Explaining house price changes in Greece

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This paper develops an equilibrium model for the Greek housing market that incorporates both macroeconomic as well as country-specific variables that affect demand for and supply of houses. In the overall upward phase of the 26-year period examined (1985Q1-2010Q4), our investigation of short-term fluctuations in real house prices and stock prices confirms the inverse relationship between movements in the housing price index and the stock exchange general index, identifies the direction of causality as running from the financial sector to the real sector, and finds that, following an exogenous shock, reversion to the long-run equilibrium is a rather slow process. Furthermore, we identify a fundamental shift in the behaviour of Greek homeowners, who appear to be moving away from the treatment of housing as consumption good, towards treating house purchases as investment.

**Keywords:** House price changes, construction costs, housing price index

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1. Introduction

It is well documented in the literature that house prices are closely associated with economic variables such as inflation, employment, interest rates and stock market performance. These variables affect economic cycles (e.g. Higgins and Osler, 1999; Collyns and Senhadji, 2002; Leamer, (2007))) and economic growth (Van Dijk et al., (2009))). However, explaining house price movements entails more than mere macro-economic factors. Household attitudes towards purchases of houses vary along a consumption-investment spectrum. The exact point that households position themselves on this spectrum is critical for the functioning of the housing market: it affects demand, supply and, by implication, the price outcome. For example, if households view house purchases as an act of consumption, they are more likely to hold on to their real asset. In the event that they wish to make an alternative investment or perceive they can realize a capital gain, they might consider entering the secondary market and selling it. In such cases, the supply of houses is doomed to rise at a lower pace than demand, constantly pushing house prices higher. By contrast, if households are willing to consider house purchases as an act of investment, their entrance into a secondary market is more likely, giving supply a greater chance to keep up with rising demand and making house prices more flexible downwards, Glaeser et al. (2008). It, therefore, becomes obvious that meaningful investigation of house price behaviour has to include, but also go well beyond, standard demand and supply analysis.

The importance of the construction sector for the Greek economy, both directly through its contribution to GDP and indirectly through the development of backward linkages, together with the traditionally large proportion of housing wealth in Greek households’ portfolios give special weight to the exploration of house price dynamics in the Greek housing market. It is worth stating at the outset that the housing market in Greece is one where demand has typically risen faster than supply, house prices have been extremely inflexible downwards, and house purchases have largely related to consumption. Greek households have traditionally treated housing as consumption good and have adopted a conservative and less risky, the “buy and hold” approach, which has arguably been responsible for steadily rising house prices. Recently, however, particularly with the stock market boom of the late 1990s, there have been signs that household attitudes towards housing may be changing. Although not fully documented, it has not been uncommon for households to sell property in order to invest in the stock market or, when the circumstances are right, in order to realize a capital gain. A growing secondary market is welcome in the

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2 In a 2001 article in The Washington Post, the then President of the Athens Stock Exchange, P. Alexakis, points out that some of the Greeks who invested in the stock market for the first time when they saw prices soaring in 1999 did so mortgaging or selling property to raise the funds.
Greek housing market, as it facilitates higher volumes, greater price flexibility, and, in general, smoother functioning of the market.

The peculiarities of the Greek housing market, along with the afore-mentioned need to go beyond standard demand and supply analysis in order to fully explore house price behaviour, constitute the main motivation for undertaking the present study. Its purpose is to identify theoretically sound and practically useful determinants of house prices in the Greek economy. Macroeconomic variables that affect house prices, as well as the links between house prices, housing wealth and financial wealth have been investigated both for individual economies (including Greece) and for groups of countries. However, little attention has been paid so far in the relevant literature in extending standard demand and supply analysis to incorporate household attitudes towards purchases of houses and identify their implications for the housing market. The goal of this paper is to fill this gap. Our contribution to the literature is twofold. First, we develop an equilibrium error-correction model that incorporates macroeconomic variables which affect demand for and supply of houses in a country-specific context. Second, we explore the existence of a link between house prices and stock market volatility, which has not so far been covered at a satisfactory level in the literature.

Using data from DSI Statistical Bases from 1985Q1 to 2010Q4, we then employ an empirical framework that allows us to analyze the behaviour of Greek house prices and subsequently quantify the impact and explain the extent to which these determinants impinge upon house price movements. We find a negative relationship between production-excluding-construction in the real sector and real house prices that lends support to our argument that as house prices in Greece rose over the period examined, the construction sector continued to attract the bulk of investment funds, thus depriving the rest of the economy of vital investment funds. Moreover, in investigating the determinants of stock market performance, we find a positive relation between the stock market general index and the informal sector, which we take as evidence that the underground economy in general and funds realized via tax evasion in particular eventually find their way to the Greek stock market.

In the overall upward phase of the 26-year period examined, our investigation of short-term fluctuations in stock market performance and real house prices supports an inverse relationship between movements in the stock exchange general index and the housing price index, with changes in the stock market index causing opposite changes in house prices and changes in house prices reinforcing this negative relationship in the next period. Measuring the equilibrium adjustment mechanism, we find slow reversion to the long-run equilibrium following an exogenous shock.

Moreover, we find evidence that the more volatile the stock market index the higher the demand for housing and the stronger the positive change in the housing price index appears to be, acting as a hedge mechanism. Together with the inverse relationship between
the stock market index and the housing price index, the positive, albeit small in magnitude, correlation of equity market volatility and the change in house prices confirms the substitute nature of stock market investment versus housing market investment, pointing to a fundamental shift in the behaviour of Greek households away from the conservative “buy and hold” attitude, towards treating house purchases as investment, with houses being bought, but also being sold, when alternative investments are available or when capital gains are forthcoming. This shift is of utmost importance for assisting the Greek housing market to eventually operate in a more orthodox manner, with prices going up when demand rises and down when demand falls.

The rest of the paper is organized as follows: A brief survey of related literature is conducted in section 2. Section 3 outlines the importance of construction activities for the Greek economy. Basic characteristics of the Greek construction sector in relation to macroeconomic variables in the 26-year period examined are presented in section 4. Methodology and data and variable selection are outlined in sections 5 and 6 respectively. Section 7 presents empirical findings. Concluding remarks are made in section 8.

