price per m² expressed in constant prices of 2005 applying the core HICP. All variables except R enter the model in the form of a natural logarithm.



In the past, models of real estate prices (also referred to for brevity as house prices) were created for a large number of countries, especially from among OECD members. They are typically based on four or five determinants which, according to economic theories, should have a significant influence on prices. The aim of this analysis is to identify an appropriate function defining the relationship between price¹ and individual determinants, to estimate their respective coefficients indicating the strength of their impacts on prices, and finally, to produce forecasts with a 2-3 years horizon. The result is a simple linear model, the reliability of which is at the stage of testing, and predictions of which need to be seen as orientational, theoretical, and in progress, also with regards to all the future outlooks in the attached charts.

A large number of academic studies deal with identifying the main indicators that could be used for such purposes. On the basis of their findings, a simple model based on quarterly time series was created for Slovakia, containing the following main determinants² of real house prices:

- The real gross disposable household income (ry), seasonally adjusted;
- The real interest rate (R) on new loans to house-holds for housing purchases³;
- Housing supply, measured by the sum of seasonally adjusted numbers of dwellings under construction and completed (h);
- The number of inhabitants in the age band 25-40 years as an additional demand indicator (pop).

2. The theory of real estate price determination

Academic literature typically points to the theory that house prices are being driven by a fundamental relation which determines the equilibrium price. However, there are drivers which often cause deviations from this equilibrium, mainly investor expectations. For example, during an economic expansion, growing incomes cause an increase of equilibrium prices that consequently positively impact price and capital gains expectations, leading to excessive price increases. The contrary phenomenon can occur in a period of recession.

On the basis of this theory, one can assume that there exists an equilibrium price around which the actual price fluctuates and thus creates higher volatility than could be expected based on fundamental relationships only. The determinants mentioned in the introduction should affect mainly the equilibrium price. However, it also needs to be noted that currently no time series of prices exists that would be long enough to clearly indicate that under-evaluations or over-evaluations are characteristic or very significant for the Slovak market.

3. THE METHOD OF ESTIMATION

In order to obtain the forecast, it is first necessary to estimate the coefficients in the following equation:

$$rh\hat{p_t} = \hat{\mu_0} + \hat{\mu_1}y_t + \hat{\mu_2}R_t + \hat{\mu_3}h_t + \hat{\mu_4}pop_t + \hat{\mu_5}(l/y)_t$$
 (1)⁴

After substituting in for the variables on the right hand side of the equation, we obtain an esti-





mate of the equilibrium price. We could proceed in the same way when forecasting: the predicted values of the right hand side variables will be substituted in the equation and we will obtain the equilibrium house price forecast.

The actual estimation can be realised by the method of least squares (OLS)⁵. This method has been applied in several studies, since it captures the essence of the relationship in question: residential property prices are an endogenous variable, which is being influenced to various extent by five main exogenous determinants. Subsequently, the model can be extended by a disequilibrium component using the error correction model (ECM) described in Part 6.1. More complex models require more information on the right side of the equation, which is impossible in the case of a short sample.

Due to the above reasons, the simple OLS approach seems appropriate for estimation purposes although some potential problems will persist. The reason for this is the aforementioned short sample, and the non-standard development of the Slovak housing market in the given period (an almost uninterrupted real price growth). The estimated elasticities could therefore misleadingly attribute the price increases to the incorrect determinants and this could be avoided only with a substantially longer time series with a greater variability of the house price dynamics.

The following section will describe the OLS estimation results. Since these do not appear to be reliable, an alternative approach will also be presented, making use of the μ coefficients from various international sources, whose methodology and countries observed would be relevant in case of Slovakia.

4. Estimation results

Estimation in this case is severely affected by the sample length. As a result, the parameter estimates may be very unstable and change abruptly with each new observation and with each change in the number or nature of the explanatory variables. The low number of degrees of freedom will result in parameter estimates that can be very distant from approximate true impacts of exogenous variables on house prices. These unreliable elasticity estimates can have further negative impacts on the estimation outcomes, namely non-stationary residuals and finally ECM results, whereby the sign of the error correction term might be positive and perhaps insignificant. The outputs below illustrate the nature of the problems stemming from the short data sample.

