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# Quantification of the Energy Efficiency Gap in the Swedish Residential Sector

## Abstract

Wepresenta method forquantifying theenergy efficiency gap*ex-ante*. To do this we define the energy efficiency gap as being the difference between the *ex-ante* market and techno-economic energy savings potentials. The estimation of market potential is based on top-down (econometric)modelling of energy demand using data from the period 1970–2005. The techno-economicestimates are made using a bottom-up building stock model (ECCABS), to assess the effects and cost-efficiency of various energy efficiency measures. Common to these two modelling approaches are two scenarios of energy prices, which differ only with respect to the carbon tax component. We implement the method for the case of useful energy demand for space and water heating in the Swedish residential sector up to 2030.

In comparison to the level of energy use in 2005 (74 TWh), the top-down modelpredicts for 2030 reductions in demand for the two price scenarios of 17 TWh and21 TWh,respectively. The bottom-up modelpredicts corresponding reductions in demand of 25 TWh and 31 TWh, respectively. Thus, there isan energy efficiency gap between the two models of at least 8 TWh in 2030. Animplicit discount rate of 10% would render theresults from the bottom-upmodelling identical to those from the top-down modelling. Howeverthe presence of the energy efficiency gap indicates that there is a need for enhanced policies in order to make future reductions in energy demand reach the levels predicted by the bottom-up modelling.

### 1. Introduction

The achievement of long-term climate targets relies heavily on energy efficiency improvements. For example, the IEA's Energy Technology Perspectives study, which explores the technological options needed to limit the globaltemperature increase to  $2^{\circ}$ C,proposesthat energy efficiency will have tocontribute to reducing the energy intensity (measured as energy input per unit of GDP) of the global economy by two-thirds by 2050 (IEA, 2010). While energy use in buildings accounts for a large proportion of global CO<sub>2</sub> emissions, it alsoholdssignificant potential for reducing these same emissions. A review of more than eightybottom-up estimates of national and regional techno-economics avings potentials in buildings has suggested that approximately 30% of the projected baseline CO<sub>2</sub>emissions by 2020 could be avoided in a cost-effective manner (IPCC, 2007). As energy prices increase, these potentials are augmented due to the fact thatmore energy saving technologies become economically feasible. Such estimates based ontechno-economic factors are presented inpolicy documents, such as the EU Action Plan for Energy Efficiency, which states that the largest cost-effective savings potential is in the buildings sector (savings potentials of 27% forresidential buildings and 30% forcommercial buildings), as compared to the corresponding potentials in the industrial and transport sectors (EC, 2006).

At the same time, the realisation of thesestated cost-effective energy efficiency potentials has often provedchallenging suggesting that there is an 'energy efficiency gap' between the cost-effective level of energy use, as estimated using bottom-up modelling, and what occurs under in real market conditions. The existence of an energy efficiency gap hasbeen discussed extensively in the literature, and it has been pointed out that techno-economic estimatesoften do not take into account the cost of collecting the informationneeded by a consumer (transaction costs), principal-agent problems, bounded rationality, behavioural anomalies, consumer heterogeneity, opportunity costs, the cultural and social contextof energy use and the risk aversion associated with the adoption new technologies[for examples, seeWilk and White,(1985), Wilson and Swisher (1993), Jaffe and Stavins (1994), Weber (1997), Jaffe et al. (2004), Sorrell et al. (2004), IEA(2007), EC(2008), Persson et al. (2008), Allcott and Greenstone, (2012); Tsvetanov and Segerson, (2013), Gillingham and Palmer(2014)<sup>1</sup> and Gerarden et al, (2014)]. Such issues have caused some economists to question the existence of any significant techno-economic savings potential (Joskow, 1996; Allcott and Greenstone, 2012).

Even if a bottom-up study indicates that, for example, the installation of quadruple-glazed windows in all dwellings in Sweden would lower energy demand substantially and save money for homeowners, these measures would be implemented only if those homeowners had the same values, priorities, access to finance and information as assumed in the study. In addition, market-based estimates of price elasticities have been shown to be low in this sector (e.g. Haas and Schipper,1998; Nässén et al., 2008), which suggests that reducing demand would require greater increases in energy prices than those predicted by techno-economic analyses. So-called 'implicit' discount rates which reflecthow individuals makedecisions that involve discounting over timesuggest that their private discount rate reflects behaviour in a manner that implies a much higher discount rate state than thesocial discount rates in techno-economic analysis<sup>2</sup>. These implicit/account rates range from 3% to 108% (Train 1985). For energy conservation programs, such implicitrates are used to predict the penetration rates of the programs or the levels of energy conservation investments.

From the perspective of policy makers, the method of choice for measuring energy savings potential, i.e., choosing between techno-economic and market potentials, is relevant to decisions as to which

<sup>&</sup>lt;sup>1</sup> In this review Gillingham and Palmer describe recent research which uses empirical analysis to investigate, *inter alia*, the impacts of energy efficiency programs on heterogeneous consumer types, in order to help design the 'first-best' policy interventions that would address behavioral anomalies.

<sup>&</sup>lt;sup>2</sup> Although some well-known bottom-up and hybrid models, such as Poles, Primes, and TIMES, take into account the implicit discount rate, they do so in terms of establishing real-world scenarios, as opposed to techno-economic potentials.

policy to pursue. In this context, the definitions of techno-economic and market potentials are crucial. Based on the report of Ürge-Vorsatz and Novikova (2008), who described different economic potentials for Greenhouse Gas Emissions (GHG) mitigation based on IPCC definitions, it can be stated that:

The **market potential** is the level of reduction in energy demand that occurs under forecasted market conditions; for an *ex-ante* analysis it is typically estimated using "top-down" modelling.

The **techno-economic** potential is a cost-effective potential for energy demand reduction when market costs at social discount rates are considered, with social discount rates being equal to the opportunity costs of funds available in credit markets; typically, it is derived from "bottom-up" modeling.

The existence of a gap between the results of top-down and bottom-up assessments is also consequence of the nature of the modelling used. Top-down econometric models assume that efficient market conditions exist in a behaviourally, institutionally and technologically fixed world' (Wilson and Swisher, 1993). Thus, demand is assumed to change, primarily as a result of changes in energy prices. The results derived from such models have an empirical basis, given that the modelling is anchored in the economy at large (Kavgic et al, 2010) and derived from observed historic patterns of energy demand. However, as non-price-induced reductions in energy intensity have been non-linear since at least the oil crisis of the 1970's, they are not explicitly captured in top-down models (Wilson and Swisher, 1993). Furthermore, Mundaca et al (2011) have stated that the statistically derived relationships embedded in the historical data (e.g. price elasticities) are precisely those thatpolicymakers aim to change. Therefore, the usefulness of top-down models for addressing energy and climate challenges remains a topic for debate. Bottom-up models meet these challenges directly by calculating the cost and savings potentials of meeting energy and climate goals using specific technologies. However, the results obtained from bottom-up models are dependent upon assumptions made regarding the penetration, availability, performance, cost and future development of technologies. In addition, the impact on energy prices of reduced demand achieved through efficiency improvements or rebound effects are not accounted for, which means that bottom-up modelling is not anchored in the economy at large (Wilson and Swisher, 1993, Allcott and Greenstone, 2012). Recently the economists Allcott and Greenstone, (2012), have claimed that '...the available evidence from empirical analyses suggests that while investment inefficiencies do appear in various settings, the actual magnitude of the energy efficiency gap is small relative to the assessments from engineering analyses'. The authors describevarious measurement errorswhich they claim makes the true potential of energy efficiency improvement smaller than that calculated with bottom-up models. Thus the

usefulness of bottom-upmodels for addressing energy and climate challenges has also become a topic for debate. These issues are problematic in the sense that when implementing substantial technological changestowardsenvironmental objectives, policy makers need to know the extents which their policies influence the characteristics and financial costs of future technologies, as well as the willingness of consumers and businesses to adopt these changes (Jaccard, 2009).