2. Related Literature

Of the numerous theoretical attempts to integrate the real estate market, the capital market and construction activity, the works of Fisher ((1992 )) and DiPasquale and Wheaton ((1992 )) stand out. The Fisher-DiPasquale-Wheaton (FDW) model of property market equilibrium was subsequently presented in the seminal textbook in urban economics and real estate markets by DiPasquale and Wheaton ((1996 )).

It distinguishes between the space market and the real estate asset market, linking the spatial demand/supply dynamic to real estate asset values in order to give a more accurate description of the interaction between financial markets and real asset markets. In the FDW model, the cash flows generated by ownership of property are determined in the space market by equating demand for and supply of housing use or space. Demand for space comes from users who need to maintain the same level of space activities. With fixed supply, the price of space, i.e. rent, increases if demand for space increases and falls if demand for space falls. Further, rent is transformed into a market value by discounting at the capitalization rate that reflects the level of real interest rates. Finally, the volume of construction is taken to be a function of the market price of real estate. Construction is forthcoming when market prices are above construction costs. Conversely, construction comes to a halt when market prices are below construction costs.

Existing general equilibrium models with housing include Davis and Heathcote ((2005 )), who explore the implications of a real business cycle model with a construction
sector, Ortalo-Magne and Rady ((2006 )), who analyze an overlapping generations model to study prices and volume in the housing market and Glaeser et al. ((2008 )) who investigate the boom-bust housing cycles with housing bubbles model³. However, none of these papers is concerned with financial assets. Cocco ((2005 )), Flavin and Yamashita ((2002 )), and Flavin and Nakagawa ((2008  )) consider portfolio choice with exogenous returns in the presence of housing. However, these models are not set in general equilibrium.

Consumption-based asset pricing models traditionally assume that there is a single consumption good. Eichenbaum et al. ((1988 )) and Jagannathan and Wang ((1996 )) show that non separable utility over consumption and leisure does not help explain mean asset returns. Santos and Veronesi ((2006 )) show that the ratio of consumption to labor income forecasts stock returns. However, their pricing kernel is the same as that in the standard model, because utility is separable in consumption and leisure. Their result therefore does not arise from composition risk as we define it. Dunn and Singleton ((1986 )), Eichenbaum and Hansen ((1990 )), and Heaton (((1993 )) ((1995 ))) consider the consumption Euler equation when utility depends on services from consumer durables. They show that adding consumer durables does not help explain the level of the equity premium

Although it has been hard to distinguish between property purchases as an act of consumption versus property purchases as an act of investment, it is true that real estate typically constitutes the single most important component of the household portfolio , Chau et al. ((2007 )). It is also true that the typical household holds a highly undiversified portfolio, since the majority of households do not participate in the stock market. In Greece, for example, at best one in three households hold stock directly. By contrast, eight in ten households own a home⁴. Even in the US, one in five households hold stock directly, while two in three own a home (Kullman and Siegel, ((2005 )),

Nevertheless, real estate holdings, even as a consumption decision, do affect investment decisions. A number of studies (Kullman and Siegel, 2005; Kapopoulos and Siokis, 2005; Ebrahim and Hussain, 2010) confirm that, ceteris paribus, real estate exposure is negatively related to stock and other risky financial asset holdings. Kullmann and Siegel ((2005 )), and Miller et al. ((2009 )) show that after controlling for wealth, income and other household characteristics, the relative share of risky assets is a negative function of the real estate ownership in the US. By contrast, Kapopoulos and Siokis ((2005 )) find that in the case of Greece real estate prices, at least in Athens area, are a function of the General Index of the

³ Glaeser et al (2008) predicts that places with more elastic housing supply have fewer and shorter bubbles with smaller price increases. A number of more elastic places experienced large price booms, but as their model suggests, these booms seem to have been quite short.

⁴ In 2008, Greek household wealth consisted of real estate (81.8%), savings (17%) and stock (1.2%), while the homeownership rate, at 80.1%, was the second highest in the EU (Hardouvelis, 2009).
Athens Stock Exchange. Thus, the inverse relationship between equity and housing investment is well documented, even though the direction of causality is less clear.

In the international arena there are many studies addressing housing prices and bubbles (Kim and Suh ((1993)), Case and Shiller ((2003))⁵, Hui and Yue ((2006)), Vlamis ((2007)), Fraser et al. ((2008)), Case and Quigley ((2008)), Case ((2008)), Fender and Scheicher ((2009)) and Sarmiento ((2009))) but much less researchers address the role of housing price volatility in determining investment decisions. Hossain and Latif ((2007)) in an effort to identify the determinants of housing price volatility demonstrate that it is affected significantly by gross domestic product (GDP) growth rate, housing price appreciation rate and inflation. Additionally, volatility affects GDP growth rate, housing price appreciation and volatility itself.

Glindro et al. ((2008)) find on a study involving nine Asia Pacific economies that the current run-up in house prices reflects mainly an adjustment to more buoyant fundamentals than speculative housing bubbles. National average house prices on those countries mask the volatility in house price movements in leading cities/markets. On the forecasting study Miles ((2008)) use a number of techniques (GAR, ARMA, GARCH) and indicate that, the GAR model is very important, especially in those U.S. states which exhibit the greatest house price volatility. The results further suggest that models such as GAR may not add much forecastability in relatively stable markets.

As far as the involvement of real estate in the macro-economy is concerned, two main strands of thought can be identified. The first is concerned with spotting and measuring a housing wealth effect on consumption, comparable to the financial wealth effect. This strand examines whether consumer spending responds to changes in housing values, similarly to responding to changes in financial asset values, and tries to assess the relative importance of housing and financial wealth upon consumption. There is wide disagreement among the scholars. Some (Leung ((2004)), Case et al., ((2005)); Aron and Muellbauer, ((2006)); Carroll et al., ((2006)), Sierminska and Takhtamanova, ((2007))) find that the housing wealth effect is substantially stronger than the financial wealth effect. Others (Kapopoulous and Siokis, ((2005)); Case et al. ((2005))) find either mixed results or evidence in favour of the financial wealth effect. Case and Quigley ((2008)) analyzing the three mechanisms⁶ which govern the propagation of changes in the housing market anticipate small wealth effects transmitted to the economy, but large income effects affecting the rest of the economy.