When searching for the optimal relationship, a model based on equation (1) using the OLS was estimated first, incorporating a linear time trend (in order to account for the different time trends in the individual variables) (Table 1).

The parameter magnitudes and signs are as expected, except for population. Since the time trend is also statistically insignificant, we have also

estimated an alternative equation without the trend (Table 2).

In this case, all the estimated coefficients are in line with expectations.⁶ However, if we estimate the same model for the period from 2005Q1 through 2009Q2, the elasticities will change rather sharply (*pop* will increase to 4.44, *ry* will fall to 1.43, and *h* will fall to -1.54).

Next, it is necessary to verify if the residuals are stationary. If results with the full sample are considered again, the outcome will be that the residuals are non-stationary I(1). That would mean that no equilibrium relationship between the given variables exists. If, in spite of this, we estimate the full ECM model (to explain short-term movement of prices), the result will be a positive and insignificant coefficient of the error correction term, which is unsatisfactory from a modelling and forecasting perspective.⁷

Overall, the indicated estimation techniques reveal several shortcomings. The estimated parameters show significant instability. In order to identify the main determinants of the house price

- 5 A more precise method that could be used in this case is the method of fully modified ordinary least squares (FMOLS) which in contrast to the standard OLS method enables correct estimation of the variance for individual estimates of the u coefficients and to carry out correct hypothesis testing. In our case, however the standard and modified version of the OLS did not provide significantly different parameter estimates (hypothesis testing provided the same conclusions), therefore we provide as an approximation only the results of the OLS method. The author can provide the results of the FMOLS on request.
- 6 The only exception is the insignificant estimate of population elasticity. Since its absolute value is comparable with other parameters, we will not ignore its influence. Another problem of the estimation is the impossibility to verify the order of integration of variables. Some seem to behave as I(2) which is relatively unusual. On the other hand, other variables are stationary. We believe this problem

Table 1

				005Q1 2009Q3	
Method: Ordinar	y Least Squares		Number of included ob		
	Coefficient	Standard deviation	t-statistic	p-value	
C	18.039	86.273	0.209	0.8379	
@TREND	0.011	0.049	0.229	0.8231	
LOG(RY)	1.732	0.461	3.758	0.0027	
IR_REAL	-0.057	0.012	-4.900	0.0004	
LOG(H)	-1.340	0.319	-4.195	0.0012	
LOG(POP)	-1.649	12.279	-0.134	0.8954	
LOG(LY)	0.606	0.276	2.198	0.0483	
R ₂	0.990	Average LOG (I	7.010		
Corrected R ₂	0.986	LOG (RHP) standard deviation		0.189	
F-statistic	207.794	Durbin-Watsor	1.332		
F-statistic (p-value)	0.000				

Table 2

Dependent varia Method: Ordinar		Sample: 2005Q1 2009Q3 Number of included observations: 19			
	Coefficient	Standard deviation	t-statistic	p-value	
С	-1.153	18.983	-0.061	0.9525	
LOG(RY)	1.769	0.414	4.271	0.0009	
IR_REAL	-0.056	0.008	-6.790	0.0000	
LOG(H)	-1.343	0.307	-4.370	0.0008	
LOG(POP)	1.036	3.437	0.301	0.7679	
LOG(LY)	0.664	0.100	6.671	0.0000	
R ₂	0.990	Average LOG (RHP)		7.010	
Corrected R ₂	0.987	87 LOG (RHP) standard deviation		0.189	
F-statistic	268.950	Durbin-Watson		1.314	
F-statistic (p-value)	0.000				