When modelling the implementation of energy-efficient technological changes, the choiceis not necessarily between a top-down approach and a bottom-up approach. A third, so-called hybrid, approach combines theelement of bottom-uptechnological explicitness with estimations of the behaviours of consumers and firms, which are components of the top-down modelling approach (Jaccard 2004). Some examples of hybrid methodologies applied to the building sector have been reported (Jacobsen, 1998; Koopmans and teVelde, 2001; Rivers and Jaccard, 2005; Yang and Kohler, 2008, Giraudet et al., 2012), and these have focused on understanding the possibilities for changing the energy consumption of the building stock (e.g., consumer behaviour, rebounds, and policy effects) without taking into account the different end-uses or technologies or the interactions between these factors; e.g. only discrete levels of efficiency improvement are assumed. Criticizing the hybrid modelling approach, Wilson and Swisher (1993) have suggested that the results obtained through topdown and bottom-up approaches are irreconcilable, since the former assumes an energy-economy relationship that cannot change, while the latter alters this relationship as a matter of course. They state that one cannot expect such models to produce compatible results by simply adjusting the numbers. Specifically, Wilson and Swisher (1993) have described how:1) Nordhaus (1991) adjusts the technoeconomic costs obtained from bottom-up studies to conform to the results derived from top-down studies; and 2) how the Markal bottom-up model is forced to reproduce the theoretical energy-price relationships and the general result from the Macro top-down model. Concluding, Wilson and Swisher write that attempts made thus far at hybrid modelling between top-down and bottom-up analyses of the cost of mitigating global warming have been inadequate, because these attempts do not address the fact that the analysts are asking different questions.

In summary, the true size of the energy efficiency gap still remains unclear (Gillingham and Palmer, 2014). Findings from research on the energy efficiency gap could help policy makers generate social and private benefits from accelerating the diffusion of energy-efficient technologies (Gerarden et al., 2014). Although the general thrust of contemporary research on the energy efficiency gap is focusing on empirical studies that describe decision making among heterogeneous energy-users (Gillingham and Palmer, 2014) the authors of this paper believe that there is also a need for system-level or sector-level studies which can give insights into key system-level parameters affecting the adoption of efficiency technologies, such as energy prices and discount rates. Furthermore, although the historical

failure of the techno-economic energy efficiency potentials to be realised has been well documented *ex-post*<sup>3</sup>, few, if any, studies have undertaken an *ex-ante* measure of potentials with the intent of learning from the comparison of the market and techno-economic potentials. This paper presents a methodology for estimating *ex-ante* the energy efficiency gap between market and techno-economic energy savings potentials that also allows key modelling parameters to be highlighted. The work is carried out for the case of the savings potential in useful energy demand for space and water heating in the Swedish residential sector up to Year 2030. An *ex-ante* quantification of the, 'energy efficiency gap' is defined as the difference between market and techno-economic potentials. Towards this end, the potential energy savings for this case are estimated separately with a top-down and bottom-up model. The differences in model parameters and results obtained with the two modelling approaches and the advantages of using both models in tandem are discussed, since it is crucial to have a clear understanding of the limitations and assumptions of the different modelling techniques and the corresponding results, so that the results of the research can be transmitted to both practitioners and policy makers (Boothet al. 2012, Summerfield & Lowe, 2012).

## 2. Methodology

This work compares estimates of the market potentials for energy savings derived using a top-down model that employs decomposition and econometrics with estimates of the techno-economic savings potentials obtained using a bottom-up strategy comprising a building physics-based model (Energy, Carbon and Costs Assessment for Building Stocks [ECCABS];Mata et al., 2013a) that applies social discount rate. In the taxonomy of end-use energy demand models for the residential sector described by Swan and Ugursal (2009), the top-down model is of the econometric variety and the bottom-up model is of the engineering sample-building variety. Two scenarios on energy prices which differ only in the carbon tax component of each are used as inputs for both models. These price scenarios are based on the 450-ppm scenario of the 2009 IEA World Energy Outlook (IEA, 2009). The methodological framework is shown schematically in Figure 1.It is clear from the figure that the difference in estimated savings potential scalculated from the top-down and bottom-up models represents a proxy for the magnitude of the energy efficiency gap.

<sup>&</sup>lt;sup>3</sup> For example in a meta-analysis of 42 utility conservation programmes, Nadel and Keating (1991) found that actual, ex post energy savings from residential retrofit programs ranged from 15 to 117 percent of ex- ante estimates.



Figure 1 : Methodological framework applied in this work. The left panelillustratesthe theoretical concepts, and the right panel outlines the corresponding modelling approach.

The present analysis was conducted for the Swedish residential housing stockthat existed in 2005. This amounted to approximately five million units. Dwellings constructed or demolished in or after Year 2006 are not included. The reason for this is that speculating about construction and demolition rates to Year 2030 would add a layer of complexity to the modelling, which would not enhance the aim of exploration of the efficiency gap. The construction rate in Sweden has however been less than 0.5 % per annum between 1990 and 2005 meaning that the addition of new dwellings would take many years to have a large effect on energy demand.

In addition, the present work involves estimations of the *useful* energy demand savings potentials in both models, rather than the *final*(delivered) energy demand savings potentials. This is the case because the influence of fuel switching on energy demand for space and water heating observed in Sweden between 1970 and 2005 is not expected to continue at the same pace, and for a study that has more of a methodological focus, it is desirable to have one less parameter of uncertainty.

#### 2.1 Top-down econometric model

The marketpotential for energy savings for the existing stock to Year 2030 is calculated using decomposition and econometrics. Energy demand is decomposed into the effects of population, floor area and efficiency (IEA,1997; Appendix 1). This isolates the efficiency component of energy demand which is necessary for an analysis of the energy efficiency gap as follows:

$$E_t = A_t S_t I_t \tag{1}$$

where E is the usefuluse of energy for space and water heating (measured in TWh),

Ais the population in millions,

S is the residential sector floor area per capita (measured in  $m^2$ ),

I is the unit consumption of useful energy for space and water heating (measured in kWh/m<sup>2</sup>), and

*t* is time in years

To estimate the value of  $E_t$  for the existing stock to Year 2030,  $A_t$  and  $S_t$  are locked at the 2005 levels, while future estimations of  $I_t$  to Year 2030 are used.  $I_t$  is itself estimated using the ordinary least squares econometric model shown in Equation (2):

$$ln(Q_t) = C + ln(P_t) \alpha + ln(Y_t) \beta + ln(I_{t-1}) \gamma + (HDD_t) \delta + (t)\varepsilon + e_t$$
(2)

where *P* is theweighted average price for energy for a year (in SEK/toe<sup>4</sup>), *Y* is the annual income per capita (in SEK), *t* is the time (in years) and includes autonomous technical progress, *HDD* is the heating degree days,  $\alpha$  is the short-term price elasticity of demand for *I*,  $\beta$  is the short-term income elasticity of demand for *I*,  $\gamma$  is the coefficient of the previous year's *I* (lagged demand),  $\delta$  is the coefficient of heating degree days,  $\epsilon$  is the exponential time trend coefficient, *C* is a constant, and *e* represents the model residuals. The values of  $\alpha$ ,  $\beta$ ,  $\gamma$ ,  $\delta$ , and  $\epsilon$  are calculated from time series data from 1970 to 2005 using regression analysissoftware. The use of the log-log regression form means that  $\alpha$  is the price elasticity of demand for *I*. The use of the exponential trend means that  $\epsilon$ times 100 is the percentage change per year in unit consumption due to various factors, such as autonomous technological development, imposition of regulations, and additionalvariables not captured by price, income, lag, and *HDD*.