⁵ Case and Shiller (2003) indicates that elements of a speculative bubble in single-family home prices—the strong investment motive, the high expectations of future price increases, and the strong influence of word-of-mouth discussion—exist in some cities. The consequences of such a fall in home prices would be severe for some homeowners. Given the high average level of personal debt relative to personal income, an increase in bankruptcies is likely. Such an increase could potentially worsen consumer confidence, creating a renewed interest in replenishing savings.

⁶ Wealth effects, income effects, and effects through financial markets.
and substantial financial market effects. In certain cases, it has not been possible to find evidence supporting a statistically significant relationship between housing prices and stock prices at all, Georgakopoulos et al., (2002).

A second strand in empirical research investigates housing price dynamics, looking mainly for macro-economic variables that determine changes in house prices (Sutton, (2002); Apergis and Rezitis, (2003); Tsatsaronis and Zhu, (2004); Borio and McGuire (2004)), thereby establishing the channels through which housing market shocks filter though the rest of the economy. Sutton (2002) attributes house price fluctuations in 6 western developed economies to changes in national incomes, interest rates, and stock prices, although in some instances house prices actually increased by more than warranted by these determinants. Beltratti and Morana (2010) report that the US are an important source of global fluctuations not only for real activity, nominal variables and stock prices, but also for real housing prices. They highlight that global supply-side shocks are an important determinant of G-7 house prices fluctuations. Inflation tends to be a very important factor in driving house prices in the cross-country study of Girouard et al. (2006). If inflation rates were to rise sharply house prices would come under downward pressure. In that event, the shape and duration of any subsequent downward adjustments are likely to be conditioned by the current low level of inflation. Equity prices appear to be a gauge for house prices and short-term interest rates to have important implications for house price dynamics in the sample of 13 industrial countries studied by Borio and McGuire (2004). Finally, interest rates, inflation and employment were found important in that order in a case study of Greek housing prices conducted by Apergis and Rezitis (2003).

Case and Shiller (1988) see a house market driven largely by expectations. People seem to follow their expectation on the basis of past price movements rather than any knowledge on fundamentals. At a period where the house prices was at peak, Shiller (2007) reported that it was possible they will continue going up as was commonly expected, though he rightly pointed out a high possibility of steady and substantial real home price declines over years to come. On the recent U.S. housing bubble White (2009) suggested that it is not the results of a wrong monetary and financial system (as it happened under with a restricted financial system) but miscalculations began with unusual monetary policy moves by the Federal Reserve System and novel federal regulatory interventions. These poorly chosen public policies distorted interest rates and asset prices.

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7 Beltratti and Morana (2010) indicate bidirectional linkage between real housing prices and macroeconomic developments, with investment showing in general a stronger reaction than consumption and output to housing price shocks.

8 Case and Shiller (1988) report that in the absence of severe economic decline the house prices prove to be inflexible downwards. Combined with upward volatility, this inflexibility produces a ratcheting effect with complicated distributional consequences.
3. The Importance of the Construction Sector for the Greek Economy

Over the past several decades, housing and building construction have played a key role in output growth and employment in the Greek economy (Ghicas et al. (2000)) Karousos and Vlamis (2008) and Benos et al. (2010)). Since the 1960s construction has typically absorbed one-half to one-third of private fixed investment, accounted for 4-10% of employment, and contributed 5-10% to Greek GDP (Greece in Figures, 1990 and 2006). By 2008 the contribution of the construction sector to employment and GDP reached 8.7% and 10.7% respectively (Hardouvelis, (2009)).

Strictly speaking, construction is not part of the industrial sector. This is because the output of the construction sector, albeit consumable, does not add to manufacturing value added (MVA), except, perhaps, indirectly via the creation of backward linkages, such as the establishment of manufacturing units that supply construction activities with their output. Therefore, expansion of the construction sector does not necessarily involve industrialization as the engine of growth of the economy. On the contrary, consistent channeling of funds towards the construction sector may deprive other sectors from vital investment funds.

Nevertheless, construction activity may positively affect the economy when associated with increased house ownership, which, in turn, increases household assets. The higher house prices raise the net worth of households, giving potentially rise to a housing wealth effect. Particularly in the case of Greece, where housing is the single biggest component of household wealth, National Bank of Greece (2006))10, comprising more than 80% of total household wealth and the homeownership rate exceeds 80%, Hardouvelis (2009) developments in the housing market are critical for the growth outlook of the economy, Girouard et al. (2006).

Large scale internal migration and limited alternative especially financial investment opportunities, coupled by security from inflation. Relatively good knowledge of the market, have traditionally made investment in construction particularly attractive in Greece and are largely responsible for the steadily increasing land and housing prices up until the early 1990s. Since then, liberalization of the Greek financial sector, along with fulfillment of the economic criteria for euro-zone membership, has fuelled expectations for higher profitability.

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9 Ghikas et al (2000) search the valuation of IPOs in the construction industry and report that construction companies managed to raise capital and fund their investments through Athens Stock Exchange. Karousos and Vlamis (2008) indicate that the domestic and global macro-environment have a substantial effect to the market participants in the Greek construction sector. Specifically the ability of the Greek construction companies to take advantage of the constantly changing domestic and global macro-environment affects significantly their future viability and success. Benos et al. (2010) reveal positive relationship between construction activity and economic growth.  
10 National Bank of Greece (2006) has estimated that Real Estate has long been one of the pillars of economic growth in Greece. Residential investment activity, combined with the effect of housing wealth on consumption, has provided about 1.3 percentage points to annual GDP growth during 2000-2005. Household wealth held in residential estate has been valued to be in the range of 6½ times GDP (4.9 times the revised GDP figure for 2006), compared with 4½ times GDP for the euro area as a whole, and private residential investment comprises about 39 per cent of gross fixed capital formation – a far larger share than that for the euro area average (28 per cent).
replenishing interest in housing investment. Liquidity and credit, vital ingredients for enhanced demand for housing and, therefore, house price rises, have been readily available. As a result, from 1993 to 2007, real house prices soared by 105.3% or 4.9% per year on average (Simmiyiannis and Chondroyiannis, (2009)).

