

Article

A Systematic Approach to Predict the Economic and Environmental Effects of the Cost-Optimal Energy Renovation of a Historic Building District on the District Heating System

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Abstract: The economic and environmental performance of a district heating (DH) system is to a great extent affected by the size and dynamic behavior of the DH load. By implementing energy efficiency measures (EEMs) to increase a building's thermal performance and by performing cost-optimal energy renovation, the operation of the DH system will be altered. This study presents a systematic approach consisting of building categorization, life cycle cost (LCC) optimization, building energy simulation and energy system optimization procedures, investigating the profitability and environmental performance of cost-optimal energy renovation of a historic building district on the DH system. The results show that the proposed approach can successfully be used to predict the economic and environmental effects of cost-optimal energy renovation of a building district on the local DH system. The results revealed that the financial gains of the district are between 186 MSEK (23%) and 218 MSEK (27%) and the financial losses for the DH system vary between 117–194 MSEK (5–8%). However, the suggested renovation measures decrease the local and global CO₂ emissions by 71–75 metric ton of CO_{2eq}/year (4%) and 3545–3727 metric ton of CO_{2eq}/year (41–43%), respectively. Total primary energy use was decreased from 57.2 GWh/year to 52.0–52.2 GWh/year.

Keywords: LCC optimization; building energy simulation; energy system optimization; energy renovation; historic building district; district heating system

1. Introduction

Fossil fuel supply sources dominate the European building heat market, representing approximately 66% of the total end-use heat demand [1]. The total final energy use in the residential and services sector in Sweden in 2017 was 146 TWh, according to the Swedish Energy Agency [2]. Electricity and oil represent 50% and 8% of the final energy use in the residential and services sector, respectively. Substituting oil and electricity as sources of energy for heating systems with efficient use of resources via district heating (DH) is, therefore, vital in order to achieve a sustainable energy system in the building sector. DH is a heat distribution system where heat is produced at a central plant and distributed via the DH system to end-users. It is common to cogenerate the production of heat with electricity production, i.e., combined heat and power plant (CHP). Benefits from DH include the possibility to use different fuels, using waste that would otherwise be sent to landfill, cogeneration with electricity production, energy security and high supply security.



The profitability and environmental performance of a DH system are directly connected to the buildings' energy use within the DH system. In Sweden, DH represents 32% of the final energy use in the residential and services sector [2], and there is a significant potential to increase its share. However, future heat loads in DH systems are complex to predict, due to, among other aspects, the degree of energy renovations in the building stock. Strong incentives exist for building owners to perform building energy renovation in the form of economic savings and environmental benefits [3]. From an energy savings perspective, it is especially important to study the historic building stock because of the generally poorer thermal performance of older buildings compared to newer ones [4]. An example of investigating the energy savings potential in historic building districts includes the work presented in Liu et al. [5] using the historic district in Visby, Sweden, as a case study. The district was connected to the municipality's DH system. A combination of building categorization and life cycle cost (LCC optimization) was used. The results showed a possible decrease of 31% in energy use and LCC when targeting LCC optimum. It is important to note that no investigation was performed for the effects on the surrounding DH system from the suggested renovation measures. By implementing energy efficiency measures (EEMs) in the buildings, the heat demand will be reduced in the DH system, which is counterproductive for the DH supplier. On the other hand, EEMs could also be a beneficial measure for the DH supplier by reducing the utilization of peak load plants during wintertime, with a high operation cost on these days [6]. As a result, the economic and environmental influences on a DH system from performing building energy renovation are complex to predict because of varying local conditions in terms of fuel mix, CHP plant, heat-only production boiler etc. In addition, to overcome difficulties during studies of complex energy systems, such as cities, there is a need for efficient and rational use of computational software [7].

There are a number of scientific investigations addressing the impacts on the local energy systems from building energy renovation. Aberg and Widén [8] investigated the impact of implementing assumed EEMs in residential buildings in six different DH systems in Sweden. This was performed using a cost-optimization model structure. It was stated that a decrease in heat demand, due to energy efficiency in residential buildings results in reduced use of fossil fuels and biomass in the DH system. Moreover, it was found that the decrease and reduction of heat demand, as a result of the implementation of EEMs, mainly affect heat-only production boiler. In fact, in five out of six DH systems, the quantity of CHP-generated electricity per unit of produced heat is improved. The same cost-optimization tool was used during an investigation of the entire Swedish DH sector based on four pre-defined DH systems [9]. The four DH systems were used to describe a DH sector in aggregated form. The objective was to investigate the effects of reductions in heat demand, due to building energy efficiency improvement. It was concluded that heat demand reductions, for the most part, decrease global CO₂ emissions and the use of biomass and fossil fuels. However, to maximize the reduction in CO₂ emissions, the heat production technologies in different DH systems should be taken into account. Lundström and Wallin [10] also highlighted that by decreasing heat demand through the insulation of the building envelope, the heat load curve is levelled out, resulting in decreased greenhouse gas emissions and improved energy efficiency. The study object consisted of two multi-family buildings in Eskilstuna, Sweden, from the 1960s and 1970s. Le Truong et al. [11] investigated the effects of heat- and electricity-saving measures in multistory concrete-framed and wood-framed versions of an existing residential building connected to DH in Växjö, Sweden. The measures included domestic hot water reduction, improved building thermal envelope, ventilation heat recovery and higher household appliance efficiency. Energy savings from these measures were calculated using building energy simulation (BES) software. It was concluded that measures that decrease more peak load production also give higher primary energy savings. The largest primary energy savings were obtained from efficient household appliances. The importance of decreasing electricity use to reduce primary energy use is in line with the findings from Lidberg et al. [12], which are based on systematic studies of the energy renovation of a multi-family house connected to the DH system. Environmental benefits in the form of decreased global CO_2 emissions from electricity savings were also found by Difs et al. [13],

an energy system optimization model where the energy conservation measures were implemented one at a time, with the town of Linköping, Sweden, as a case study. Åberg and Henning [6] also studied the DH network in Linköping using an energy system optimization model, with a focus on impacts from energy savings in existing residential buildings built during the period 1961–1980. It was concluded that reductions in heat demand in the studied building stock result in decreased global use of fossil fuels and global CO₂ emissions, which is in accordance with the results of Difs et al. [13] (based on a similar model of the DH system in Linköping). It was also shown that it is primarily heat-only production that decreases when the heat demand is reduced, which supports the results from Åberg and Widén [8]. A similar study was performed by Lidberg et al. [14] using the city of Borlänge, also situated in Sweden, as a case study where four energy efficiency packages were investigated. The results showed that electricity production decreases, due to building energy renovation, with less electricity imported to the market as a result. In addition, it was concluded that global greenhouse gas emissions are decreased for all packages, because of the assumption that biomass is a possible replacement for fossil fuels elsewhere.

As presented above, there are a number of scientific investigations addressing the impacts on the DH system from building energy renovation. However, research on the effects of the cost-optimal energy renovation of a building district with regard to the consequential impact on the local energy systems is scarce. The objective of this study is to present a systematic approach with a systematic perspective when investigating the impact of cost-optimal energy renovation of a historic building district concerning economics and environmental performance in terms of primary energy use and CO2 emissions on the DH system. A novel combination of building categorization, LCC optimization, -BES and energy system optimization procedures is the foundation for the proposed research. The approach is applicable for aggregating LCC and heating load to clusters of buildings and districts. Hence, it is possible to reflect the dynamic behavior of individual buildings, clusters and building districts before and after cost-optimal renovation, and the consequential effect on the surrounding DH system. Consequently, the contribution to the research community consists of the development of an effective and useful approach for predicting economic and environmental effects of the optimal renovation of buildings, clusters and districts connected to the DH system. Moreover, the present study will provide a systematic and holistic overview of the connections between building energy performance, profitability and environmental impact in terms of the CO₂ emissions of a DH system located in a Northern European climate during cost-optimal building energy renovation.