Changes in future useful energy demand for space and water heating in the existing stock will occur due tochanges in unit consumption<sup>5</sup>, *I*. The factor *I* is an established indicator of progress with energy efficiency, although the effects of conservation, changing habits, and the climate will also obviously cause it to change. Increases in energy prices (*P*), regardless of whether they are due to market developments or the imposition of carbon taxes, should in theory lead to decreases in unit consumption. In practice, this means that if energy prices increase and a home owner or tenant wants to reduce their energy bill, they can decrease the indoor temperature, shorten the duration of home heating or reduce their use of hot water. These are short-term responses to price changes and are captured by the short term price elasticity (*a*). Increases in income, as captured by term  $\beta$ , can at the same time lead to increased use of energy services, e.g., higher indoor temperatures, and may even offset the effect of price increases. Combining the coefficient of the lag operator  $I_{t-1}$ ,  $\gamma$ , with  $\alpha$  produces the long-term price elasticity[ $\alpha/(1-\gamma)$ ], and combining  $\gamma$  with  $\beta$  produces the long- term income

<sup>&</sup>lt;sup>4</sup>The energy prices and personal income levels must be in the national currencies, in the present case SEK, as householders would have reacted to the dynamics of the currency. However, for comparison purposes, the energy price data are presented in Euro in Table 1 below.

<sup>&</sup>lt;sup>5</sup>As stated previously, the present work assumes a constant floor area for the model period, i.e., no construction, demolition or house extensions are considered.

elasticity  $[\beta/(1-\gamma)]$ , which reflect longer termeffects such as changing heating systems in response to increases in price or income.

Coefficient  $\delta$ accounts for the historic influence of climate (as represented by *HDD*) on demand. This is important to capture in the case of space heating, as colder winters inevitably lead to higher demand for space heating as can be seen in in Figure 2c.

In the long run, there are also technical improvements that improve the efficiency of energy use, regardless of price and income dynamics. These technical improvements may occur as a result of stricter efficiency standards and/ordue to autonomous technical breakthroughs. As these improvements are typically implemented during the renovation cycle of a building, they only occur a fraction of the building stock in any given year. Nonetheless, these trends may beimportant in the long term, and therefore theyare incorporated into Equation (2)using the term  $\varepsilon$ . In practice, long-term technical trends are represented by the time variable t, and this variable also includes the influence of other variables that are not captured by prices, income, lagged demand, and *HDD*. The time variable t, is derived for the same case as that to which it is applied, i.e., space and water heating energy demand in the Swedish residential sector. This is in contrast to the practise Wilson and Swisher (1993) criticise of modellers calculating an autonomous energy efficiency index (AEEI) for the whole economy and then applying it to individual sectors.

To calculate  $I_t$  for Year 2006,  $I_{t-1}$ , which is  $I_t$  for Year 2005, should be used. However, as the  $I_t$  for 2005 acts as a seed for Equation (2) and influences future outputs, the space heating component of this value is first normalised for climatic influences. For thescenarios, the coefficient of HDD,  $\delta$ , is suppressed, since its role is to establish realistic price and income elasticities rather than to influence future demand patterns. For these two reasons and to ensure that the first data-point estimated (2006) from the model is aligned with measured climate-corrected useful energy demand data (2005), the model constant, *C*, is adjusted accordingly.

As dwellings constructed or demolished after Year 2005 are not included in the study, the top-down model may overestimate savings potentials because it is derived from historic trends in energy demand and these include efficiency improvements from new dwellings being added annually between 1970 and 2005. For this case of the Swedish residential sector, the values estimated for  $\alpha$ ,  $\beta$ ,  $\gamma$ ,  $\delta$  and  $\epsilon$  in Equation (2) include the effect of the improvement in efficiency of the dwelling stock that occurred as a result of a construction boom called 'the million house programme' which lasted from 1965 to 1974 and a continued high construction rate that lasted until 1990. Since then, as stated above, the annual construction rate has been on average 0.5% per annum and shows no signs of increasing dramatically in future decades, given birth rate, emigration and economic trends. An analysis of construction rates

in post – war Europe (Ó Broin et al, 2013) found that construction booms have occurred once in each European country during the period and that Sweden seems to be no exception to this. Therefore the magnitudes of  $\alpha$ ,  $\beta$ ,  $\gamma$ ,  $\delta$  and  $\varepsilon$  used in the scenario may mean that the actual energy efficiency gap to Year 2030 is slightly underestimated. Given the decision to ignore construction and demolition of dwellings in the scenario period to 2030 it could of course be argued that the same parameters should have been ignored in the calibration period (1970 to 2005) to obtain a more accurate estimations. While this may be true it could also be argued that such an exercise would ignore the non-linear improvements in the efficiency of the dwelling stock that occurred during the period of high construction rates to 1990 and thus such a model would bear little resemblance to the reality for the Swedish dwelling stock today.





The time series for Equation (2), whichwereobtained from the IEA (2008), Odyssee Database (2009), Schipper, (2010) and other Swedish sources, are shown in Figure 2.In energy carrier mix presented in Figure 2a oil; district heating; electricity; and unprocessed woodstand out as the dominant energy carriers. Figure 2b shows unit consumption for useful energy demand. This is calculated by multiplying the final energy use for each individual energy carrier shown in Figure 2a by theirrespective conversion efficiency and then dividingtotal useful energy demand by total floor area for the residential sector. Conversion efficiencies have been published by the Swedish National Board of Housing, Building and Planning[Boverket, in Swedish](NBHBP, 2009) for the existing residential stock in Sweden for Year 2005. No older data were found to be available. The national average conversion efficiencies for district heating (DH) and electricity in Year 2005 are both 98% (ibid.) and are assumed to be staticthroughout the time periodof 1970–2005. The national average conversion efficiencies for oil and unprocessed wood in Year 2005 are 85% and 70%, respectively (ibid.). These efficiencies are also assumed to be static between 1970–2005 for the following reasons: There have been some minor improvements in the levels of efficiency of combustion of oil and wood for home space and water heating in Sweden since the pre-oil crisis era. However, the ways in which such boilers have been used have had far greater impacts on the efficiency of their operation. For oil-fired boilers the quality of heat exchangers and whether the boiler is located in a house cellar or outside the house are greater determinants of their heat supply. The heat loss from a boiler located in a cellar canalso for example dry clothes. For wood-burning stoves the use of shunt valves and large accumulator tanks has a far greater impact on the amount of fuel used than the actual efficiency of the stove. In addition the condition of the wood itself (i.e., how dry it is) and the ease of access to the wood (i.e., if one ownsthe forest or not) are alsoof more importance than the actual conversion efficiency. The range of uncertainty surrounding values for the useful heat contribution of oil and wood based boilers suggests that from a modelling point of view the most accurate solution is to keep the values constant using the data available for 2005 (Thunman, 2014). The efficiency of a proportion of the electricity used for space heating is assumed to increase starting in Year 1997 due to the increased penetration of heat pumps<sup>6</sup>. The index values shown in Figure 2c reveal how energy demand has increased in cold years (as represented by HDD values), while energy prices have increased by more than 200% over the same period. Figure 2d shows the price and income data for the period 1970–2005 and two distinct price scenarios and one income scenario for the period 2006–2030.