Evidently, the contribution of the construction sector to Greek GDP growth has been quite significant. At the same time, the realized increase in house prices has produced substantial wealth for homeowners, fuelling consumption and reinforcing economic growth.

4. Characteristics of the Greek Construction Sector

Figure 1 depicts the variability of the real housing price index over the period examined (1985Q1-2010Q4). Evidently, in spite of short-term fluctuations, the real housing price index in Greece has overall been subject to a positive trend. It could, therefore, be argued that steadily growing demand for housing has almost been a permanent characteristic of Greek society.

**Figure 1: Real Housing Price Index (HI)**

The graph also indicates two clearly distinguishable periods: 1989-1999 and 2000 to the present. During the first period, the real housing price index moved upwards along the lines of the positive trend that had been established since the early 1980s. From the year 2000 onwards, possibly boosted by the decline in real interest rates, the real housing price index soared, experiencing unprecedented heights.
The late 1990s were marked by positive developments for the Greek economy. As the expectation that Greece would satisfy the criteria for entering the euro-zone became certainty, inflationary expectations subsided and interest rates fell substantially. Figure 2 illustrates that since 1998 the expansion of the economy following the decline in real interest rates was accompanied by lower unemployment.

**Figure 2: Real Long Run Interest Rate (LR) and Unemployment Rate (UN)**

A further characteristic of the Greek construction sector is revealed in figure 3, where total real production excluding construction appears to exhibit an almost unequivocally inverse relationship with the real housing price index. Especially in the post-2000 period, soaring house prices and the resulting higher return expectations appear to have monopolized the interest of investors. This lends support to the argument made earlier, namely that concentration of investment in real estate may have deprived the rest of the economy from vital investment funds.
5. Theoretical Underpinnings

The excellent insight into the distinction between the space market and the real estate asset market given by the FDW model provides the starting point for our analysis of the Greek housing market. We express the model of demand and supply in the real estate market of Greece as follows:

\[ D_t = \alpha_0 + \beta_1 HI_t + \beta_2 ASE_t + \beta_3 PROD_t + \beta_4 W_t + \beta_5 LR_t - \gamma_1 LFPR_t + \varepsilon_t \]  

\[ S_t = \delta_0 + \lambda_1 Z'_{D1,t} + \kappa_1 Z'_{D2,t} + u_t \]  

Where, \( Z'_{D1,t} \) is a vector including the macroeconomic variables affecting demand and \( Z'_{D2,t} \) is a vector of country specific factors affecting demand. Similarly, \( Z'_{1,t} \) is a vector including the macroeconomic variables affecting supply and \( Z'_{2,t} \) is a vector of country specific factors affecting supply.

The demand equation can be expressed as:

\[ D_t = \alpha_0 - \beta_1 HI_t - \beta_2 ASE_t + \beta_3 PROD_t + \beta_4 W_t - \beta_5 LR_t - \gamma_1 LFPR_t + \varepsilon_t \]  

\[ S_t = \delta_0 + \lambda_1 Z'_{D1,t} + \kappa_1 Z'_{D2,t} + u_t \]
In the first place, higher house prices (Ht) reduce demand for houses. Moreover, as it is well documented in the literature, an increase in the stock market index (ASEt) will reduce demand for home ownership (see, for example, Kullmann and Siegel, (2005)), Kapopoulous and Siokis, (2005)). Increases in industrial production-excluding-construction (PRODt) are expected to influence positively demand for home ownership, as are increases in wages (Wt), the latter taken as a proxy for disposable income. Furthermore, lower long-term interest rates make other assets like bonds less attractive as investments and lead to an increase in demand for home ownership, while an increase in the short-term rate adversely affects mortgages and has a negative impact on the demand for home ownership.

The vector that includes country specific factors should typically include mortgage market characteristics, leverage/indebtedness of households, tax considerations and demographics, as well as some measure of the size of the underground economy, which is estimated to be approximately 40% of the GDP in Greece. Since we concentrate on macroeconomic factors in this study, we assume that all of the influences stated above are included in the error term, except for the underground economy, which we proxy via the Labour Force Participation Rate (LFPRt). We expect LFPR to have a negative impact on demand for home ownership, as decreases in the official labour force participation rate indicate a shift of labour supply towards hidden activities (Tanzi, (1999)); Giles, (1999)).

Similarly, the supply equation can be expressed as:

\[ S_t = \delta_0 + \lambda_1 H_t + \lambda_2 ASE_t - \lambda_3 PROD_t - \lambda_4 INFL_t - \lambda_5 CCI_t - \kappa_1 LFPR_t + \epsilon_t \] (4)

Housing prices (Ht) affect supply positively, as they act as a signal for more profit to be made by investors. Ditto for the stock market index (ASEt), this gives a boost to stock market listed construction firms that could use the equity market as a source of their financing. Furthermore, we expect supply of new houses to be negatively associated with industrial production-excluding-construction (PRODt) and construction costs (CCI). A negative relationship is also expected of inflation (INFLt), which affect financing and, therefore, costs.

The country specific factor \( \kappa'Z_{t+1} \) includes leverage/indebtedness of developers, tax conditions (e.g. V.A.T.), as well as the underground economy proxy (Labour Force Participation Rate, LFPRt), which accounts for tax evasion practices. It is worth noting that the latter constitute a rather widespread phenomenon in the Greek housing sector. Allegedly, in all housing market transactions only half of the selling price is registered, pointing to significant tax evasion and revenue losses for the government. As in the case of demand, we assume that all of the influences contained in the country specific factor are included in the
error term, except for the underground economy proxy (LFPRt), which is expected to have a negative impact on supply.