2. Systems Approach and Computational Tools

In this study, a systematic approach is used to predict the effects of cost-optimal energy renovation of a building district on the DH system. Firstly, representative building types are obtained through categorization of a building district which is the historic district in Visby, Sweden, in the current research. The original energy use and LCCs of the building types are calculated using the LCC optimization software OPtimal Energy Retrofit Advisory-Mixed Integer Linear Program (OPERA-MILP). By using OPERA-MILP, the cost-optimal energy renovation strategy is also obtained for each building type. The renovation strategy includes cost-efficient EEMs, for example, insulation of the building envelope and window replacement, as well as airtightness. BES software IDA ICE is then used to model and simulate each building type, before and after energy renovation. The heat load for the various building types, as well as energy use and LCCs, can be aggregated at cluster level and district level. The heat load for the DH system is thereafter converted into a flexible time division suitable for larger DH systems by using the software Converter [15]. Lastly, based on the converted heat load, the effects of the energy renovations performed on the DH system is the of environmental impact (CO₂ emissions and primary energy use), optimal DH production and system cost are calculated using the energy systems optimization model

MODEST (Model for Optimisation of Dynamic Energy Systems with Time-dependent components and boundary conditions). The proposed approach is illustrated in Figure 1.



Figure 1. Schematic illustration of the proposed approach.

2.1. Life Cycle Cost Optimization in Buildings: OPERA-MILP

The in-house LCC optimization software OPERA-MILP is used to obtain the cost-optimal energy renovation package for the various building types. OPERA-MILP has been used successfully in a number of previous scientific investigations, e.g., [16–19]. A specified period of time is set for the optimization in the OPERA-MILP software, which is 50 years in this study. Costs related to investments in the heating system, EEMs targeting the building envelope, energy costs and maintenance costs for building components are all taken into consideration. The total LCC of a building is calculated according to Equation (1).

$$LCC_{building} = LCC_{investment} + LCC_{energy} + LCC_{maintenance} - RV,$$
(1)

where $LCC_{building}$ = total building LCC over the optimization period, $LCC_{investment}$ = total investment costs for EEMs targeting the building envelope and heating system, LCC_{energy} = energy cost over the specified period of time, $LCC_{maintenance}$ = maintenance cost for building components and RV = residual value of the investment costs connected to EEMs on the building envelope, heating system and maintenance performed on the building.

The implemented EEMs targeting the building envelope in OPERA-MILP include replacing windows, weatherstripping, floor insulation, roof insulation and inside and outside insulation of the external walls. Concerning heating systems, DH, groundwater heat pump, electric radiators and wood boiler are incorporated into the software. The costs for the various measures in OPERA-MILP are calculated based on cost functions, see Equations (2)–(5). The use of cost functions for describing the costs for the various measures allows for calculating a mathematical optimum, and hence, optimization of LCC.

$$C_{\rm ws.} = C_1 \cdot m, \tag{2}$$

$$C_{\rm w.} = C_2 \cdot A_{\rm window}, \tag{3}$$

$$C_{\rm i.m.} = C_3 \cdot A_{\rm b.c} + C_4 \cdot A_{\rm b.c} + C_5 \cdot A_{\rm b.c} \cdot t, \tag{4}$$

$$C_{\rm h.s.} = C_6 + C_7 \cdot P_{\rm h.s.} + C_8 \cdot P_{\rm h.s.}, \tag{5}$$

The cost for weatherstripping is dependent on the number of windows, see Equation (2) where $C_{ws.}$ = total cost for weatherstripping, C_1 = the weatherstripping cost per window and m = number of windows in the building. Meanwhile, the cost for replacing windows is dependent on the window area, see Equation (3) where $C_{w.}$ = total cost for window replacement, C_2 = window replacement cost per m² and A_{window} = total window area. Equation (4) presents the cost function for the insulation measures where $C_{i.m.}$ = total cost for the insulation measure, C_3 = maintenance or inevitable cost per m², $A_{b.c}$ = total area of the building component, C_4 = fixed part of the insulation cost per m², C_5 = variable insulation cost per m² depending on insulation thickness and t = insulation thickness. Equation (5) shows the cost function for the installation of a heating system. $C_{h.s.}$ = total installation cost for the heating system, C_6 = base cost for the heating system not depending on power, C_7 = cost depending on the power of the heating system. An example a system and C_8 = cost for piping system depending on the power of the heating system.

The building's energy balance is calculated based on a time resolution of 12 time steps where each step corresponds to a month during a year. The energy balance of the building includes heat losses in the form of transmission, ventilation and infiltration and hot water use, as well as heat gains in the form of solar gains and heat from internal sources including electrical appliances, building occupants and heat from processes, such as cooking. A utilization factor for the internal heat gains energy is also considered. The maximum heat power demand is calculated based on the preset indoor temperature, the outdoor design temperature of Visby for the specific building type and the total heat losses of the building. In addition, the power demand for domestic hot water is taken into account.

2.2. Building Energy Simulation: IDA ICE

IDA ICE is a commercial software program within the field of BES. The mathematical models are written in Neutral Model Format (NMF) code, enabling the user to make changes in the models. The software allows a dynamic whole-year simulation. The energy balance in IDA ICE is calculated depending on building geometry, solar radiation, internal heat loads, HVAC (heating, ventilation and air-conditioning) conditions and building construction data.

2.3. Energy System Optimization: MODEST

In this paper, an optimization model is known as MODEST [9,20,21] is used to model and analyze the DH system in Visby, and to investigate the effects of the performed energy renovations of a historic building district on the DH system. MODEST has a flexible time division, which can reflect demand peaks and diurnal, weekly and seasonal variations in energy demand and other parameters, e.g., fuel and electricity prices. MODEST has been applied to electricity and DH systems for approximately 50 local utilities [22–24]. The model has been used in numerous scientific investigations, e.g., [6,13,14,25–29]. A thorough description of MODEST is given by Henning [29] and Henning et al. [24].

With the use of MODEST it is possible to calculate the net income of the DH system, see Equation (6).

where Net $income_{DH system}$ = net income over the optimization period for the DH system, DH income = income for sold DH to end-users and System cost = total cost for the optimal DH production. It should be noted that only costs connected to the optimal DH production are considered, and not other expenditures for running the DH system such as employee salaries.

3. Description of the Historic District and the District Heating System in Visby

3.1. The Historic District

Visby is a town located in southeastern Sweden on the island of Gotland, about 100 km east of the mainland in the Baltic Sea, with approximately 24,000 inhabitants. The average annual outdoor temperature in Visby is +7.7 °C. Twelve historic residential building types, which are typical historic buildings in Visby, are selected as the study object [30,31]. The building types are obtained based on a categorization study of the historic district of Visby. The categorization method can be divided into three main steps:

- 1. Inventory of the building stock, i.e., gathering and compilation of building data;
- 2. Categorization (allocating buildings in groups depending on the number of adjoining walls, number of stories and floor area);
- 3. Selection of building types that are representative of the building stock (each building type selected based on average values of various building characteristics).

The categorization method resulted in a total of 12 building types: 1W-6W and 1S-6S ("W" indicating a building structure of wood and "S" indicating a building structure of stone). Building types 1W-3W and 1S-3S represent single-family houses with one story and a heated attic floor, and building types 4W-6W and 4S-6S multi-family buildings with two stories and a heated attic floor. Moreover, other differences between the building types are illustrated in Figure 2 where a photograph of the corresponding building category is also shown below each illustration. Building category 1 is seen in the top left corner, building category 2 in the top center and so forth.

Using the 12 building types described above, Liu et al. [5] formed four clusters based on variations in building size and type of building structure. Single-family houses 1*W*–3*W* formed Cluster *I*, multi-family buildings 4*W*–6*W* Cluster *II*, single-family houses 1*S*–3*S* Cluster *III* and multi-family buildings 4*S*–6*S* Cluster *IV*. Cluster *I* includes 500 similar single-story wood buildings, Cluster *II* 81 similar multi-story wood buildings, Cluster *III* 117 similar single-story stone buildings and Cluster *IV* 222 similar multi-story stone buildings. Construction data for the building types is given in Table 1, as well as the number of building, with double-glazed windows. All building types are naturally ventilated. The indoor temperature is set to 21 °C following the recommendations by the Public Health Agency of Sweden [32]. Internal heat generation and domestic hot water use are estimated using data from Sveby, a development program for companies and organizations in the construction and real estate industry. The use of domestic hot water is differentiated whether the building is a single-family house (Cluster *I* and Cluster *III*) or a multi-family building (Cluster *II* and Cluster *IV*).