Future estimations of energy price levels are also needed to calculate the unit consumption, *I*, in Equation (2). These estimations are described in Section 2.3. Income per capita is set to increase by 1.98% per annum (EC, 2008). The time series were tested for stationarity and cointegration using the Augmented Dickey-Fuller test (ADF). The tests revealed that the time series for HDD were stationary, whereas the time series for price and income were non-stationary. It was also found that the time series for demand, price, income, HDD, and time trend were cointegrated, which means that the coefficients obtained from an Autoregressive Distributed Lag (ARDL) regression model (as in Equation (2))should

<sup>&</sup>lt;sup>6</sup>From 1997 to 2005, electricity use for space and water heating is divided into that which is used to power heat pumps and that which is used for direct heating. This is done using data on the number of dwellings that have heat pumps installed (SvenskaVärmepumpföreningen, 2013). For this category, useful energy for space and water heating is assumed to be 1.35-times the level of input electricity (Profu, 2013).

be valid. The multicollinearity of the explanatory variables used in Equation (2) was checked by calculating the variance inflation factor (VIF) for each of the explanatory variables. Although the results show the presence of multicollinearity with trend and lag, it is assumed that this does not negatively affect anyof the scenario results. Serial correlation of all regression errors was examined by calculating the Durbin h statistics. Heteroscedastic robust standard errors were used to calculate the*t* statistics (Table 2).

#### 2.2 Bottom-up engineering building stock model

The ECCABS model (Mata et al., 2013a)applies a portfolio of technical energy saving measures (ESMs), which are chosen to exploit the savings potential, to a set of sample buildings. The energy demand of the individual sample buildings is calculated based on the physical properties of the buildings and theirlevels of energy use. In all, 1400 sample buildings, representing the Swedish residential building stock that existed in Year 2005, are modelled in this paper. Data for the sample buildings were obtained from the so-called BETSI program, in which NBHBP (2009, 2010) in cooperation with Statistics Sweden [*Statistiskacentralbyrån* (SCB), in Swedish] chose sample buildings that were statistically representative of the Swedish residential building stock. The number of buildings corresponds to 300 categories that combinebuilding design, age, and location (Hjortsberg, 2011).In addition, the average power demand for hot water production and the average electricity demand for lighting and appliances (in W/m<sup>2</sup>), which are required in the model due to the heat they release to the indoor air, were taken from the Swedish Energy Agency (2009, 2011) respectively. See Mata et al. (2013b) for further details of the model inputs used to describe the Swedish residential building stock.

The results for the sample buildings are scaled-up to represent the entire building stock of a region or country. The calculated net energy for end-uses for the building stock is converted into final energy using conversion efficiency factors for the fuels used. The potential reductions in energy demand are calculated with respect to a baseline or reference year (Year 2005 in this work), which represents the current state of the existing building stock (the energy use in this reference year is described in Section 2.3). The energy demand reduction shown to be cost-effective relative to the reference year is the techno-economic energy savings potential.

In the model, an ESM is considered cost-effective when the cost of the energy savedthrough applying theESM exceeds the total cost for the ESM, i.e. when there is a negative Net Cost for Conserved Energy (NCCE, defined in Mata et al., 2014). The total cost of each ESM, which includes the direct costs (initial investment costsfor materials, labour, and installation required to apply the measure over its entire life, as well as the maintenance and operational costs) but not the indirect costs, (e.g. costs for policy implementation and the costs for consumer information programmes), are assumed not to

change over the scenario period.However, the cost of the saved energy varies with the development of future energy prices as described in the next section2.3 and are discounted to the starting Year 2005. A discount rate of 4% has been assumed (Mattsson, 2011), which is a typical return rate for business. Thus the decrease in the demand of the bottom up model from 2005 to 2030 comes fromenergy price dynamics making more ESM's cost-effective. The total energy saving potential per ESM is the same inboth scenarios examined, and is listed in Table 3 based on the findings of Mata et al., (2013b). See Mata et al. (2014) for further details on the cost calculations within the ECCABS model.

In total,nine types of ESMs<sup>7</sup>, outlined in Table 3 and in Section 3.2, are assessed, and they can be assigned to four categories:

- the retrofit of the different parts of the envelope, i.e., basement, façade or roof (measures 1 to 3,respectively), and the replacement of windows (measure 4);
- the use of ventilation systems with heat recovery for single-family dwellings (SFD) (measure 5) and for multi-family dwellings (MFD) (measure 6);
- a reduction in the use of hot water for SFD to 0.80 W/m<sup>2</sup> (measure7) and for MFD to 1.10 W/m<sup>2</sup> (measure 8) through substitution of the existing water taps with aerator taps;
- a reduction of the average indoor temperature down to 20°C through the installation of thermostats (measure 9).

Since the aim is to calculate techno-economic potential savings, we assume that the ESMs are fully applied, i.e., that the technology is installed and operated correctly in each case. Direct or indirect rebound effects from the implementation of ESMs are not taken into consideration. These two assumptions are of course a simplification, as the ESMs are dependent upon correct operation by the occupants and in some cases, behavioural changes, for instance that occupants are willing to cope with reduced indoor temperatures. As the model has full information on the physical characteristics of the 1400 sample buildings described above, no assumptions need to be made with respect to the amount of buildings that are affected by each ESM.For example, based on sample building characteristics and ESM costs it is known that43%, 61%, 62% and 75% of SFD buildings, could have their cellar, wall, roof or windows upgraded (measures 1 to 4)respectively. The corresponding shares for MFDs are 62%, 56%, 53% and 71%. It is also known that96% of SFDs(measure 5) and 95% of MFDs(measure 6)canhaveventilation systems with heat recovery installed over the scenario period. Buildings which are not subject to measures 1 to 6 either have characteristics that make the application of these measures unfeasible or have building envelope orventilation systems that are already of sufficient

<sup>&</sup>lt;sup>7</sup> As useful energy use is examined in this paper the terms energy saving measure and energy conservation measure have the same meaning.

standard (i.e. for the newest or already retrofitted buildings). Measures 7 to 8 are applied to all buildings, since measurements show that the demand for hot water in Swedish SFDs and MFDs on average 1.79 W/m<sup>2</sup> and 2.14 W/m<sup>2</sup> respectively (Swedish Energy Agency,2009). Measure 9 is applied to all buildings, since measurements also show that the average indoor air temperatures of Swedish SFDs and MFDs are 21.2°C and 22.3°C respectively (NBHBP, 2009). Thus the combination of assumptions on technology cost and sample building characteristicsdetermine the level ofmarket penetration achieved for each ESM.