Next, we establish the equilibrium relationship by equating demand and supply. Solving for housing prices:

\[ H_t = \frac{(\alpha_0 - \delta_0)}{\beta_1 + \lambda_1} - \frac{(\lambda_2 + \beta_2)}{\beta_1 + \lambda_1} ASEM_t + \frac{(\lambda_3 + \beta_3)}{\beta_1 + \lambda_1} PROD_t + \frac{\beta_4}{\beta_1 + \lambda_1} W_t + \frac{\lambda_4}{\beta_1 + \lambda_1} INFL_t + \frac{\lambda_5}{\beta_1 + \lambda_1} CCI_t - \frac{\beta_5}{\beta_1 + \lambda_1} LR_t \]

In the context of this theoretical model, we expect the following a priori conditions to hold:

\[ \frac{\partial HI}{\partial CCI} |_{0} - \frac{\partial HI}{\partial LR} |_{0} - \frac{\partial HI}{\partial PROD} |_{0} + \frac{\partial HI}{\partial LFPR} |_{0} - \frac{\partial HI}{\partial ASE} |_{0} + \frac{\partial HI}{\partial INFL} |_{0} \] 

In the ensuing two sections, we investigate the data, performing a unit root test and then the Johansen cointegration test. We use a VECM (Vector Error Correction model) in order to capture the long-run equilibrium together with the short-run dynamics.

6. Data Set - Variable Selection

Quarterly time-series data was collected for 1985Q1 to 2010Q4. Overall, the period under examination coincides with a period of substantial growth realized by the Greek economy, apart from the last eight quarters where the Greek economy due to the debt crisis is experiencing an abrupt reversal in its long term cycle. With construction traditionally constituting a major driver of economic growth in Greece, an in-depth investigation of the interrelationships between the real and the financial sectors during the uprising part of a long-run business cycle, but also including the reversal, gives useful insight into both the past and the future.

We collected data on the housing price index, the unemployment rate, the long-run interest rate, the short-run interest rate, the Athens Stock Exchange General Index, and the total production index excluding construction. CPI data were used to transform nominal variables into real. Furthermore, we collected data on the construction cost index, the labor force participation rate and the wage rate. All data were gathered from the same database, OECD statistics, except for the Athens Stock Exchange General Index, which was derived from the Athens Stock Exchange.

The following variables were chosen for our model:

**HI**: The Real Housing Price Index. It serves as a proxy for the decision variable.
ASE: The General Athens Stock Exchange Index. It serves as a proxy for activity in the financial sector of the economy.

LR: The real Long-Run Interest Rate. It indicates periods of expansion or contraction in the economy.

W: The real wage rate, as a proxy for income effects.

LFPR: The Labor Force Participation Rate, as a proxy for the underground economy.

CC: The Construction Cost Index, as a proxy for the supply side in the industry.

CPI: The Consumer Price Index. It serves as a proxy for the average general price level.

PROD: The Production Index in real terms of all other sectors excluding construction. It is used as a proxy for the output growth in the economy apart from construction.

INFL: The growth rate in the CPI, as a proxy for the cost of financing

Finally in our chosen model we include VARE

VARE: It is a measure of the volatility of the Athens Stock Exchange Index, ASE, obtained by estimating AR(2), the autoregressive model of order 2 of the ASE, saving the residuals and constructing their variance.

We used the E-Views statistical package for the data set formation and model estimation. Table 1 presents the descriptive statistics for each variable used.

Table 1. Descriptive Statistics

<table>
<thead>
<tr>
<th>HI</th>
<th>ASE</th>
<th>CC</th>
<th>INFL</th>
<th>PROD</th>
<th>LR</th>
<th>LFPR</th>
<th>W</th>
</tr>
</thead>
<tbody>
<tr>
<td>Mean</td>
<td>0.67</td>
<td>0.58</td>
<td>0.72</td>
<td>0.81</td>
<td>0.009</td>
<td>0.12</td>
<td>0.38</td>
</tr>
<tr>
<td>Median</td>
<td>0.72</td>
<td>0.48</td>
<td>0.77</td>
<td>0.91</td>
<td>0.008</td>
<td>0.10</td>
<td>0.39</td>
</tr>
<tr>
<td>Maximum</td>
<td>1.21</td>
<td>1.74</td>
<td>1.23</td>
<td>1.40</td>
<td>0.010</td>
<td>0.24</td>
<td>0.54</td>
</tr>
<tr>
<td>Minimum</td>
<td>0.14</td>
<td>0.01</td>
<td>0.17</td>
<td>0.14</td>
<td>0.007</td>
<td>0.03</td>
<td>0.31</td>
</tr>
<tr>
<td>Std. Dev.</td>
<td>0.33</td>
<td>0.45</td>
<td>0.31</td>
<td>0.38</td>
<td>0.0008</td>
<td>0.07</td>
<td>0.05</td>
</tr>
</tbody>
</table>

Notes: HI: The Real Housing Price Index. It serves as a proxy for the decision variable. ASE: The General Athens Stock Exchange Index. It serves as a proxy for activity in the financial sector of the economy. CC: The Construction Cost Index, as a proxy for the supply side in the industry UN: The official Unemployment Rate. It reflects the specific phase of the business cycle of the economy. LR: The real Long-Run Interest Rate. It indicates periods of expansion or contraction in the economy. LFPR: The Labor Force Participation Rate, as a proxy for the underground economy, W: The real wage rate, as a proxy for income effects
Further, all data series were tested for stationarity using the following unit root tests (table 2). All variables are found to be I(1), except for the PROD which is found to be stationary by the P-P test at the 10% level and LFPR by the KPSS test at the 5% level of significance.