1W, 1S

Figure 2. The studied building types with photographs of corresponding building categories.

Table 1. The number of buildings in each cluster and construction data for the building types.

Cluster			Ι			П			Ш			IV	
Build	ing Type	1W	2W	3W	4W	5W	6W	1 <i>S</i>	25	35	4 <i>S</i>	5S	6 <i>S</i>
No. of	Buildings	309	166	25	33	30	18	55	46	16	75	83	64
Puilding structure	Wood	×	×	×	×	×	×						
Building structure	Stone							×	×	×	×	×	×
Pagamant tuna	Crawl space	×	×	×				×	×	×			
basement type	Unheated basement				×	×	×				×	×	×
No. of adjoining walls		0	1	2	0	1	2	0	1	2	0	1	2
	Area (m ²)	86	61	45	245	180	116	80	57	43	235	173	112
External walls	<i>U</i> -value (W/(m ² .°C))	0.65	0.65	0.65	0.67	0.67	0.67	1.8	1.8	1.8	1.97	1.97	1.97
T 4 7* 1	Area (m ²)	12	12	12	44	37	30	12	12	12	44	37	30
Windows	<i>U</i> -value (W/(m ² .°C))	2.9	2.9	2.9	2.9	2.9	2.9	2.9	2.9	2.9	2.9	2.9	2.9
	Area (m ²)	71	79	92	170	159	159	65	73	86	161	150	150
Roof	U-value (W/(m ² .°C))	0.18	0.18	0.18	0.25	0.25	0.25	0.18	0.18	0.18	0.25	0.25	0.25
	Area (m ²)	49	50	58	133	124	129	44	44	52	123	115	120
Floor	<i>U</i> -value (W/($m^2 \cdot C$))	1.10	1.10	1.10	0.23	0.23	0.23	1.10	1.10	1.10	0.23	0.23	0.23
Heated area (m ²)		98	100	116	398	372	387	87	88	104	369	345	360
Heated volume (m ³)		216	219	256	942	881	917	192	194	228	874	817	852
Air change rate (ACI	H)	0.76	0.74	0.72	0.65	0.64	0.62	0.77	0.75	0.73	0.65	0.64	0.62

To investigate the impact from cost-optimal energy renovation of a historic building district on the DH system in Visby, three different cases concerning LCC and building energy use are investigated. DH is set as the default heating system in all cases. To enable an assessment of the effects of energy renovation, a reference case for the studied buildings is modelled. The remaining lifetime of the building components is set to 0 years in all cases. In Case 1 (the reference case), no EEMs on the building

2W, 2S 3W, 3S H Ħ



envelope are allowed. DH is set as the default heating system since it is the most common heating form in Sweden and is available in Visby. In Case 2 (LCC optimum), the lowest LCC is obtained by selecting cost-effective EEMs on the building envelope. In Case 3, specific energy targets are achieved for the studied building types (83 kWh/m² and 79 kWh/m² for the single-family houses and multi-family buildings, respectively) according to Swedish building regulations, BBR. It should be noted that the energy targets vary depending on geographical location and heating system type in BBR. The location of Visby and DH as the preset heating system are, therefore, considered for the energy targets in Case 3. The cases included in this investigation are summarized in Table 2.

LCC/Energy Target	EEMs on the Building Envelope	Case No.
Reference	Not allowed	Case 1
LCC optimum	Allowed	Case 2
Swedish building regulations—83 kWh/m ² and 79 kWh/m ² for single-family houses and multi-family buildings, respectively	Allowed	Case 3

Fable 2. Summary of the investigated cases in this study. LCC, life cycle	cost
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3.2. The District Heating System

Heat generation is carried out by energy utilities which belong to Gotlands Energi AB (GEAB), the municipal energy utility for Visby. GEAB provides approximately 185 GWh/year (normal year corrected using Energy-Index from the Swedish Meteorological and Hydrological Institute (SMHI) heat to approximately 1250 end-users through the DH distribution network. The end-users of heat, i.e., the customers, can be small single-family houses, large multi-family buildings or various types of public buildings, such as libraries and schools. The total length of the DH pipe network is 90 km, and the culvert heat losses are approximately 11%. The supply temperature varies between 75 and 100 °C depending on the outdoor temperature. A schematic description of the DH system in Visby connected to end users, including Cluster I, Cluster II, Cluster III and Cluster IV, with heat production facilities is shown in Figure 3. The DH production is dominated by biomass. Most of the DH production takes place in heat-only biomass boilers (HOB 5, HOB 6) with flue gas condensation (FGC) together with a compressor heat pump (HP). There are also a number of heat-only peak load boilers, namely bio oil boilers (HOB 1, HOB 2, HOB 3, HOB 4), an electric boiler (HOB 8) and an oil boiler (HOB 7), which are only in operation during the winter season. On average, the heat-only bio-fuel boilers (HOB 5, HOB 6) produce about 90% of DH demand in the system. In addition, landfill gas is utilized to produce heat in the DH system.



Figure 3. Schematic of the DH system in Visby.

4. Input Data

4.1. Input Data: OPERA-MILP

The modelling in terms of building properties was based on the data presented in Section 3.1 for each building. The LCC optimization of the various building types is performed based on a time period of 50 years. The remaining lifetime of the building components is set to zero, resulting in an inevitable cost occurring for the various building elements. DH is set as the heating system before and after renovation. The remaining lifetime of the DH units in the building types is set to zero.

The selection of a cost-optimal energy renovation strategy is directly dependent on the input data used in the OPERA-MILP software. Costs for the various EEMs incorporated into OPERA-MILP are analyzed using cost functions in OPERA-MILP, see Section 2.1. The cost functions are developed based on the Swedish database Wikells [33], which provides up-to-date market costs, as well as using manufacturer data. The investment costs for the various EEMs are given in Table 3. Since the twelve building types include buildings with a structure of either wood or stone, investment costs are developed for both building structures. The minimum insulation thickness is set to 2 cm and the maximum to 42 cm with a step resolution of 2 cm. The thermal conductivity of additional insulation is $0.037 \text{ W/(m} \cdot ^{\circ}\text{C})$. In addition, the cost for weatherstripping varies depending on whether the building is a single-family house or a multi-family building. This is because of a difference in window size. The estimated U-values for the windows are 1.5 W/($m^2 \cdot °C$), 1.2 W/($m^2 \cdot °C$) and 0.8 W/($m^2 \cdot °C$) for the double-glazed, triple-glazed and triple-glazed + low emission windows, respectively. It should be noted that window replacement is inevitable in Case 2 and Case 3. However, since no EEMs are allowed in the reference case, see Table 2, a maintenance cost for the windows is included corresponding to the investment cost for the double-glazed windows. The lifetime is set at 50 years for all insulation measures and 30 years for windows [34]. The lifetime for weatherstripping is assumed to be 10 years.

EEMs	$C_{1, SFH} {}^{1}_{/MFB} {}^{2}$ (SEK/Window)	$C_{2, DG} {}^{3}_{/TG} {}^{4}_{/TG+LE} {}^{5}$ (SEK/m ² Window)	C _{3, wood/stone} (SEK/m ²)	C _{4, wood/stone} (SEK/m ²)	C _{5, wood/stone} (SEK/m ² ⋅m)	С ₆ (SEK)	C ₇ (SEK/kW)	C ₈ (SEK/kW)
Weatherstripping	441/617	-	-	-	-	-	-	-
Window replacement	-	6738/8492/12,169	-	-	-	-	-	-
Roof insulation	-	-	0/0	0/0	679/679	-	-	-
Floor insulation	-	-	0/0	242/242	799/799	-	-	
External wall inside insulation	-	-	153/153	908/1335	1267/1267	-	-	-
External wall outside insulation	-	-	407/407	2411/2571	1267/1267	-	-	-
DH unit	-	-	-	-	-	22,611	415	255

¹ SFH = single-family house, ² MFB = multi-family building, ³ DG = double-glazed, ⁴ TG = triple-glazed and ⁵ TG + LE = triple-glazed + low emission glass.