- can be assigned to the short sample and we continue in the analysis of these results with the aim of illustrating further problematic results.
- 7 The results of the residual stationarity test and the ECM model will be indicated shortly in the full version of the article on the Internet page of the NBS.
- 8 Similar outcomes have been achieved when omitting the alternative indicator (I/y).
- 9 A list of research studies on the basis of which the coefficients were selected will be provided in full on the Internet page of the NBS.
- 10 Without the variable I/y. Chapter 7 includes this variable.
- 11 The article makes use of the data (including the forecasts of this data) available in the 4th quarter of 2009. At the time of publication of this article, more up to date observations of individual variables and their forecasts exist.
- 12 Data on nominal prices come from the website of the NBS. We can obtain real prices by deflating the nominal prices by the core HICP index. The model generates forecasts of real prices. Consequently, nominal forecasts may be calculated by a reverse application of the forecasts of core HICP for Slovakia for 2009 through 2011 from Eurosystem predictions.
- 13 ry the NBS creates its own forecasts. R – the forecast is based on the assumptions of the ECB (European Staff Macroeconomic Projections for the Furo Area. December 2009) regarding future EURIBOR rates: it is assumed that the nominal EURIBOR rates will be reflected in the nominal interest rates on housing loans. The Pop-prediction is taken from the Research Demographic Centre of Infostat (www.infostat.sk/vdc), h is the only variable for which no official forecasts exists. Therefore we applied the approach of a regression with lagged values of housing starts and the construction confidence indicator (Statistical Office of the Slovak Republic) and the remaining quarters were predicted using a simple ARIMA model with final expert modification.

movements in the past and in the future, we would need more stable values, which could potentially be achieved with a longer sample. Moreover, it is impossible to prove the existence of an equilibrium relationship between house prices and the individual determinants when using the ECM model and the test of residual stationarity. Due to the stated reasons, house price forecasts and statistical inference based on econometric results are not useful.⁸

The likely reason for these outcomes is the short sample size: house prices in the given period grew very dynamically and almost uninterruptedly, therefore there was not enough time to capture the influences of individual determinants.

5. An alternative approach – the selection of appropriate coefficients

Econometric estimation for the time being does not enable us to the make of reliable predictions. An alternative option, however, is calibration – adopting elasticities estimated in other relevant studies investigating the relationship between real estate prices and their determinants. Each of the coefficients in Table 3 expresses the calibrated elasticity for the Slovak Republic.⁹

Tabuľka 3

Variable	Coefficient		
ry	1		
R	-0.01		
рор	4.45		
l/y	0.24		
h	-0.5		

6. THE FORECASTS 10

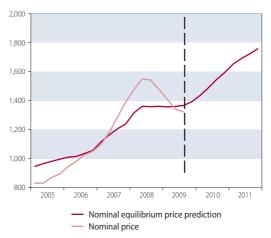
Equilibrium price was estimated for each quarter within the period from 2005Q1 to 2009Q3¹¹. It is a period for which actual observations were available for all variables within the model. Equilibrium prices will be compared with actual prices for the given period. Forecasts of equilibrium prices for the period from 2009Q4 to 2011Q4 will also be provided.¹²

Up to 2009Q3, the determinants are represented by their actual values. From 2009Q4, the actual data do not exist, we will, therefore, use their forecasts¹³.

According to the estimated equilibrium relationship (Equation 1 and Table 3), in 2009Q3 the nominal equilibrium prices increased (EUR 1,366 per m²) after more than one year of stagnation and should subsequently increase towards EUR 1,757 per m² which is 33% higher than the actual price in 2009Q3 (EUR 1,322 per m²). The prices at present seem to be just below their equilibrium level (by 3%).

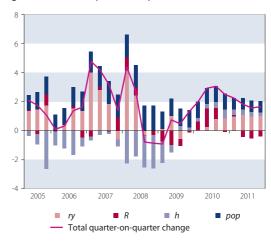
Chart 1 depicts a relatively close relationship between the equilibrium predicition and the actual price, although with visible under- and overvaluation (undervaluation of 14% in mid-2005 and over-

Chart 1 Nominal prices (in EUR per m²)



Source: Author's own calculations (applies for all charts in this article).

Chart 2 Contributions to the quarter-on-quarter growth of real equilibrium price (in %)



valuation of a similar extent in mid-2008). Quarteron-quarter dynamics of the equilibrium prices can be decomposed according to the contributions of individual determinants. The contribution of each one of them is depicted in Chart 2.