### Table 2. Unit Root Tests

<table>
<thead>
<tr>
<th></th>
<th>ADF</th>
<th>P-P</th>
<th>KPSS</th>
</tr>
</thead>
<tbody>
<tr>
<td>HI</td>
<td>-0.39</td>
<td>0.003</td>
<td>1.141</td>
</tr>
<tr>
<td>ASE</td>
<td>-2.05</td>
<td>-1.861</td>
<td>0.852</td>
</tr>
<tr>
<td>CCI</td>
<td>-0.96</td>
<td>-0.89</td>
<td>1.132</td>
</tr>
<tr>
<td>INFL</td>
<td>-0.92</td>
<td>-1.10</td>
<td>1.124</td>
</tr>
<tr>
<td>PROD</td>
<td>-1.43</td>
<td>-2.59</td>
<td>0.83</td>
</tr>
<tr>
<td>LR</td>
<td>-1.10</td>
<td>-0.96</td>
<td>0.93</td>
</tr>
<tr>
<td>LFPR</td>
<td>-1.17</td>
<td>-1.31</td>
<td>0.185</td>
</tr>
<tr>
<td>W</td>
<td>-1.07</td>
<td>-0.73</td>
<td>1.108</td>
</tr>
</tbody>
</table>

Panel B: Johansen cointegration test

<table>
<thead>
<tr>
<th>Hypothesized No. of CE(s)</th>
<th>Eigenvalue</th>
<th>Max-Eigen Statistic</th>
<th>0.05 Critical Value</th>
</tr>
</thead>
<tbody>
<tr>
<td>None *</td>
<td>0.5122</td>
<td>71.070</td>
<td>53.187</td>
</tr>
<tr>
<td>At most 1 *</td>
<td>0.4331</td>
<td>56.203</td>
<td>47.078</td>
</tr>
<tr>
<td>At most 2</td>
<td>0.3206</td>
<td>38.271</td>
<td>40.956</td>
</tr>
</tbody>
</table>

Note: The critical value for rejection of hypothesis of a unit root at 5% is -2.89 for the ADF, and the P-P while it is 0.46 for rejection of the hypothesis of stationarity for the KPSS.

The Johansen cointegration test is then run among all the variables cited above. On the basis of the results, the test for the null hypothesis $H_0: r \leq 1$ against $H_A: r > 2$ is rejected not only at the 5% level but also at the 1% level. This implies that there are two cointegrated vectors in the system, while the potential number is seven (one less than the variables we included in the determination of our model). We choose the two cointegrating vectors that are consistent with the a priori conditions posed above.

The first cointegrating vector indicates that one long term equilibrium between the Housing Price Index and the variables under consideration is the one stated below. Similarly, long term equilibrium exists between the Athens Stock Exchange General Index and the variables under consideration. The cointegrating vectors may be written in a normalised form where constants are included.

\[
HI = 6.908 + 5.1457CCI + 0.03150LR - 0.557PROD - 7.6145LFPR - 1.6539W
\]

(Standard errors in parentheses)
Econometric modelling

The second stage of cointegration analysis involves building a Vector Error Correction Model (VECM). If two or more series are cointegrated, there exist common factors that affect them and their permanent or secular trends and, therefore, the series will eventually adjust to equilibrium. This implies that even if in the short-run the covariance between the dependent and the explanatory variables indicates that they drift apart, in the long-run the series will adjust to equilibrium. This is because some weighted difference of the two series has a finite constant mean and variance.

Our VECM model is as follows:

\[
\Delta X_t = \alpha_0 + \sum_{i=1}^{n} \beta_{1i} \Delta X_{t-i} + \sum_{i=1}^{n} \beta_{12i} \Delta Y_{t-i} + \sum_{i=1}^{n} \beta_{13i} \Delta Z_{t-i} + \gamma_0 E_{t-i} + u_{1t},
\]

\[
\Delta Y_t = \alpha_1 + \sum_{i=1}^{n} \beta_{21i} \Delta X_{t-i} + \sum_{i=1}^{n} \beta_{22i} \Delta Y_{t-i} + \sum_{i=1}^{n} \beta_{23i} \Delta Z_{t-i} + \gamma_1 E_{t-i} + u_{2t}.
\]

Where \( X_t \) is the Housing Index (HI) and \( Y_t \) the Athens Stock Exchange Index (ASE), \( Z_t \) is a vector of the variables CC, INFL, PROD, LR, LFPR and \( W \), \( E \) is the error correction term and the lag lengths are determined by VEC lag exclusion Wald tests.

From the econometric point of view, HI and ASE are, of course, endogenous variables. The question is whether, from the broader point of view, the other variables are also endogenous or predetermined. Of course INFL is likely to be jointly determined with HI, but LR and LFPR are likely to be predetermined. Production is rather sluggish and \( W \) cannot be affected by either HI or ASE. Moreover, CC in the second equation is likely to depend on both HI and INFL so it must be considered as endogenous.

The proper methods of estimation are the well known 2SLS and 3SLS. The drawback of 3SLS is that it depends heavily on the parametric modelling of all the endogenous variables (that is HI and ASE jointly with INFL and CC). Therefore, 2SLS is preferable but it is not flexible in terms of delivering robust standard errors, so we can resort to GMM.

\[
\text{ASE} = -47.88 - 33.83CC - 0.1409LR + 37.398 \text{PROD} + 53.399 \text{LFPR} + 10.542W
\]

(\(7.793\) \(17.377\) \(0.1024\) \(68.728\) \(7.4941\) \(3.9112\))

(Standard errors in parentheses)
Table 3. Estimation of the Decision Making Model by 2SLS

ASE: The General Athens Stock Exchange Index. It serves as a proxy for activity in the financial sector of the economy, HI: The Real Housing Price Index. It serves as a proxy for the decision variable, CC: The Construction Cost Index, as a proxy for the supply side in the industry, PROD: The Production Index in real terms of all other sectors excluding construction. It is used as a proxy for the output growth in the economy apart from construction, INFL: The growth rate in the CPI, as a proxy for the cost of financing, LFPR: The Labor Force Participation Rate, as a proxy for the underground economy, LR: The real Long-Run Interest Rate. It indicates periods of expansion or contraction in the economy, VARE: It is a measure of the volatility of the Athens Stock Exchange Index, ASE, obtained by estimating AR(2), the autoregressive model of order 2 of the ASE, saving the residuals and constructing their variance.