The exchange rate is set to 10.30 SEK \approx 1 Euro [35]. A discount rate of 5% is used [36]. For piping system in the heating systems, a lifetime of 50 years is set. Data concerning fuel prices, annual cost, life times and efficiencies connected to the DH unit is presented in Table 4. Fuel prices and annual costs for DH are obtained from Gotlands Energi AB using data from 2016.

Table 4.	Price da	ıta, life time	e and efficiend	cy for the	e DH unit.
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Heating System Data	Fuel Price (SEK/MWh)	Annual Cost (SEK)	η (-)	Life Time (Years)
DH unit	959	315	0.95	25 [37]

4.2. Input Data: IDA ICE

In the present study, version 4.8 of IDA ICE was used. The buildings were modeled using climate data based on ASHRAE IWEC2 [38]. Each building was modelled based on the data presented in

Section 3.1. The simulations were performed during one year with 14 days of dynamic startup in order to achieve stability in the thermal characteristics of the building, such as the set indoor temperature, which is also the default in the software. IDA ICE models visualizing each building category are seen in Figure 4. Building category 1 is seen in the top left corner, building category 2 in the top center, and so forth.



Figure 4. The buildings modeled in IDA ICE software.

4.3. Input Data: MODEST

The DH system in Visby is modeled in MODEST. Technical data for utilities, CO_2 emission factors and flexible time divisions that can reflect peaks and diurnal, weekly and seasonal variations in DH demand in Visby are given as input data for MODEST, see Table 5. The DH demand (185 GWh/year) varies continuously throughout weekdays, weekends and months. Table 6 shows the MODEST time periods used in this study. CO_2 emission factors for the fuel used in the DH model include both production and transportation. The electricity prices in the model reflect the average value of the actual Swedish electricity prices on the Nord Pool spot market during 2018 for Visby including electricity distribution costs and electricity tax. A period of 50 years is studied, and the discount rate is set to 5%. The primary energy factor for the DH produced in Visby is set as 0.31 since this is the local value [39].

Table 5.	DH produc	tion plants and	d their properties.
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Heat-Only Boilers/Heat Pump	Heat Production (MW)	Fuel	CO ₂ Emission Factor [40,41] (g CO _{2eq} /kWh)
HOB 1	27.2	Bio oil	5
HOB 2	10.8	Bio oil	5
HOB 3	6	Bio oil	5
HOB 4	11.8	Bio oil	5
HOB 5 with FGC ¹	10	Biomass	11
HOB 6 with FGC ¹	18	Biomass	11
HOB 7	6.6	Oil	290
HOB 8 ²	17	Electricity	969
Heat pump (HP) ³	12	Electricity	969

 $^{1}\eta = 1.10, ^{2}\eta = 0.98, ^{3}$ COP = 2.5.

Month	Days and Hours	Month	Days and Hours
November-March	Mon.–Fri., 6–7	April-October	Mon.–Fri., 6–22
	Mon.–Fri., 7–8	_	Mon.–Fri., 22–6
	Mon.–Fri., 8–16		Sat., Sun. and holiday, 6–22
	Mon.–Fri., 16–22		Sat., Sun. and holiday, 22–6
	Mon.–Fri., 22–6		-
	Sat., Sun. and holidays, 6–22		
	Sat., Sun. and holidays, 22–6		
	Top day, 6–7		
	Top day, 7–8		
	Top day, 8–16		
	Top day, 16–22		
	Top day, 22–6		

Table 6. The MODEST-time periods applied in this study.

The DH production is dominated by biomass. Most of the DH production takes place in heat-only biomass boilers (HOB 5, HOB 6) with flue gas condensation (FGC) together with a compressor heat pump (HP). There are also a number of heat-only peak load boilers, namely bio oil boilers (HOB 1, HOB 2, HOB 3, HOB 4), an electric boiler (HOB 8) and an oil boiler (HOB 7), which are only in operation during the winter season. On average, the heat-only bio-fuel boilers (HOB 5, HOB 6) produce about 90% of DH demand in the system.

The marginal electricity production accounting model has been used in order to calculate global CO_2 emissions. This means that a coal-fired condensing power plant has been assumed to be the short-term marginal power plant in the European electricity system. According to marginal electricity, the production of 1 GWh electricity gives 969 metric ton of $CO_{2eq.}$ [40]. Hence, the local electricity used, e.g., for heat pumps, will increase the electricity produced by coal-fired condensed power plants and that the global CO_2 emissions will, therefore, increase.

5. Results and Discussion

5.1. Energy Use, LCC, and System Cost, Net Income and Environmental Effects of the DH System before Energy Renovation of the Studied Buildings in Visby

The following section presents energy use and LCC for the buildings before energy renovation. This is shown at building type level, cluster level and district level. In addition, the environmental effects and system cost are given at city level together with the total net income for the DH system.

5.1.1. Building Level

The original performance of the building types in terms of specific energy use and LCC has been predicted using OPERA-MILP. Energy use and LCC for the various building types are presented in Table 7. The specific energy varies between 99.1 and 200.1 kWh/m² for the wood buildings and between 143.2 and 324.0 kWh/m² for the stone buildings. The overall better thermal performance of the wood buildings compared to the stone buildings, as a result of the lower *U*-value of the external walls as presented in Table 1, is the reason for the lower energy use in the wood buildings. It should be noted that the specific energy use (heating and domestic hot water use) for buildings built before 1940 in Sweden is on average 125 kWh/m² for single-family houses and 146 kWh/m² for multi-family buildings [42]. This means that all single-family houses in this study have higher energy use (in the range of 161.2–324.0 kWh/m²) compared to the national average. The opposite trend is seen with the multi-family buildings, where the buildings in Cluster *II*, i.e., building types 4*W*–6*W*, and building type 6*S* have a lower specific energy use (varying between 99.1 and 143.2 kWh/m²) compared to the Swedish average.

Cluster	Ι			II			III			IV		
Building Type	1W	2W	3W	4W	5W	6W	15	25	35	4 <i>S</i>	5 <i>S</i>	6 <i>S</i>
Maximum power demand (kW)	6.9	6.4	6.7	19.0	16.3	14.4	9.1	7.8	7.6	27.3	22.2	17.9
Specific energy use (kWh/m ²)	200.1	178.6	161.2	128.1	115.4	99.1	324.0	266.2	218.0	219.8	187.3	143.2
Specific LCC (kSEK/m ²)	5.6	5.0	4.4	3.7	3.3	2.7	8.1	6.8	5.6	5.5	4.8	3.6

Table 7. Maximum building power demand, specific energy use and LCC for the various building types.

In terms of specific LCC during the optimization period of 50 years, the LCC is in the range between 2.7 and 5.6 kSEK/m² (kSEK stands for thousands of SEK) for the wood buildings and between 3.6 and 8.1 kSEK/m² for the stone buildings. There is a strong correlation between high/low energy use and high/low LCC. The reason for this is that the LCC before energy renovation consists only of energy cost and heating system installation cost, where the energy cost constitutes the largest expenditure of LCC by a significant degree because of the low installation cost for the building's heating system, i.e., the DH system, see Table 3.

5.1.2. Cluster Level

Energy use and LCC for the four building clusters are presented in Table 8. The specific energy use for the various clusters is 190.7 kWh/m², 117.1 kWh/m², 284.9 kWh/m² and 185.8 kWh/m² for Cluster *I*, Cluster *III* and Cluster *IV*, respectively. The corresponding figures are 207.1 kWh/m² for all single-family houses (Cluster *I* and Cluster *III*) and 166.4 kWh/m² for all multi-family buildings (Cluster *II* and Cluster *IV*), which is 82 kWh/m² and 20 kWh/m² above the national average for single-family houses and multi-family buildings, respectively.