As one can see from Chart 1, a substantial gap between the estimate and reality was created in the period between 2008Q1 and Q3. According to Chart 2, the equilibrium price in the given period was negatively influenced by a significant increase in housing supply, which started to overshadow the contributions of income. The population grew more or less constantly during the whole period, thus positively affecting the price. The strongest impacts so far were stemming from income (which is considered to be an especially important price determinant). The influence of the real interest rate varied, depending on its coefficient and and changing level.

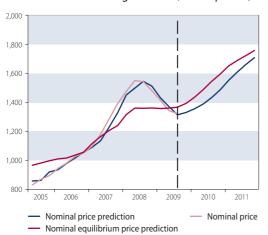
6.1. A detailed forecast description for the period 2009Q3 – 2011Q4

Chart 2 also depicts the influence of the determinants on the equilibrium price in the coming quarters. A significant weakening of the influence





Chart 3 Prediction using the ECM (in EUR per m²)



of supply on price is apparent. Supply should decline in the future as a result of the cooling real estate market, creating a slightly positive pressure on the equilibrium price. This future scenario can be foreseen by looking at the downward tendency of housing starts at present as well as extremely low levels of the construction confidence indicator. The current forecasts for *ry* suggest that the contribution of this variable to price growth will be visibly lower when compared to the recent past.

The current level of interest rates can also support price growth in the future. The last indicator (pop) maintains an approximately constant growth trend, but later on, a slowdown is expected in the given category, in line with the available forecasts.

It is justified to ask how quickly the current actual price will achieve its equilibrium level, or, in the present situation, how long it will stay below this level. The ECM model is able to provide a theoretical answer.

Since the standard econometric procedure provided unreliable results, calibrated parameters will again be used. The model takes the following form:

Chart 5 Contributions to quarter-on-quarter growth of real equilibrium price (in %)

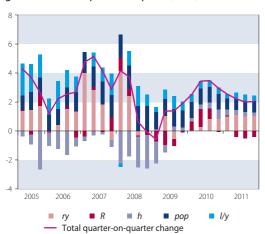


Chart 4 Nominal prices (in EUR per m²)



$$\Delta rhp_{t} = \alpha_{1}(rhp_{t-1} - rh\hat{p}_{t-1}) + \alpha_{2}\Delta ry_{t} + \alpha_{3}\Delta rhp_{t-1}$$

$$\alpha_{1} < 0, \alpha_{3} \in (0; 1)$$
(2)¹²

Predictions of the actual nominal price and its estimated equilibrium, as well as the complete nominal time series until 2011, are provided in Chart 3.

7. Model including the volume of loans provided

The model described in the previous part (model A) can be extended by including an additional explanatory variable $(l/y)^{15}$, which serves as another indicator of demand. The estimate of equilibrium price then takes the form of equation (1), and the full ECM model will be estimated by applying equation (2).

According to Chart 4 the equilibrium price continues to grow in the 4th quarter of 2009 following a period of stagnation in the second half of 2008 and at the beginning of 2009, and it subsequently grows to the level of EUR 1,975 per m², which is 49% higher than the price observed in the 3rd quarter of 2009. Therefore, this version of

- 14 Where ∆ means quarter-on-quarter growth; rhpt-1 (hat) is the equilibrium price (estimated using the described method). The a3 coefficient lies in an open interval (0: 1) and expresses the inertia of house price growth or what is referred to as the feedback mechanism, whereby the growth trend of prices leads to further growth due to optimistic expectations, and the negative trend on the other hand increases the existing pessimism. This can contribute to more realistic price dynamics. The coefficients have the following values: $\alpha 1 = -0.2$; a2=-0.5; a3=-0.44 as an average of the results of several studies (details will be published in the full version of the article). The remaining determinants were assigned zero short-term influence: population growth will probably only have a gradual influence and does not need to imply immediate growth of demand; it is also assumed that increased supply will not be immediately visible in prices since sellers probably need time to modify their requested prices. In the case of interest rates, we assume that potential buyers take a certain time until the shock in rates influences their decision to enter the market. To identify the short-term impact of the I/y variable, not enough empirical material was available. Thanks to this structure, the model maintains its simplicity and transparency.
- 15 (I/y) expresses the ratio of household credit volume and gross household disposable income. We obtain future values of the variable using internal forecasts of the NBS used in Eurosystem predictions.