#### 2.3Future energy prices

Two scenarios of future energy prices from Year 2006 to Year 2030 (Table 1)are used as input parameters to both thetop-down model described in Section 2.1 and the bottom-up model described in Section 2.2.In both price scenarios, actual market prices are used (OPEC, 2010, BAFA, 2010a, BAFA, 2010b) for the period 2006–2010, and price estimates are used thereafter. The reason why two price scenarios are chosen is to distinguish between the case in which no price-induced effortstowards CO<sub>2</sub> mitigation occur (low-price scenario) and the case in which they do occur (high-price scenario). Although such a distinction is not necessary for the main purpose of the paper, i.e., comparing the results from two alternative models, it nonetheless ensures therobustnessofthe results.

For the bottom-up model, the price scenarios needed as model inputs are the full price including taxes paid by householders for each of five common energy carriers used for space and water heating.Coal is excluded, as it is rarely used for home heating in Sweden. For the top-down model, a weighted average price (WAP) for the same five energy carriers is generated. This is done by combining the prices for the five energy carriers with the IIASA GAINS baseline projection for demand (IIASA, 2010) for the same energy carriers.

The only difference between the two scenarios is that in the low-price scenario, carbon taxes are assumed to continue at the Year 2005 rate, while in the high-price scenario, carbon prices rise to  $\in$ 80 per tonne CO<sub>2</sub>by 2030. This means that the commodity prices for oil, coal, and gas are the same in both scenarios. The justification for making this assumption is that although oil prices fall in the high-price scenario as a result of demand, in the low-price scenario a ceiling is placedon oil price rises by the increased supply of coal to liquids. The basis for the prices is the IEA WEO 2009 "450<sup>8</sup>" scenario (IEA, 2009) for future oil, natural gas, and coal prices for Years 2020 and 2030<sup>9</sup>. In the WAP, for the low-price scenario shown in Table 1, the price actually falls between 2010 and 2030. This is a result of

<sup>&</sup>lt;sup>8</sup> As the name suggests, the 450 scenario is one in which the concentrations of greenhouse gases in the atmosphere are stabilised at 450 ppm of CO<sub>2</sub>equivalent by Year 2030.

<sup>&</sup>lt;sup>9</sup> As the WEO data are given in US dollars, it is first converted to Euro for use in the ENPAC model and then to SEK for modelling purposes using the exchange rates for Year 2005.

the influence of the falling electricity price in the low-pricescenario and is a similar development to that used in the reference price scenario of a recent EC analysis of energy prices and costs in Europe(EC, 2014).The average annual price changes of the WAP for the low-price and high-price scenarios between 2010 and 2030 are -0.3 % and +1.3 %, respectively.

Future Prices		2010	2020	2030	2020	2030
Scenario	Unit	<b>Observed Price</b>	Low-price	Low-price	High-price	High-price
Light Fuel Oil	€/MWh	113	123	123	130	145
Natural Gas	€/MWh	83	95	95	101	112
Electricity	€MWh	139	126	116	154	162
Biomass	€/MWh	32	36	37	44	61
District Heat	€/MWh	100	113	113	122	141
WAP	€/MWH	109	110	107	126	140

Table 1 : Energy prices scenarios for residential sector customers to Year 2030, as used in this work.

A two-step process is used to transform the IEA prices, which are those for the energy carriers as traded commodities, to household prices. First, a price model, ENPAC (Axelsson and Harvey, 2010), takes the commodity prices for oil, natural gas, and coal and calculates the industrial wholesale prices for the same energy carriers, as well as for electricity, DH, and biomass. Second, carbon tax, distribution charges, excise tax, and VAT are added, to obtain the household prices. The data for the latter three parameters are obtained from historical price data available from the IEA (2009a), which are assumed to continue along historical lines after Year 2010. In the case of distribution charges, these are assumed to be the average historical difference between the industrial wholesale prices without taxes and the household prices without taxes, and they are found to increase costs by 10%– 60%, depending on the energy carrier in question. Thereafter, the two carbon prices are applied to differentiate the scenarios. These variable CO<sub>2</sub> charges are adopted from Axelsson and Harvey (2010), who have designated these levels as representing a business-as-usual approach in the low-price scenario and a high mitigation policy framework in the high-price scenario. It can be argued that a carbon tax of  $\in 80$  per tonne CO<sub>2</sub> by 2030 is still low, given that the carbon tax in Sweden in 2005 was  $\geq$  6100 per tonneCO<sub>2</sub>. However, due to exemptions, this tax in Sweden is for the most part applied to the use of home heating oil. An investigation of the effect on the results for oil of a carbon tax of €100 per tonne CO<sub>2</sub> in Year 2005 revealed a negligible effect due to the limited use of home heating oil. Thus, the current level of  $CO_2$  tax in Sweden was not taken into consideration; instead, the prices derived from modelling focused on the EU Emission Trading Scheme (ETS) were used (Axelsson and Harvey, 2010).

In addition to the use of the low-price and high-price scenarios, a sensitivity analysis was carried out in which prices were maintained at Year 2005 levels up to Year 2030 and in whichprices were increased by annual increments of 0% to 5% to Year 2030. Although more extreme annual price changes than those in the studied range have been observed between 1970 and 2005, e.g., 46% increase between 1974 and 1975, 23% increase between 1979 and to 1980, and 12% decrease between 1985 and 1986, such changes have not re-occurred over the period studied, which means that a sustained 5% annual increase in prices between 2010 and 2030 is an extreme scenario in itself. This also suggests that price elasticities calculated on the trajectory of the time series of energy prices shown in Figure 2 may be underestimated for a longer period of sustained price increases as is the case in the high-price scenario. We will get back to this the discussion (Section 4).

#### 2.4 Calibratingmodelling methodologies

Both models were used to estimate the demand for space and water heating for the period 2006–2030. This was performed with each model for the two different price scenarios described above.Each model has model-specific inputs for the scenarios, such as future levels of income in the case of the top-down model and discount rates and costs of measures in the bottom-up model. Year 2005 demandfor both models is 74 TWh of useful energy. This value is obtained from the ECCABS model and is similar to the statistically measured value of Final Energy Demand of 72 TWh (Odyssee Database, 2009). The level of penetration of heat pumps in Sweden in this year means that the values of useful and final energy demand are almost equal (NBHBP, 2009).

### **3.Results**

In Section 3.1, an estimation of the market potential made using top-down modelling is presented. Section 3.2 does the same for the techno-economic potential estimated by bottom-up modelling. The difference between the results from the two models, i.e., the energy efficiency gap, is presented in Section 3.3. This is followed by a description of the role of a number of key modelling parameters.