Cluster		Ι			II			III			IV	
Building Type	1W	1W 2W 3W 4		4W	5W	6W	15	25	35	4S	5 <i>S</i>	6 <i>S</i>
No. of Buildings	309	166	25	33	30	18	55	46	16	75	83	64
Specific energy use (kWh/m ²)	200.1	178.6	161.2	128.1	115.4	99.1	324.0	266.2	218.0	219.8	187.3	143.2
Specific energy use at the cluster level (kWh/m ²)		190.7			117.1			284.9			185.8	
Total energy use at the cluster level (GWh)		9.5			3.7			3.0			14.7	
Specific LCC (kSEK/m ²)	5.6	5.0	4.4	3.7	3.3	2.7	8.1	6.8	5.6	5.5	4.8	3.6
Specific LCC at Cluster level (kSEK/m ²)		5.3			3.3			7.2			4.7	
Total LCC at Cluster level (MSEK)		263.8			103.2			75.6			372.9	

Table 8. Energy use and LCC for the four building clusters before renovation.

The specific LCCs during the optimization period of 50 years are 5.3 kSEK/m², 3.3 kSEK/m², 7.2 kSEK/m² and 4.7 kSEK/m² for Cluster *I*, Cluster *II*, Cluster *III* and Cluster *IV*, respectively. Hence, Cluster *II* has the lowest specific LCC (the cluster with the lowest specific energy use) and Cluster *III* the highest specific LCC, which is also the cluster with the highest specific energy use. Cluster *III* and Cluster *IV* have moderate specific LCCs. The two clusters also have moderate specific energy use. When comparing the total LCCs of the various clusters, Cluster *I* and Cluster *IV* have total LCCs of 264 MSEK (MSEK stands for millions of SEK) and 373 MSEK, which is significantly higher compared to Cluster *II* (103 MSEK) and Cluster *III* (76 MSEK). This is largely explained by the large heated areas in these two clusters (Cluster *I* ~49,800 m² and Cluster *IV* ~79,400 m²) compared to Cluster *II* and Cluster *III* (76 MSEK). This is largely explained by the large heated areas in these two clusters (Cluster *I* ~49,800 m² and ~10,500 m², respectively.

Heating load duration curves for the various clusters are constructed using hourly data obtained through the energy simulations of the building types in IDA ICE, see Figure 5. The duration curve visualizes the heating load in descending order in terms of magnitude, considering the periods of time

during which the loads occur. Therefore, the duration curve directly reflects the thermal performance of the clusters, as well as the heated area in each cluster. Consequently, Cluster *IV* has the highest heat load followed by Cluster *I*, Cluster *II* and Cluster *III*. Furthermore, the duration curves also provide information about the baseload that is visualized by the lowest loads in the diagram. For Cluster *I* to Cluster *IV*, the baseload occurs approximately between 1600 h and 2600 h.



Figure 5. Duration curves for the four building clusters. Cluster I = top left corner, Cluster II = top right corner, Cluster III = bottom left corner and Cluster IV = top right corner.

5.1.3. District Level

The total heated area before renovation for the 920 buildings in the studied district, i.e., the four building clusters, is 0.17 km². The energy use at the district level is calculated at 31 GWh. The corresponding figure in terms of specific energy use for the district is 180.8 kWh/m². The total LCC is 816 MSEK during an analysis period of 50 years, and the specific LCC is 4.8 kSEK/m². The power demand over the year for the studied district and the corresponding load duration curve are shown in Figure 6. The peak load for the district is 9.4 MW, and the baseload is 0.45 MW. It is important to note that due to the monthly time-step calculation procedure in OPERA-MILP, average monthly internal heat gains are also used in IDA ICE for comparability purposes. However, a study by Milić et al. [43] showed that the predictions of energy usage correspond to a maximum annual difference of 4% when considering varying internal heat gains. The low impact from varying internal heat gains is explained by that the case study consisted of buildings with overall poor thermal performance and low time constant, similar to the buildings in the present research.



Figure 6. Power demand over the year for the building district with a corresponding duration curve.

5.1.4. City Level

To enable a comparison to be made before and after cost-optimal energy renovation of the 920 buildings in the study object, the performance of the DH network in Visby before building renovation is presented in the following section. As mentioned in Section 3.2, the total DH demand before renovation is 184.6 GWh/year for Visby. The primary energy use is 57.2 GWh/year considering the local primary energy factor for Visby (0.31). The peak load for the city is 54 MW.

The optimal DH production by the various plants in Visby is shown in Figure 7 for Case 1 (before renovation of Clusters *I–IV*) using the optimization model MODEST.



Figure 7. Optimal DH production in Visby before renovation of Clusters I-IV.

In Case 1 (i.e., the Reference case), no EEMs targeting the building envelope are introduced in the building stock and the DH demand is produced by the utilities heat-only boilers and heat pumps, see Figure 7. Biomass heat-only boilers (HOB 5, HOB 6) generate the largest part of the DH demand (164.7 GWh/year). Heat pumps additional supply heat of 18.0 GWh/year to the DH system. The bio oil boilers produce the rest of the DH demand (0.5 GWh/year) during the peak load. In addition, landfill gas supplies around 1.4 GWh/year to the DH system. Local and global $CO_{2eq.}$ emissions, in this case, are 1667 metric ton/year and 8648 metric ton/year, respectively. The system cost for the DH system is 39.8 MSEK/year and 727 MSEK during an optimization period of 50 years. The system cost is the present value of capital costs, fixed costs, costs related to the output power and costs associated with the amount of energy used (energy costs). The revenue from sold DH to end-users is 3232 MSEK resulting in a net income of 2505 MSEK for the DH system, or 137 MSEK/year.

5.2. Cost-Optimal Energy Renovation; EEMs, Energy Use, LCC and System Cost, Net Income and Environmental Effects of the DH System

This section presents the results from cost-optimal energy renovation in terms of selected EEMs, energy use and LCC for the studied cases in this investigation. This is given at building type level, cluster level and district level. Furthermore, an assessment of the effects of cost-optimal renovation on the Visby DH system in terms of system cost, net income, primary energy use and CO₂ emissions is presented.

5.2.1. Building Level

Using LCC optimization, cost-optimal energy renovation strategies are identified for LCC optimum (Case 2) and energy targets of 83 kWh/m² and 79 kWh/m² for single-family houses and multi-family

buildings, respectively, according to Swedish building energy regulations (Case 3). The selection of EEMs targeting the building envelope for the various cases is presented in Table 9. The effects of energy renovation in terms of specific energy use and LCC are given in Table 10. It is important to note that replacing windows is inevitable in Case 2 and Case 3 because the remaining lifetime of the building elements is zero, resulting in weatherstripping as a side effect, since the new windows are assumed to be airtight. From a profitability point of view, double-glazed windows are, in most cases, the suggested window type.

Cluster		Ι			II			III			IV		
Building Type		1W	2W	3W	4W	5W	6 W	1 <i>S</i>	2 <i>S</i>	35	4 <i>S</i>	5 <i>S</i>	6 <i>S</i>
Window type	Case 2	DG *	DG	DG	DG	DG	DG	DG	DG	DG	DG	DG	DG
	Case 3	DG	DG	DG	DG	DG	DG	DG	DG	DG	DG	DG	DG
Floor insulation	Case 2	26	26	26	0	0	0	24	24	24	0	0	0
	Case 3	24	32	26	0	0	0	24	24	24	0	0	0
Roof insulation	Case 2	12	12	12	18	16	16	10	10	10	16	16	16
	Case 3	10	18	4	24	24	6	0	0	0	16	16	10
External wall inside insulation	Case 2	0	0	0	0	0	0	20	20	20	20	20	20
	Case 3	8	2	0	6	4	0	20	14	6	12	8	4

Table 9. Selected EEMs targeting the building envelope.

* DG = double-glazed window.

Table 10. Specific energy use and LCC for the various building type. The percentage change in Case 2 and Case 3, compared to Case 1 is indicated in parentheses with an italic font.