Chart 6 Prediction using the ECM (in EUR per m²)

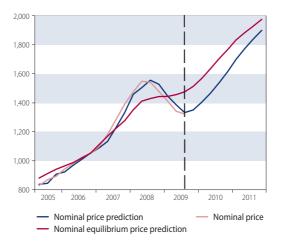




Chart 7.1. Quarter-on-quarter change of real price, model A (in %)

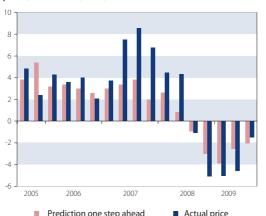


Chart 7.2. Quarter-on-quarter change of real price, model B (in %)



16 In these charts, the one step ahead forecasts for the period from 2005Q2 to 2009Q3 are expressed by the nominal price prediction curve for this period.

the model predicts a much steeper growth than model A. Moreover, the model suggests that the current observed price (in 2009Q3) is 10% lower compared to the equilibrium. The chart also shows a strong connection between equilibrium and actual prices, except for the 5 percent undervaluation in 2005 and an almost 10 percent overvaluation in mid-2008. This means that the inclusion of the credit indicator will yield estimates of equilibrium prices closer to actual prices than in the case of model A, while the capturing of under- and overvaluation is less evident.

Chart 5 explains contributions of individual determinants to the equilibrium price growth. This time, the chart includes the pro-growth influence of the credit indicator, while the other indicators maintain the same contributions as before. Based on the current medium-term predictions, *l/y* will be characterised by a slowing, but continuingly positive dynamics and the associated contribution to price growth.

Overall, adding the volume of loans to the model will lead to a steeper actual price prediction path. This is confirmed when using the ECM equation for the upcoming quarters, which predicts an immediate market recovery starting in the 4th quarter of 2009, and continuing to develop dynamically in accordance with Chart 6.

It is evident from the above that the prediction process eventually yields two sets of predictions. It is then up to the the forecaster to select the one that seems to be realistic, given the current state of the economy. Currently, a high level of uncertainty persists regarding the nature of recovery from the global recession, which may be protracted, immediately making the results of model A more likely. A longer recovery could also magnify the negative feedback in real estate prices and slow down the recovery of determinants such as income and supply of loans, leading to further downward pressure on real estate prices not captured in the equations discussed. A further downside risk to prices stems from the possible larger than expected excess supply in the Slovak residential property market, since we have observed a large number of new flats coming onto the market in the recent past and official statistics and models are not capable of confirming what is the precise extent of the excess and its price impacts. Due to these reasons, there is a need to perform expert adjustments to the selected price prediction trajectory based on important current information or other analyses. This approach is used by the NBS in its forecasts of real estate prices. It is necessary to point out that the presented model predictions are not official predictions of the NBS, and the results need to be considered as orientational and entirely theoretical, while their reliability will continue to be tested.

8. Prediction evaluation

The available data enable the evaluation of the "one step ahead" forecast precision for a substantial part of the sample (2005Q3 – 2009Q3), and also the evaluation of the dynamic ex post forecasts for several steps ahead. The latter involves making a long term forecast at a selected point in the past (e.g. in 2005Q2 for the period 2005Q3 – 2009Q3), while disregarding actual observations of real estate prices over the forecast period. On the other hand, actual observations of determinants will be used instead of their individual forecasts.

8.1. One step ahead forecast

The performance of short-term predictions of models A and B is depicted in Charts 3 and 6¹⁶ respectively, immediately suggesting a good level of precision regarding prices for the coming quarter. Table 4 provides some traditional accuracy statistics.