#### 3.1 Market potentials

Results for the market based potential are predicated on the model coefficients  $\alpha$  to  $\varepsilon$  and the constant calculated from Equation (2). These values are listed inTable 2. All the coefficients are found to have the expected sign. The coefficients of price, HDD, and lag ( $\alpha$ ,  $\gamma$ ,  $\varepsilon$ ) are significant at the 5% level, the coefficient of the time trend trend ( $\beta$ ) is significant at the 10% level, while that of income ( $\gamma$ ) is not significant. The R<sup>2</sup> and F statistics confirm the joint significance of the five explanatory variables. The residuals from the model,  $e_b$  in Equation (2), are found to be cointegrated at the 5% level, which indicates that the model is a valid representation of demand. The value for  $\alpha$  (short-term price elasticity) of -0.15 is relatively low and inelastic. The long-term price elasticity is -0.29, which is calculated by taking the effect of the lag ( $\beta$ ) into consideration, and it is also inelastic. VIF tests show multicollinearity between the lag and time trend, suggesting that their coefficients are biased. However, this is not considered to affect the forecasts of unit consumption (Gujarati, 2006). The calculated

elasticities are similar to those obtained by Haas and Schipper (1998) and Nässén et al. (2008). Nässén et al. (2008) found short-term price elasticities of -0.07 for multi-family dwellings and -0.21 for one and two family dwellings for Sweden between 1970 and 2002. The  $\alpha$ -value of -0.15calculated in the presentwork for the entire stock of dwellings lies almost exactly between these two previously obtained values. Haas and Schipper (1998) calculated a short-term price elasticity of -0.11 for the period 1970–1993;their work was for totalenergy use in households. Given the difference in the number of data-points in their work and in the present study,the results are very similar. The income elasticity calculated as 0.00091 is very low and indicates nearly no impacton demand for the energy services of space and water heating with increased income. The coefficient of HDD,  $\delta$ , indicates increased demand with lower temperatures, as expected. The coefficient of the time trend,  $\gamma$ , which includes autonomous technical progress, indicates a decrease in demand of 0.44% per annum, regardless of the dynamics of the other explanatory variables.

Coefficient	t-statistic	Variable		VIF	ADF Statistic	
			It(Useful Der	mand)		1.40
Constant	12.58					
α (Price)	-0.15	3.00	P <sub>t</sub> (Price)	P <sub>t</sub> (Price)		1.88
β (Income)	0.00091	0.01	Y <sub>t</sub> (Income)		5.94	0.30
$\gamma$ (Time trend)	-0.0044	1.77	t (Time trend	t (Time trend)		
δ (HDD)	0.000080	3.34	$HDD_t$	HDD <sub>t</sub>		3.63
ε (Lag)	0.47	3.37	<i>I</i> <sub><i>t</i>-1</sub> (Lag)		20.06	
			e <sub>t</sub> (Residual)			2.92
			Mean VIF		10.32	
Long-termPrice elasticity	-0.29	Adjusted R <sup>2</sup>	0.97 F-stat for Dur		ırbin h test	1.46
Long- termIncome elasticity	0.0017	F-test statistic	191	191 Degrees of freedom		28

Table 2 : Results for the regression of unit consumption (useful energy demand) for the components of Equation (2)<sup>a</sup>.

<sup>a</sup>Serial correlation is notfoundusing the Durbin h statistic test. A Variance Inflation Factor (VIF)  $\geq 10$  is taken to indicate the presence of multi-collinearity. The 1%, 5%, and 10% MacKinnon critical tau values for the Augmented Dickey-Fuller (ADF) unit root test of stationarity are -4.067, -3.46, and -3.2447, respectively (Gujarati, 2006). The 1%, 5%, and 10% Engle and Granger Critical tau values for the ADF test of cointegration are -2.5899, -1.9493, and -1.6177, respectively (Gujarati, 2006).

Results of combining the elasticities calculated with the two price and one income scenarios which give the market potential to 2030 are shown in Figure 3. Demand is shown to fall from 74 TWh in 2005 to 57 TWh in 2030 in the low-price scenario and 53 TWh in the high-price scenario respectively.

#### 3.2 Techno-economic potentials

The results for the techno-economic potentials derived from the implementation of the ninemeasures are listed in Table 3. The right-most column shows the total technical potential Energy Saved (ES) for space heating and hot water for each measure (% of the baseline demand).Of note is the large contribution to the overall savings potential of two measures: ventilation with heat recovery in SFDs and the use of thermostats to reduce indoor temperatures down to 20°C. One qualification of the potential shown in the latter measure is that decreasing the indoor temperature, despite its great potential for savings, is difficult to implement in less-energy-efficient houses owingto the requirement

for a higher air temperature to compensate for other factors in the operative temperature (i.e.,high air velocity due to infiltrations or low radiation temperatures from the envelope surfaces). In addition, the installation of heat recovery systems usually requires improvement of the air-tightness of the building envelope (which has not been taken into account in this work), so as to maximiseits efficiency. Thus, these two high-impact measures are best combined with other measures, such as changesin U-Values and replacement of windows, which increase efficiency and reduce infiltration. Figure 3 shows that 24 TWh of the potential listed in Table 3 is already available in Year 2010 (using actual market prices) and 26 TWh is available in Year 2020 (in the low-price scenario). Other studies that included examinations of the savings potential for space and water heating in the Swedish residential sector have reportedresults in the same range (BFR, 1996;Dalenbäck et al.2005;Göransson and Pettersson, 2008; SOU 2008:125).

Table 3 : Cost-effective potential saving per measure for the period 2010–2030 for the Swedish dwelling stock, expressed in TWh/yr as well as technical potential Energy Saved (ES) in % of the baseline demand.

Measure description	Cost-effective potential		ES (%)
Total	25.1	31.6	34.0%
Change of U-value of cellars/basements	0.5	0.9	0.6%
Change of U-value of façades	1.6	2.3	2.1%
Change of U-value of attics/roofs	1.1	1.5	1.5%
Replacement of windows (U-value)	1.3	2.0	1.7%
Ventilation with heat recovery, Single Family Dwellings (SFD)	6.1	9.0	8.3%
Ventilation with heat recovery, Multi Family Dwellings (MFD)	0.5	0.9	0.7%
Reduction of power used for the production of hot water to 0.80 W/m <sup>2</sup> (SFD)	1.1	1.7	1.5%
Reduction of power used for the production of hot water to 1.10 W/m <sup>2</sup> (MFD)	0.2	0.2	0.3%
Use of thermostats to reduce indoor air temperature by 1.2°C down to 20°C	12.8	13.1	17.2%

## 3.3 Quantification of the energy efficiency gap

Figure 3 gives the estimates of the energy savings obtained from the top-down (market potential) and bottom-up (techno-economic potential) modelling presented above. Figure 3a shows the development of the energy efficiency cap in the low-price scenario in the period 2005–2030 while Figure 3b compares the results from the low-price and high-price scenarios for Year 2030.

The market savings potential in Year 2030 is 17 TWh (23%) in the low-price scenario, as compared to the level of demand in Year 2005. In the high-price scenario, the corresponding savings potential is 21 TWh (28%). The techno-economic savings potential in Year 2030 is 25 TWh (34%) in the low-price scenario, as compared to the level of demand in Year 2005, while in the high-price scenario the corresponding savings potential is 32 TWh (43%). The differences in the savings potentials to Year 2030 between the models i.e. the energy efficiency gaps, are 8 TWh in the low-price scenario and 11 TWh in the high-price scenario.