Cl	uster		Ι			II			III			IV	
Buildi	ng Type	1W	2W	3W	4W	5W	6W	1 <i>S</i>	25	35	4S	5 <i>S</i>	6 <i>S</i>
C 1	kWh/m ²	200.1	178.6	161.2	128.1	115.4	99.1	324.0	266.2	218.0	219.8	187.3	143.2
Case 1	kSEK/m ²	5.6	5.0	4.4	3.7	3.3	2.7	8.1	6.8	5.6	5.5	4.8	3.6
Case 2 -	kWh/m ²	111.5 (-44)	93.5 (-48)	80.2 (<i>-50</i>)	97.6 (-24)	88.0 (-24)	76.4 (-23)	79.3 (-78)	72.3 (-74)	67.8 (<i>-</i> 70)	73.5 (<i>-68</i>)	69.1 (-65)	64.7 (<i>-56</i>)
	kSEK/m ²	4.3 (-24)	3.7 (-26)	3.1 (-28)	3.2 (-14)	2.9 (-14)	2.4 (-14)	5.6 (-37)	4.7 (-35)	3.8 (-34)	4.0 (-32)	3.5 (-30)	2.7 (-27)
Case 3	kWh/m ²	81.8 (-61)	81.4 (<i>-55</i>)	83.1 (<i>-48</i>)	77.6 (-41)	75.9 (-36)	78.7 (-21)	83.1 (-77)	82.0 (-71)	82.1 (-63)	77.6 (-66)	76.9 (-60)	77.5 (<i>-46</i>)
Case 5 -	kSEK/m ²	4.7 (-20)	4.1 (<i>-18</i>)	3.2 (-28)	3.5 (<i>-8</i>)	3.2 (-7)	2.4 (-13)	5.7 (-36)	4.8 (-34)	3.9 (-32)	4.0 (-31)	3.5 (-28)	2.9 (-21)

It is important to be aware that the cost-optimal energy renovation strategy is unique for each building type because of unique building conditions in the form of layout and construction. In any case, the strategies in terms of selected insulation measures are very similar for the building types in each cluster as the building properties are highly similar. The selection of 26 cm floor insulation and 12 cm roof insulation in Case 2 for all building types in Cluster *I*, i.e., single-family houses in wood, is an example of this. Other trends that can be seen in Table 10 concerning selected EEMs in the building types and clusters are:

• Floor insulation in the range between 24 cm and 32 cm is profitable for Cases 2 and 3 in Cluster *I* and Cluster *III*, i.e., building types standing on crawl space, because of high transmission losses originally

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- Roof insulation is generally profitable in all clusters and cases because of low retrofit costs (despite an originally low *U*-value). The suggested insulation thickness varies between 10 and 18 cm at LCC optimum (Case 2). The corresponding figure for the energy target according to the Swedish building regulations (Case 3) for the building types varies more, due to the cost-effective comparison between EEMs on the building envelope
- Inside insulation of the external walls is profitable for all cases in the stone buildings, Cluster *III* and Cluster *IV*, because of a high *U*-value before renovation, 1.80–1.97 W/(m²·°C). The suggested insulation thickness is 20 cm in Case 2, but varies between 2 and 20 cm in Case 3, due to the cost-effective comparison between EEMs. The inside insulation of the external walls is also necessary in some of the wooden buildings to achieve the energy targets in Case 3.

The energy use at the cost-optimum point, Case 2, varies between 80.2–111.5 kWh/m², 76.4-97.6 kWh/m², 67.8-79.3 kWh/m² and 64.7-73.5 kWh/m² for Cluster I, Cluster II, Cluster III and Cluster IV, respectively. The percentage decrease in energy use is the highest for the building types standing on crawl space (Cluster I and Cluster III) and the building types with an external wall of stone (Cluster III and Cluster IV). The reason for this is the additional insulation of these building elements, as well as the poor U-value before renovation. Of the single-family houses, building type 3W and all building types in Cluster III, 1S–3S, achieve the Swedish building regulations target of 83 kWh/m² at the cost-optimum point. Concerning the multi-family buildings at LCC optimum, building type 6W, and all building types in Cluster IV, 4S–6S, achieve the energy target of 79 kWh/m². Hence, the specific energy use at LCC optimum is lower than the energy target in the Swedish building regulation for all building types in stone, i.e., Cluster II and Cluster IV. In most optimizations, the energy target in Case 3 is achieved in Case 2, only requiring cost-effective comparison between the EEMs on the building envelope. This is, however, not the case in building types 1W, 2W, 4W and 5W where the energy use is further decreased in Case 3 to reach the energy target of 83 kWh/m² according to the Swedish building regulations (BBR). Concerning LCC, the costs during an optimization period of 50 years are lowered by 14–37% at LCC optimum compared to before renovation. In Case 3, the LCC is lowered for all buildings compared to before renovation varying between 8% and 36%. The largest percentage decrease in LCC occurs for the building types where the energy use has been decreased the most. For instance, the LCC is decreased the most in the building types in Cluster III (34–37%) at LCC optimum) which are also the building types with the highest percentage decrease in energy use (70–78% at LCC optimum). The same tendencies are identified for the buildings with the lowest percentage decrease in energy use, 23–24% for the building types in Cluster II. The decreases in LCC are determined at 14% for the building types in Cluster II.

5.2.2. Cluster Level

Specific energy use and LCC in Cases 1–3 for the four building clusters are presented in Table 11, with the percentage difference after renovation (Cases 2 and 3) compared to Case 1 given in the parenthesis. The specific energy use for the various clusters varies between 69.3 kWh/m² and 103.7 kWh/m² in Case 2. The corresponding figures for Case 3 are 77.2 and 82.5 kWh/m². The specific LCC varies between 2.9–5.0 kSEK/m² and 3.1–5.1 kSEK/m² for Case 2 and Case 3, respectively. Of the study's building clusters and cases, Cluster *III* is the cluster with the highest percentage decrease in energy use (76%) and LCC (31%) compared to before renovation at the cost-optimum point. Cluster *II* has the lowest percentage decrease in energy use (23%), as well as in LCC (12%). The low and high percentage decreases in energy use for Cluster *II* and Cluster *III* are explained by the originally good thermal performance of the building types in Cluster *III* and the poor thermal performance of the building types in Cluster *III* and the poor thermal performance of the building to the energy target in Case 3 does not result in a higher LCC compared to before renovation in any of the optimizations. In fact, the LCC is decreased by 0.2–2.1 kSEK/m², or 6–29%.

Cluster		I II		III			IV					
Building Type		2W	3W	4W	5W	6W	1 <i>S</i>	25	35	4 <i>S</i>	5 <i>S</i>	6 <i>S</i>
No. of Buildings	309	166	25	33	30	18	55	46	16	75	83	64
Energy use before renovation—Case 1 (kWh/m ²)	190.7		117.1		284.9			185.8				
LCC optimum—Case 2 (kWh/m ²)	103.7 (-46%)		89.4 (-23%)		74.7 (-76%)			69.3 (-64%)				
Swedish building regulations—Case 3 (kWh/m ²)	81.7 (-57%)		77.2 (-35%)		%)	82.5 (-73%)		%)	77.3 (-59%)		%)	
LCC before renovation—Case 1 (kSEK/m ²)	5.3		3.3			7.2			4.7			
LCC optimum—Case 2 (kSEK/m ²)	4.0 (-24%)		2.9 (-12%)		5.0 (-31%)		%)	3.4 (-28%)		6)		
Swedish building regulations—Case 3 (kSEK/m ²)	4.	4 (-179	%)	3.1 (-6%)			5.1 (-29%)			3.5 (-26%)		

Table 11. Specific energy use and LCC in Cases 1–3 for the various clusters.