Chart 7 indicates that the predicted growth rates always have the correct sign and their magnitude is approximately correct, even though there are several exceptions. This regularity is confirmed by the accuracy statistics in Table 4. The correlation between predictions and actual values is relatively strong. MAPE shows a minor percentage deviation of actual values from their forecasts, and the Theil coefficient proves that



Chart 8.1. Medium-term forecast 2005Q2, real prices (in EUR per m²)

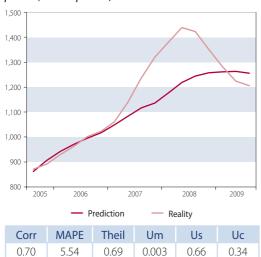


Chart 9.1. Medium-term forecast 2005Q2, real prices (in EUR per m²)

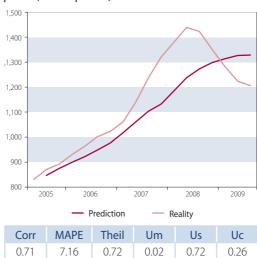


Chart 8.2. Medium-term forecast 2007Q3, real prices (in EUR per m²)

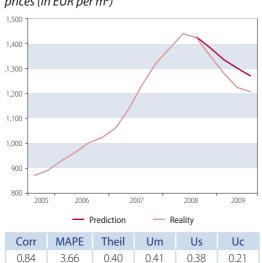


Chart 9.2. Medium-term forecast 2007Q3, real prices (in EUR per m²)



	Corr	MAPE	Theil	Um	Us	Uc
	0.93	6.25	0.84	0.09	0.87	0.04
ſ	0.59	4.68	0.62	0.08	0.60	0.32

Chart 8.3. Medium-term forecast 2008Q2, real prices (in EUR per m²)



0.80

4.62

0.57

0.16

0.40

0.44

Chart 9.3. Medium-term forecast 2008Q2, real prices (in EUR per m²)

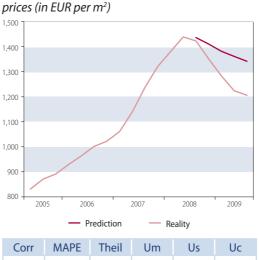




Table 4

	Model A	Model B
Correlation coefficient ¹⁷ (Corr)	0.86	0.90
Mean absolute percentage error (MAPE)18	1.84	2.18
Theil inequality coefficient (Theil)19	0.51	0.55
Bias proportion (Um)	0.13	0.10
Variance proportion (Us)	0.34	0.67
Covariance proportion (Uc)	0.54	0.23

- 17 Correlation between predicted and actual quarter-on-quarter growth rates.
- 18 For example Pindyck, Rubinfeld (1991). Calculated from price levels.
- 19 For example Watson, Teelucksingh (2002). The value of the coefficient greater than 1 means that the prediction is worse than a "naive" forecast with zero future growth, while values declining from 1 to zero signal movement from a naive forecast to a forecast with perfect precision,
- 20 Instead of this point, it would be possible to select also 2007Q2 or 2007Q1. The results are very similar, however.
- 21 Tables adjacent to the second and third chart in Chart 8 contain two types of information. The first row in each table evaluates the forecast for the period shown in the chart above the table. The second row for the purposes of creating the statistics groups together all n-step ahead forecasts starting at points 2005q3 2007q4 (and for the third table 2005Q3 2008Q2), where n is the number of forecast steps in the respective graph above the table
- 22 Due to the clarity of Charts 8 and 9, the equilibrium price curve was removed. The distinction between nominal and real quantities in this case is not substantial.

the models dominate a naive prediction of zero change. It is positive that the Um is close to zero in both cases. However, the Us is relatively high, especially in the case of model B. However, the results are satisfactory overall.

8.2. Medium-term forecasts

A further step will be to compare the forecasts for several quarters with actual prices. Three important points in the previous cycle were selected for this purpose (2005Q2 – 1st case: bottom of the previous cycle, 2007Q3²⁰ – 2nd case: strengthening of the residential boom and 2008Q2 – 3rd case: peak of the cycle) and in each case, prediction for the following period until 2009Q3 was created. The results of model A are described in Chart 8.²¹

These three evaluations in general provide a satisfactory view of the future direction of the market, even with longer forecast horizons, as visible especially in the first chart in which the forecasts follows the actual values for almost two years, but also in the third chart, which depicts the future adjustment of the disequilibrium, even though at a somewhat slower rate. The level of correlation confirms that the growth rates are moving together visibly and that Theil coeffi-

cient again shows improvement compared with the "naive" forecast. On the other hand, however, some shortcomings are also evident, especially the inability of the forecast to capture the price explosion from the beginning of the second half of 2007 in the 1st and 2nd case. That is also the reason for the less favourable results for MAPE in the 1st and 2nd case, Um in the 3rd case, and Uc in all cases. The forecast more or less tracks the estimated equilibrium price or, in the period from 2005 to 2006 (the 1st case) and 2008-2009 (the 3rd case) converges towards the equilibrium at a realistic pace.²² The B model is examined in Chart 9.