It is clear from the data in Figure 3a that the market savings potential from the top-down model follows historical trends in demand (i.e., a linear continuation of the demand profile from 1970 to 2005), while the bottom-up model, metaphorically speaking, takes a sweep through the entire building stock and implements the cost-effective savings opportunities that it finds. This explains why there is a step-change in demand (from 74 TWh to 54 TWh, i.e., a cost-effective potential of 20 TWh) in 2005 for the techno-economic potential (Figure 3a). A further techno-economic potential of 5 TWh to Year 2030 occurs as a result of energy price increases and discounting over the period making more ESM's cost effective. It can thus be observed that the time dimension is of less importance in the bottom-up model, as four-fifths of the techno-economic potential for Year 2030 is available in the first year of the scenario period. The top-down model on the other hand requires a time dimension to reduce the gap to

the techno-economic potential savings that the bottom-up model shows to be possible. Because of this, the gap between results from both models decreases with time from 20 TWh in 2005 to 8/11 TWh in 2030. This can also be interpreted as arising because there are no barriers to the deployment of ESM's included in the bottom-up model whereas the time taken to overcome barriers is implicit in the top-down model. It can also be observed in Figure 3b that increasing prices (from the low-price to high-price scenario) lowers demand in Year 2030 in both scenarios by between 5% and 9%, as compared to Year 2005, and also increases the size of the gap by 2 TWh. The efficiency gap is bigger in the high price scenario because of the lower price response in the top-down model. These different price responses cause a greater gap with increasing prices.

An energy efficiency gap of 13 TWh for 2016 was estimated for space and water heating in Swedish dwellings in a public enquiry published in 2008(SOU 2008:110). This is the same as the gap of 13 TWh estimated in the present work for 2020 for the low-price scenario (or slightly below the 14 TWh estimated for the high price scenario). The 13 TWh gap calculated in the public enquiry is the difference between a techno-economic savings potential of 17 TWh and savings of 4 TWh that are expected from autonomous technical progress and efficiency policy already in place. Although the savings potentials calculated in this work for 2020 are larger than those calculated in the public enquiry for 2016 it is interesting that the same magnitude of gap has been obtained in both studies. Nonetheless the energy efficiency gap found in the present study and in the public enquiry are relatively small compared to total energy demand, e.g., 8/57 (cf. Figure 3a) = 14 % in the low-price scenario. This may be because much has already happened to improve efficiency in the Swedish residential sector since the oil crises.

## 3.4. Key modelling parameters

The results from the two models are heavily influenced by the key modelling parameters, which include energy prices and elasticities, the time trend, the number of ESMs considered, and the discount rates applied.

The role that *energy price* changes play in the models has been examined in a sensitivity analysis using scenarios of price changes from Year 2010 to Year 2030 in 0.5% increments, from 0% per annum to 5% per annum. The results of the analysis for Year 2030 (Figure 4) showthat the difference in annual savings of useful energy in Year 2030 between the market potential and the techno-economic potential will range from7 TWh for noannual increase in the price of energy to 16 TWh for an annual increase in energy prices of 5%. As expected, both models show that as energy prices rise, the savings potentials increase. For energy price increases of 0%–3.5% there is a moderate increase in the gap of 2 TWh over this range. Thereafter, the width of the gap increases as more technological measures become cost-effective in the bottom-up model. Thus, from the methodogical point of view,

the data in Figure 4 confirms that the price response is greater for the bottom-up model although this effect is more pronounced above annual price increases of 3.5%. Over a 20-year period (2010–2030) this (3.5%)would correspond to an energy price increase of approximately 100%.



Figure 4: Sensitivity analysis of estimates of energy savings potentialsin Year 2030, as obtained from the top-down (market potential) and bottom-up (techno-economic potential) modelling of the present work over a range of annual price increases(0%–5%).

It might be argued that the use of a WAP for energy in the top-down model, in contrast to the use of prices for individual energy carriers in the bottom-up model, creates a calibration issue of relevance to anycomparison of the results from the two models. However, when different future weights for the energy carriers were tested the results were not changed by more than 0.5 TWh, which means that this is not an issue.With regard to price elasticities the pertinent question is whether higher price elasticities can be expected in response to a prolonged period of increasing prices such as the high-price scenario of this paper?The answer to this question is probably yes.Price elasticities for the period 1970 to 1985 when prices rose a lot (see Figure 2) have been found to have been higher (Haas and Schipper, 1998) than for the subsequent period.If a higher price elasticity transpires in a period of extended rising prices, this would presumably make more of the energy efficiency potential be realised.At the same time the increased diversification of the energy carrier mix used for space heating may lessen the impact of rising fossil fuel prices (Ó Broin et al, forthcoming 2014).

The coefficient of the *time trend* variable of the top-down model,  $\gamma$  in Equation (2) and in Table 2, shows historic savings of 0.44% per annum, regardless of the dynamics of price and income and the other explanatory variables (see Table 2). In the low-price scenario, for example, it is the magnitude of  $\gamma$ that causes demand to fall, despite the fact that prices also fall in this scenario., The market potential calculations are based on the time trend of the entire stock of residential buildings, which in addition

to energy efficiency improvements in existing buildings has, as stated in Section 2.1, also been affected by the addition of new buildings with higher energy efficiencies than the average stock in the period from1970 to2005. This may mean that the value of 0.44 for  $\gamma$  is too high to use in a scenario for the period 2006 to 2030 and its use results in an overestimation of the impact of  $\gamma$  and thus the market potential to Year 2030.Therefore, our estimate of the gap between the results from the top-down and bottom-up models may also be slightly underestimated.

For the techno-economic estimates, the cost-effectiveness of the ESMs is very sensitive to the *discount rates* used in the calculations, even for values considered to be within the meaning of a 'social discount rate'. Applying discount rates in the range of 1% to 6%, in which the lower rates represent policy actions that facilitateinvestments in ESMs by offering low interest loans, while 6% is the additional discount rate that the EC recommends for the financial calculations in the EPBD-related reporting of the cost-optimal levels of energy performance (NBHBP, 2013), has significant effects on the net annual costs of the ESMs (cf. Figure 4 in Mata et al., 2014).

The *number of ESMs* considered in the bottom-up modelcould certainly affect the estimation of the energy efficiency gap. For the purposes of the present work, the results are valid for the portfolio of measures applied.For the first of the four categories of measures listed in Section 2.3, accurate assessments of techno-economic savings potentials are possible because the relevant physical characteristics of the sample buildings are known. This results in at least one measure from this category being implemented in 80% of buildings. For the other three categories of measures listed in Section 2.3, there may be some overestimation of the techno-economic savings potentials as some buildings may already have undergone improvements (e.g., aerator taps installed) that are not included in the building description database used (Mata et al, 2013b).Furthermore, the ESMs are modeled individually and not simultaneously (Mata et al, 2013a), and therefore it is not known if the synergies that may exist between the measures would increase or decrease the potential energy savings obtained from the bottom-up modeling.

## 4. Discussion

The results obtained from the two models are of relevance to policy makers, with the caveat that there is a clear understanding of the assumptions made and of the corresponding limitations and strengths of the present work. In other words, the bottom-up model indicates which techno-economic potential savings are available under certain assumptions regarding the costs and performance of the ESMs, while the top-down model predicts what the outcome will be if macroeconomic forces continue along

historicallines<sup>10</sup>. Therefore, interpretation of the results of the present study from a policy perspective is warranted.