Annual energy use and total LCC during the optimization period of 50 years for the four building clusters are shown in Figure 8 for Cases 1–3. Cluster *IV* has the highest energy use and LCC in all three cases, followed by Cluster I, Cluster II and Cluster III. The annual energy use is 4.0–9.5 GWh, 2.4–3.7 GWh, 0.7–3.0 GWh and 5.3–14.8 GWh for Cluster I, Cluster II, Cluster III and Cluster IV, respectively. The corresponding figure for LCC is 200–265 MSEK, 91–104 MSEK, 49–76 MSEK and 260–373 MSEK. When investigating the profitability of the suggested renovation measures between the clusters, there is a clear difference in terms of potential decreases in total LCC. Cluster *I* and Cluster IV show significant financial gains at the cost-optimum point (Case 2) compared to before energy renovation. The LCC is decreased from 265 MSEK to 200 MSEK in Cluster I and from 373 MSEK to 260 MSEK in Cluster IV. It is important to note the corresponding decrease in total energy use from cost-optimal energy renovation of Clusters I and IV, which is calculated at 13.8 GWh. This is 10.6 GWh more compared to the total decrease in Cluster II and Cluster III (total energy use = 6.7 GWh in Case 1 and 3.5 GWh in Case 2). The consequential effect from the suggested renovation measures with a decreased heating load on the local DH system will be addressed in Section 5.2.4. With regard to the energy targets in Case 3 (Swedish building regulations), the energy use is decreased from 1.3 GWh (Cluster II) to 8.7 GWh (Cluster IV). Following the tendency in terms of decrease in energy use, Cluster IV has the highest LCC savings in Case 3 (101 MSEK). Clusters I–III also show financial gains when performing renovation according to the energy targets in Case 3, varying between 8 and 51 MSEK.



Figure 8. Annual energy use (to the left) and total LCC (to the right) during an optimization period of 50 years for Clusters *I–IV* in Case 1 (solid blue), Case 2 (red checkered) and Case 3 (green vertical lines).

5.2.3. District Level

The following section presents the effects at district level from the cost-optimal renovation of the various building clusters in terms of LCC and energy use. Consequently, the findings can be used as guidance for various stakeholders when investigating the possibilities for energy renovating building

districts. The total energy use and LCC for the 920 buildings in the studied district, i.e., the four building clusters, are shown in Table 12. Total energy use is decreased in the range between 17.0 GWh and 17.7 GWh compared to before renovation. The highest decrease occurs when performing energy renovation according to the Swedish building regulations (Case 3), where the energy use is decreased by 57%. Interestingly, the percentage difference in energy use in Cases 2, 3 compared to Case 1 varies between 55% and 57%, showing that the energy use after renovation only varies slightly between Case 2 and Case 3. In terms of expenditure during the 50 years, LCC is calculated at 818 MSEK, 600 MSEK and 632 MSEK for Cases 1–3, respectively. Hence, financial revenue between 186 and 218 MSEK are made possible through renovation according to the cases in this study.

Case	Energy Use (GWh)	LCC (MSEK)
Energy use before renovation—Case 1	30.9	818
LCC optimum—Case 2	13.9 (-55%)	600 (-27%)
Swedish building regulations—Case 3	13.2 (-57%)	632 (-23%)

Table 12. Energy use and LCC of the building district in Cases 1–3.

The effects of the cost-optimal renovation of each cluster on the district are unique, in terms of both energy use and LCC. This is visualized in Figure 9 for energy renovation of each cluster at the cost-optimum (Case 2), arranged from the cluster with the highest energy savings, Cluster *IV*, to the cluster with the smallest energy savings (Cluster *II*) compared to before renovation. As shown in Figure 9, the LCC for the district is decreased by 113 MSEK, 64 MSEK, 28 MSEK and 13 MSEK when renovating Cluster *IV*, Cluster *I*, Cluster *III* and Cluster *II*, respectively. The corresponding annual energy savings are 9.5 GWh, 4.3 GWh, 2.3 GWh and 0.9 GWh. This shows clear differences between the clusters in terms of cost-optimal energy efficiency potential and a potential decrease in LCC. Furthermore, using the proposed approach, it is possible to rank building clusters in a district based on the profitability of suggested energy renovation measures, or energy savings. Hence, various stakeholders can apply and use the approach to obtain the optimal outcome for building energy renovation depending on both financial budget and final objectives.



Figure 9. LCC MSEK (solid blue) and total energy use GWh (red vertical lines) before renovation and when selecting cost-optimal EEMs in the various clusters at LCC optimum (Case 2).

The corresponding effect, i.e., renovation of the various clusters according to the description above for Figure 9, on the DH load for the historic district can be seen in a duration curve in Figure 10 using the time steps in MODEST. The top duration curve shows the duration curve for Case 1, and the second, third, fourth and fifth curves from the top show the duration curve after cost-optimal renovation (Case 2) of Cluster *IV*, Clusters *IV* + *I*, Clusters *IV* + *I* + *III* and Clusters *IV* + *I* + *III* + *II*, respectively.

Following the tendencies in terms of decreases in energy use and LCC, renovating Cluster *IV* and Cluster *I* corresponds to the largest decreases in heat load in the duration curve compared to Case 1. This can be exemplified by analyzing the peak load for each duration curve. The peak load (9.4 MW) is decreased by 2.6 MW, 1.3 MW, 0.6 MW and 0.3 MW when energy renovating Cluster *IV*, Cluster *I*, Cluster *II* and Cluster *II*, respectively.



Figure 10. Duration curve when selecting cost-optimal EEMs in the various cluster at LCC optimum (Case 2), as well as before renovation (Case 1) for the historic district. Top left = duration curve for the district in Case 1 and after renovating Cluster *IV*, top right = duration curve after renovating Clusters IV + I, bottom left = duration curve after renovating Clusters IV + I + III and bottom right = duration curve after renovating Clusters IV + I + III and bottom right = duration curve after renovating Clusters IV + I + III and bottom right = duration curve after renovating Clusters IV + I + III + II.

5.2.4. City Level

This section presents the optimization results for the Visby DH system after cost-optimal energy renovation of the building stock. In addition, the effects on the Visby DH system from the cost-optimal renovation of the various building clusters (when arranged by decreased energy use compared to before renovation) have also been investigated and the optimization results are described in this section. In addition, the LCC and environmental impacts from the renovation of a historic district are shown. Table 13 summarizes the results for Cases 1–3. Table 14 summarizes the results when carrying out energy renovation separately for each building cluster at the cost-optimum point (Case 2), ranging from the cluster with the highest energy savings to the cluster with the lowest energy savings, i.e., corresponding to the following order: Cluster *IV*, Clusters *IV* + *I*, Clusters *IV* + *I* + *III* and Clusters *IV* + *I* + *III* + *III* + *III* and Clusters *IV* + *I* + *III* + *III* + *III* and Clusters in DH system, local and global CO₂ emissions, system cost and net income for the Visby DH system.

L Case 2 168.4	Case 3 167.6
168.4	167.6
143.4	143.0
3.6	3.4
0.3	0.3
34.9	29.9
637.3	546.0
2311	2388
,	143.4 3.6 0.3 34.9 637.3 2311

Table 13. DH production, biomass/bio oil supply and electricity used in the DH system, local and global CO_2 emissions, system cost and net income for the Visby DH system for all cases.

Table 14. DH production, biomass/bio oil supply and electricity used in the DH system, local and global CO_2 emissions, system cost and net income for the Visby DH system after cost-optimal energy renovation of the various building clusters.