<table>
<thead>
<tr>
<th>Variable</th>
<th>Coefficients with Δ(HI) as the Dependent Variable</th>
<th>Coefficients with Δ(ASE) as the Dependent Variable</th>
</tr>
</thead>
<tbody>
<tr>
<td>C</td>
<td>0.0150</td>
<td>0.0152</td>
</tr>
<tr>
<td></td>
<td>(1.3462)</td>
<td>(0.6715)</td>
</tr>
<tr>
<td>Δ(ASE(-1))</td>
<td>-0.0045</td>
<td>0.8439</td>
</tr>
<tr>
<td></td>
<td>(-0.6143)</td>
<td>(5.5268)***</td>
</tr>
<tr>
<td>Δ(HI(-1))</td>
<td>0.4034</td>
<td>-</td>
</tr>
<tr>
<td></td>
<td>(2.5342)**</td>
<td>1.0677</td>
</tr>
<tr>
<td></td>
<td></td>
<td>(3.1494)</td>
</tr>
<tr>
<td>Δ(CC)</td>
<td>0.0643</td>
<td>2.3379</td>
</tr>
<tr>
<td></td>
<td>(1.2032)</td>
<td>(2.0069)**</td>
</tr>
<tr>
<td>Δ(PROD)</td>
<td>-1.1786</td>
<td>-</td>
</tr>
<tr>
<td></td>
<td>(-0.9787)</td>
<td></td>
</tr>
<tr>
<td>Δ(INFL)</td>
<td>0.0786</td>
<td>-</td>
</tr>
<tr>
<td></td>
<td>(2.5854)**</td>
<td></td>
</tr>
<tr>
<td>Δ(LFPR)</td>
<td>0.0178</td>
<td>-</td>
</tr>
<tr>
<td></td>
<td>(0.7313)</td>
<td></td>
</tr>
<tr>
<td>Δ(LR)</td>
<td>-0.0799</td>
<td>-0.9380</td>
</tr>
<tr>
<td></td>
<td>(-1.1033)</td>
<td>(-0.6412)</td>
</tr>
<tr>
<td>VARE</td>
<td>0.0194</td>
<td>1.8191</td>
</tr>
<tr>
<td></td>
<td>(0.6403)</td>
<td>(2.5931)**</td>
</tr>
<tr>
<td>ECT</td>
<td>-0.0017</td>
<td>0.0577</td>
</tr>
<tr>
<td></td>
<td>(-0.7519)</td>
<td>(2.4621)**</td>
</tr>
<tr>
<td>Adj.R²</td>
<td>0.30</td>
<td>0.14</td>
</tr>
</tbody>
</table>

*(t-statistic in brackets)
Table IV: Final Version of the Estimated Model by GMM

ASE: The General Athens Stock Exchange Index. It serves as a proxy for activity in the financial sector of the economy. HI: The Real Housing Price Index. It serves as a proxy for the decision variable. CC: The Construction Cost Index, as a proxy for the supply side in the industry. PROD: The Production Index in real terms of all other sectors excluding construction. It is used as a proxy for the output growth in the economy apart from construction. INFL: The growth rate in the CPI, as a proxy for the cost of financing. LFPR: The Labor Force Participation Rate, as a proxy for the underground economy. LR: The real Long-Run Interest Rate. It indicates periods of expansion or contraction in the economy. VARE: It is a measure of the volatility of the Athens Stock Exchange Index, ASE, obtained by estimating AR(2), the autoregressive model of order 2 of the ASE, saving the residuals and constructing their variance.

<table>
<thead>
<tr>
<th>Variable</th>
<th>Coefficients with Δ(HI) as the Dependent Variable</th>
<th>Coefficients with Δ(ASE) as the Dependent Variable</th>
</tr>
</thead>
<tbody>
<tr>
<td>C</td>
<td>0.0138 (4.838)***</td>
<td>0.0169 (2.876)***</td>
</tr>
<tr>
<td>Δ(ASE(-1))</td>
<td>-0.0044 (2.812)***</td>
<td>0.8296 (17.578)***</td>
</tr>
<tr>
<td>Δ(HI(-1))</td>
<td>0.4114 (10.463)***</td>
<td>-</td>
</tr>
<tr>
<td>Δ(CC)</td>
<td>0.059 (4.026)***</td>
<td>2.467 (6.1668)***</td>
</tr>
<tr>
<td>Δ(CC(-1))</td>
<td>-</td>
<td>-5.668 (9.588)***</td>
</tr>
<tr>
<td>Δ(INFL)</td>
<td>0.0755 (9.694)</td>
<td>-</td>
</tr>
<tr>
<td>Δ(LR)</td>
<td>-0.0007 (-5.907)***</td>
<td>-0.0102 (-3.213)***</td>
</tr>
<tr>
<td>Δ(PROD)</td>
<td>-1.0563 (-3.463)***</td>
<td>-</td>
</tr>
<tr>
<td>Δ(LFPR)</td>
<td>0.0161 (3.219)***</td>
<td>-</td>
</tr>
<tr>
<td>VARE</td>
<td>0.0222 (3.3945)***</td>
<td>1.7436 (8.0133)***</td>
</tr>
<tr>
<td>ECT</td>
<td>-0.0015 (-3.2867)***</td>
<td>0.0549 (6.8819)***</td>
</tr>
<tr>
<td>J-Statistic</td>
<td>0.1893</td>
<td></td>
</tr>
</tbody>
</table>

*(t-statistic in brackets)

All the estimated values of the coefficients of the error correction terms in the equations above have the correct sign for an error correction mechanism. The coefficient of the HI equation must be negative and the coefficient of the ASE equation must be positive in order for the deviations from the long-run equilibrium to be corrected. To verify this, we may assume that the error correction term is large and positive. In this case, HI will decrease...
because its coefficient is negative and ASE will increase because its coefficient is positive. Both result in reduction of the error correction term and, therefore, error correction.

The magnitudes of the coefficients determine the speed of adjustment following an exogenous shock to the long-run equilibrium. In our case, these coefficients are rather small (0.15% and 5.5% adjustment in each quarter respectively) indicating that the adjustment is not quick and the reversion to long-run equilibrium, as determined by the error correction term, will be rather slow.