Theresults from the top-down model show the price elasticity of demand and the effects of non-pricerelated legislation and technical developments. Increasing energy pricesas a policy measure, as implemented in the high-price scenario of this work, does not lead to significant additional savings, as shown by the top-down model. The combination of the high-price scenario and long-term price elasticity of -0.29would resultin a gain (increased market potential over the low-price scenario) of only4 TWh by Year2030. This suggests that while higher prices may achieve a global carbon target or cover the requirements of a Pigovian tax , at the residential sector level they are not so effective.

From the policy perspective, the step change in demand, which results from the bottom-up model show to be feasible in 2005 (see Figure 3), is unlikely to occur so quickly. This is because the bottom-up model does not include delays in the implementation of the technical changes brought about by consumer preferences, risk aversion, up-front investment costs, and asymmetric information provided tohouseholders; these issues are not reflected in the discount rate used. However, the top-down model cannot account for the non-linear or step changes in the diffusion of efficient technologies that would be required to achieve the potential savings indicated in the bottom-up model. This raises the following question: *What level of annual savings is necessary to achieve the techno-economic potential by 2030*? Using the two models in tandem, this question can be answered by calculating the value of *y* in the top-down modeland the *discount rate* in the bottom-up model that would be necessary to close the energy efficiency gap. Thesetwo parameters represent components that are presentin one model but not in the other.

If the value of *y*calculated for the time trend was to increase from 0.44% per annum to 0.9% per annum *ceteris paribus*, theoutcomefrom the top-down model would be the same as that from the bottom-up model by Year 2030. Therefore, attaining the techno-economic potential within this time span would require a more than twofold increase in the historic rate of support for technology diffusion and conservation through, for example, support schemes and regulations. This could be facilitated by the implementation of the technical measures listed in Table 3, and could occur at a planned pace though the introduction of compulsory renovation rates. Furthermore, it could be facilitated by tackling the market failures component of an energy efficiency gap of 8TWh. In this context,Karlsson (2013) shows that the Swedish Energy Agency has adopted a strategy for addressing

<sup>&</sup>lt;sup>10</sup> While there are other methods of undertaking top-down and bottom-up modelling e.g. computable general equilibrium for the former and optimization for the latter, the issues that are described below would be similar for these alternative approaches.

market failures in terms of educating key stakeholders, such as property owners and banks, as to the benefits of energy-efficient building renovations.

Koomey (2000) however criticises the heavy reliance on statistically-derived historical parameters for modelling, e.g.,  $\gamma$  in Equation (2) and in Table 2. Hewrites that 'creating a world with vastly lower carbon emissions presupposes massive behavioural and institutional changes that render past relationships between energy use and economic activity largely irrelevant (just like after 1973)'. Related to this view, Sanstad and Greening (1997) write that, 'economic models (e.g., the market potential estimated in this paper) at their best are probably only good representations of economic conditions five to ten years into the future'. With this in mind, the policy measures in place in Sweden that have resulted in the value of  $\gamma$  in Equation (2) have been examined. These are obtained from the MURE Policy Database (ISIS, 2014) which lists twelve policies for the household sector in Sweden and includes a semi-quantitative impact assessment of their impacts (i.e., whether they are expected to have a low, medium or high impact). Of these twelve policies, eight include in their focusreducing useful energy demand for space and water heating .These eight can be divided into two groups: 1) three policies that were introduced between 1970 and 2005, i.e., the time period used for calculating the value of  $\gamma$ ; and 2) five policies that were or will be introduced post 2005. Whether or not the post-2005 policy measures listed amount to a doubling of the historical efficiency-focused legislation, as prescribed in this paperis unclear. In terms of the numbers of pieces of legislation in place, this doubling has occurred, although the same cannot be stated in regard to the impact of such legislation, given that no high-impact policy measures are included. At the same time, the two post-2006 EPBDrelated measures have yet to be assessed. The extent to which these two policy packages lead to significant demand reductions is crucial to the achievement of the techno-economic potential described in the present paper.

Similar to the matching of the time trend parameter to the techno-economic savings potential, we can also elaborate on how much the discount rate would have to increase in the bottom-up model for the potential it generates to equal the market savings potential seen in the top-down model. The purpose of this exercise is to calculate the implicit discount rate for the case of useful energy demand for space heating in the Swedish residential sector. We show that if the discount rate used in the calculation of the annuities in the bottom-up model of 4% (social discount rate) is increased to 10 % *ceteris paribus*, then the techno-economicsavings potential available in the bottom-up model would be equal to that of the market savings potential shown in the top-down model (17 TWh). This is shown in Figure 5, where the savings potential is plotted for discount rates of between 4% and20%. The value of 10% can be interpreted as the *implicit* discount rate for energy efficiency improvements, and we can reformulate the energy efficiency gap as a "discount gap" of 6%.

These findings can be compared to older estimates in the literature. Train (1985) summarised various earlier studies of implicit discount rates and found that for energy-related investments in home retrofitting, the average values ranged from 10% to 30%. In a bottom-up modelling exercise, Nyboer (1997) used discount rates of 50% forspace heating and 80% for a space heating retrofit based on a literature review, although he had also reported values as low as 6% for a shell conservation retrofit. Therefore, while the energy efficiency gap in the Swedish residential sector certainly raises some concernsregarding unutilised potentials, this discount gap is modest in comparison to the findings of these earlier studies. Once again, this may be the result of efforts implemented since the oil crises to promote energy efficiency in the Swedish residential sector, and it means that there is strong awareness among the Swedish population of the benefits of energy efficiency.



Figure 5 : Techno-economic energy savings potentials obtained from the modelling in the present studyfor discount rates between 4% and 20%.

# 5. Conclusions

In the presentwork, have presented a methodology for estimating the *ex-ante*energy efficiency gap. We have defined this gap as being the difference between the *ex-ante*market and techno-economic energy savings potentials that exist and calculated these potentials using a top-down and a bottom-up model, respectively. This has been done for the case of space and water heating in the existing Swedish residential building stock. The differences between the results from the two models show an a relatively small energy efficiency gap in Year 2030 of8 TWh (14%) and 11 TWh(19%) for a low-price scenario and a high-price scenario, respectively. The use of the two models calibrated to the same reference year and energy demand has also enabled thecalculation of both the implicit discount rate (which was found to be 10%) and the annual rate of implementation of the combined effect of support for technology diffusion, legislation, and regulations needed to realise the techno-economic potential

by Year 2030 (which was found to require a doubling of the historic implementation rate). Increasing energy prices as been found to haveonly amodest impacts on energy demand. These results support a policy approach that involves a broad portfolio of measures that address not only the price mechanism, but also support for the diffusion of key technologies, and stronger regulations and information and other measures to address the high implicit discount rate.

The use of two models in tandem to estimate the energy efficiency gap is a unique approach as compared to other methodologies that have heretofore been published. The advantages of the approach, in addition to allowing quantification of the*ex-ante* energy efficiency gap, are that the combined use of both models gives insights into e.g. the implicit discount rate, which cannot be estimated by either model in isolation. Limitations with the methodology are that the exact numbers calculated are prone to 'measurement errors' (See Introduction) in the case of the bottom-up model and uncertainty around future elasticities in the case of the top-down model. In addition the approach does not give insights into the actual behavioural anomalies in decision making thatare central to the understanding of the energy efficiency gap at the micro-level.

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