Overall, model B achieved at first glance somewhat less precise forecasts, even though the comparison of the evaluation statistics is not capable of identifying clearly if it is true in all cases. In spite of the fact that the 1st case is comparable with model A, in the 2nd and 3nd case a pro-growth influence of the credit indicator is visible. At this moment it can thus be observed that model B achieved slightly weaker results, but the success rate of the models can change in the future.

9. Conclusion

The ECM model described in this article can indicate likely overvaluation and undervaluation, establish current and future equilibrium prices and on the basis of this information, identify the anticipated direction and extent of the future movement of real estate prices. The applied approach could more suitably depict the impact of individual determinants when compared to traditional econometric analysis. However, possible uncertainty and randomness regarding the selected parameters, future determinant values and the model structure also require expert as-

Table 5 Summary results of the model forecast

MODEL A	Nominal price	Change (%) y-o-y	Change (%) q-o-q	MODEL B	Nominal price	Change (%) y-o-y	Change (%) q-o-q
2009Q4	1330	-10.1	0.6	2009Q4	1350	-8.7	2.2
2009 average	1352	-10.5	-2.6	2009 average	1357	-10.1	-2.2
2010Q1	1356	-4.0	2.0	2010Q1	1404	-0.6	4.0
2010Q2	1388	3.4	2.4	2010Q2	1465	9.2	4.3
2010Q3	1433	8.4	3.3	2010Q3	1537	16.2	4.9
2010Q4	1486	11.7	3.7	2010Q4	1612	19.4	4.9
2010 average	1416	4.9	2.8	2010 average	1505	11.0	4.5
2011Q1	1553	14.5	4.5	2011Q1	1700	21.0	5.4
2011Q2	1609	15.9	3.6	2011Q2	1772	21.0	4.3
2011Q3	1660	15.8	3.2	2011Q3	1839	19.6	3.7
2011Q4	1708	14.9	2.9	2011Q4	1899	17.8	3.3
2011 average	1632	15.3	3.5	2011 average	1802	19.9	4.2
Change of average 2009 (%)	-	-10.6	-	Change of average 2009 (%)	-	-10.2	-
Change of average 2010 (%)	-	4.7	-	Change of average 2010 (%)	-	10.9	-
Change of average 2011 (%)	-	15.3	-	Change of average 2011 (%)	-	19.8	-



sessment of market developments and further testing of the given model, which is currently being used as additional work aid. When it comes to the evaluation of model forecasts, it is evident that the "one step ahead" forecasts do not differ substantially from actual observations. Longer-

term forecasts in general capture the future price trend. However they are not able to predict some important fluctuations. In the future it will be important to monitor the forecast precision, and to apply new forecasting methods as the number of observations increases.

References (the full list will be published shortly in the full version of the article on the website of the NBS):

- Égert, Mihaljek: Determinants of House Prices in Central and Eastern Europe, Czech National Bank Working Paper Series (2008).
- 2. Fair: Evaluating the predictive accuracy of models; Handbook of Econometricts, Volume III, Edited by Griliches and Intriligator, Elsevier Science Publishers (1986).
- 3. HM Treasury: Housing, Consumption and the EMU (2003); http>//www.hm-treasury.gov.uk/housing_consumtion_and_emu.htm
- Iossifov, Čihák, Shangavi: Interest rate Elasticity of Residential Housing Prices; IMF Working Paper, WP/08/247 (2008).
- Pindyck, Rubinfeld: Economic Models and Economic Forecasts; 3rd edition, McGraw-Hill, Inc (1991).