The test for cointegration developed by Engle and Yoo (1987) is based on the significance of the coefficients of the error term. We observe that the disequilibrium term in both equations are highly significant. Thus, the Engle and Yoo procedure indicates that the two variables are indeed cointegrated.

We proceed with examining the t-ratios in the estimated model. The t-ratio on the lagged disequilibrium term in the ASE equation is significant, revealing that the error correction mechanism is operating primarily through the adjustment of the stock exchange, rather than the adjustment of housing prices. The lagged value of ASE in the HI equation is significant that the stock exchange leads the housing market prices.

We observe that the coefficient on the error correction term is positive and significant in the ASE equation. This implies that when the error correction term is above its equilibrium value, ASE increases and the error correction term falls, moving closer to equilibrium. Similarly, when the error correction term is below equilibrium, ASE adjusts downwards and the error correction term increases towards its equilibrium value. We, therefore, conclude that movements in equity prices tend to precede movements in housing prices. This is in consent with the generic observation that the financial sector in general and the stock market in particular turn down prior to recessions and rise before recovery of the real sector (Siegel, 2002).

In the HI equation, after removing the insignificant variables, we observe that the sign and significance of the remaining variables are according to our priori theoretical expectations. First, the construction cost index (CCI) is positively related to and has a substantial impact upon the housing price index (HI). A possible explanation for the effect of construction costs and wages on house prices is the strong dedication of Greek families on inheriting properties to their children. This is a fundamental issue which is related with the development of any typical Greek family as it is a lifetime dream after buying the house where their children will grow up to make a best effort and acquire the house (s) where their grandchildren will spend their childhood.

Moreover, the proxy for the volatility of ASE (VARE) is positively related to the housing price index, which is expected to be so since periods of high volatility tend to go hand in hand with declines in stock market indices (see, for example, Booth and Koutmos,
In such circumstances, housing is treated as a safe heaven by investors and this is captured in the above relationship. Also, production-excluding-construction (PROD) is found to be negatively related and to exert a significant influence on house prices as originally assumed. This is one of the salient features of the Greek economy over the years, with the rate of absorption of investment funds in construction tending to be inversely related to the rate of absorption of investment funds by the rest of the economy. Further, we note that the labour force participation rate (LFPR), which we used as a proxy for the underground economy, is found to be significant and positively related with the change in ASE. This may be taken as evidence that the underground economy (and especially tax evaded funds) find their way to the housing market.

As far as the second equation is concerned, we observe confirmation of the inverse relationship between stock exchange volatility (VARE) and changes in ASE. Also, the housing price lagged by one period is inversely related to ASE, implying that it Granger causes changes in ASE and verifying the substitute nature of these two different types of investment.

Perhaps more importantly, substitutability between stock market investment and housing market investment, albeit small in magnitude, points to a fundamental shift in the behaviour of Greek households away from the old-fashioned “buy and hold” attitude, which relates to treating housing as pure consumption and has been largely responsible for steadily rising house prices independently of the phase of the business cycle the economy is at, towards treating house purchases as investment. In Greece, demand for housing has consistently risen faster than supply, leading to constantly rising prices. There has been a big primary market and very little of a secondary market. Even when the stock market was at its peak and households sold property in order to take advantage of the rise, the rate of growth of house prices fell only sluggishly from 14.4% in 1998 to 8.9% in 1999 (Bank of Greece, ((2008 ))). The apparent shift in household behaviour observed since the mid-1990s is a step in the right direction, as it evidently assists house prices to follow the cyclical fluctuations of demand and, by implication, the entire Greek housing market to operate in a more orthodox manner.

8. Concluding Remarks

The purpose of this paper has been to identify theoretically sound and practically useful determinants of house prices in the Greek economy. We use an empirical framework that allows analysis of the behaviour of house prices in Greece during 1985Q1-2010Q4. In the context of an FDW model, we develop an error-correction model that depicts housing market
equilibrium in a country-specific framework. The unique element of our paper is that we identified a link between stock market volatility and demand for housing.

We find that construction costs and wages positively affect house prices, while long-term interest rates, the presence of the informal sector, and production excluding construction affect house prices in a negative manner. The apparent negative relationship between production in the real sector less construction and real house prices lends support to our argument that as house prices in Greece rose over the period examined, the construction sector continued to attract the bulk of investment funds, thus depriving the rest of the economy of vital investment funds.

Furthermore, we find that construction costs and long-term interest rates negatively affect stock market performance. By contrast, equity prices are positively affected by wages, production excluding construction and the presence of the informal sector. The latter constitutes evidence that the underground economy in general and funds realized via tax evasion in particular eventually find their way to the Greek stock market.

In the overall upward phase of the 26-year period examined, our investigation of short-term fluctuations in stock market performance and real house prices leads to two major conclusions. First, the inverse relationship between movements in the stock exchange general index and the housing price index is confirmed. The direction of causality is identified as running from the financial sector to the real sector. When equity prices fall, households resort to the housing market, pushing house prices higher. Moreover, positive developments in the housing market in a given quarter exert a negative influence upon stock prices in the ensuing quarter, reinforcing the observed negative relationship between the stock market index and the housing price index. Additionally, when measuring the equilibrium adjustment mechanism, we find that, following an exogenous shock, reversion to the long-run equilibrium is a rather slow process.

Second, we find evidence that the more volatile the stock market index the higher the demand for housing and the stronger the positive change in the housing price index appears to be. Together with the inverse relationship between the stock market index and the housing price index, the positive correlation of equity market volatility and the change in house prices confirms the substitute nature of stock market investment versus housing market investment. More importantly, the confirmed substitutability between stock market investment and housing market investment, albeit small in magnitude, points to a fundamental shift in the behaviour of Greek households away from the old-fashioned “buy and hold” attitude towards treating house purchases as investment. The apparent shift in household behaviour observed since the mid-1990s is critical in assisting house prices to follow the cyclical fluctuations of
demand and, by implication, in promoting smoother operation of the entire Greek housing market.

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