DH Production, CO ₂ Emissions, System Cost and Net Income	Case 1	1 Cluster <i>IV</i> Clusters <i>IV</i> + <i>I</i>		Clusters IV + I + III	Clusters IV + I + III + II	
DH (GWh/year)	184.6	175.7	171.4	169.3	168.4	
Energy supply (GWh/year)						
Biomass	149.7	146.4	144.6	144	143.4	
Electricity	7.2	5.1	4.2	3.8	3.6	
Bio oil	0.6	0.5	0.4	0.4	0.33	
Local CO _{2 eq.} emissions (ton/year)	1667	1630	1610	1600	1596	
Global CO _{2 eq.} emissions (ton/year)	8648	6606	5718	5285	5203	
System cost (MSEK)	726.7	675.5	653.6	640.8	637.3	
Net income DH system (MSEK)	2505	2400	2347	2323	2311	

Cost-optimal energy renovation when targeting LCC optimum (Case 2) and Swedish building regulations (Case 3) affects the performance of the DH system in Visby. As shown in Table 13, biomass heat-only boilers generate the largest part of the DH in all the studied cases. Heat pump and bio oil boilers, as well as landfill gas, supply additional heat during the year in the all studied cases. The largest overall change in terms of environmental performance and system cost of the DH system compared to before energy renovation occurs in Case 3, where DH production by the utilities biomass, bio oil heat-only boilers and heat pumps decrease the most compared with all other cases. The electricity used in the DH system, in this case, is 3.4 GWh/year. The corresponding figures for biomass and bio oil supply are 143.0 GWh and 0.3 GWh, respectively. The system cost is reduced the most in Case 3, calculated at 9.9 MSEK/year because of the reduced fuel supply and the use of electricity, as shown in Table 13. The system cost in Case 2 is 34.9 MSEK/year compared to 39.8 MSEK/year before energy renovation. When considering the net income of the DH system, it can be seen that the net income is decreased from 2505 MSEK (Case 1) to between 2311 MSEK (Case 2) and 2388 MSEK (Case 3), due to less DH sold to end-users.

The result of cost-optimal energy renovation when targeting LCC optimum (Case 2) in the various clusters compared with Case 1 shows that selecting cost-optimal EEMs in Clusters IV + I + III + II decreases the system cost the most compared to the other alternatives presented in Table 14, i.e., separately energy renovating each cluster ranging from the cluster with the highest energy savings to the cluster with the lowest energy savings. The system cost is decreased by 51.2 MSEK, 73.1 MSEK, 85.9 MSEK and 89.4 MSEK over a period of 50 years when renovating Cluster *IV*, Clusters *IV* + *I* + *III* and Clusters *IV* + *I* + *III* + *III*, respectively. However, as stated in the section above, a result of renovating the various clusters less DH is sold to end-users, and the revenue is decreased. The net income of the DH system is 2505 MSEK in Case 1, and 2400 MSEK, 2347 MSEK, 2323 MSEK and 2311 MSEK when energy renovating Cluster *IV*, Clusters *IV* + *I* + *III* + *III* and Clusters *IV* + *I* + *III* + *III* and Clusters *IV* + *I* + *III* and Clusters *IV* + *I* + *III* and Clusters *IV* + *I* + *III* + *III* and Clusters *IV* + *I* + *III* + *III* and 2400 MSEK, 2347 MSEK, 2323 MSEK and 2311 MSEK when energy renovating Cluster *IV*, Clusters *IV* + *I* + *III* and Clusters *IV* + *I* + *III* and Clusters *IV* + *I* + *III* + *III* + *III* + *III* + *III* and Clusters *IV* + *I* + *III* + *III* + *III* and Clusters *IV* + *I* + *III* + *III* + *III* + *III* and Clusters *IV* + *I* + *III* + *III* + *III* + *III* and Clusters *IV* + *I* + *III* + *III* + *III* + *III* + *III* + *III* and Clusters *IV* + *I* + *III* + *III* + *III* + *III* + *III* + *III* and Clusters *IV* + *I* + *III* + *III* + *III* + *III* + *III* and Clusters *IV* + *I* + *III* +

By calculating the revenue for the sold DH and the system cost, as well as LCC and energy use for the various clusters, it is possible to predict the overall outcome of cost-optimal renovation of a historic district in Visby in terms of economics and environmental impact. The LCC for the district and the net income for the DH system over the course of 50 years, as well as annual figures for primary energy use and local and global CO_2 emissions, are presented in Figure 11. The net income is 2388 MSEK for the DH system when renovating according to Swedish energy targets (Case 3) compared to the 2311 MSEK at the cost-optimum point (Case 2), which is due to the decrease in electricity use. It is important to mention that the revenue for the DH system is decreased for both Case 2 and Case 3 compared to Case 1 by 194 MSEK and 117 MSEK, respectively. This is because less DH is sold to the end-users. The sold DH to end-users generates an income of 3232 MSEK, 2948 MSEK and 2934 MSEK over a period of 50 years in Case 1, Case 2 and Case 3, respectively. However, there are significant environmental benefits from the suggested renovations. Regarding local and global CO₂ emissions, Case 3 corresponds to the lowest emissions of all investigated cases as a result of the largest decrease in used and supplied fuel in the DH system. Local and global CO_{2eq.} emissions are calculated at 1592 metric ton/year (4% decrease compared to Case 1) and 4921 metric ton/year (43% decrease compared to Case 1), respectively. The primary annual energy use in the city decreases by 5.0 GWh and 5.2 GWh for Case 2 and Case 3, respectively, compared to before renovation (57.2 GWh), which corresponds to a 9% decrease. A reduction in CO₂ emissions, due to decreased heat load is supported by earlier research findings, e.g., [9,10].



Figure 11. Summary of the LCC for the district and the net income for the DH system over the course of 50 years, as well as annual primary energy use and local and global CO₂ emissions.

There are several interesting aspects to study in future work. When analyzing the effects on the local DH system from the energy renovation of a historic district, it is important to be aware of the time-dependent behavior of the energy systems. This includes larger populations living in cities, resulting in higher resource utilization [44], and expected higher outdoor temperature. A larger population in Visby will most likely increase the heat load of the DH system, due to more buildings being connected to the local energy systems. However, as an effect of global warming, higher outdoor temperatures will occur, resulting in a lower heat load in the DH system. As shown by Shen et al. [45], global climate change also affects the optimal energy renovation strategy for a building and varies depending on location. Other factors that can influence the operation of the DH system include changes in fuel prices, for both the DH and competing for heating supply systems, as well as technology development and CO₂ on fossil fuels [46]. The aforementioned factors are all of interest to study in future work. Concerning the replicability of the results to other cities and energy systems, the authors would like to point out that it is difficult to generalize the effects of cost-optimal energy renovation. This is due to the fact that each building district is unique in terms of dynamic behaviour, and the operation strategy, as well as the fuel mix of the DH system. Hence, the authors recommend performing separate case studies on various local DH systems in cold climate to quantify economic and environmental indicators using the proposed approach. Moreover, another aspect of interest to study is the economic and environmental effects of the expansion to a CHP system. This is especially the case since there is an ongoing process of electrifying the buildings, transport and industry sectors.

6. Conclusions

The majority of the research investigations in the field of building LCC optimization have tended to focus on the building owners' perspective. This includes financial gains and improving buildings' environmental performance as a result of cost-optimal energy renovation. However, a connection exists between the energy renovation of DH heated buildings and the performance of the DH system. There is currently a knowledge gap regarding the effects on the local DH system in terms of profitability and environmental performance from cost-optimal energy renovation of a building district. This research proposes a systematic approach to study the effects on DH system of the above-mentioned parameters from cost-optimal energy renovation of a building district. The study object consists of 920 buildings located in Visby, Sweden, divided into twelve building types and four building clusters. Three different cases are included in the study: Case 1 = no EEMs on the building envelope corresponding to the reference case, Case 2 = LCC optimum (the cost-optimum point) and Case 3 = energy renovation according to Swedish building regulations, BBR.

The results of this study show that by using the proposed approach, it is possible to predict the effects of cost-optimal building renovation concerning economics and environmental performance on the local DH system. In terms of economics, it is revealed that suggested energy renovations in the historic district correspond to financial gains by 186–218 MSEK (23–27%). However, cost-optimal renovation of the historic district decreases the revenue of the DH system by 117–194 MSEK (5–8%), due to less DH sold to end-users. There is, on the other hand, a clear connection between building renovation and decreased local and global CO₂ emissions, due to decreased use and supply of fuel, which confirms the findings of previous research within the field. This is especially true when carrying out energy renovation according to BBR, resulting in local and global decreases of 75 metric ton of CO_{2eq} /year (4%) and 3727 metric ton of CO_{2eq} /year (43%), respectively. Concerning the effects of building renovation of the various clusters in the district, it is seen that the total heated area of each cluster is highly significant, as well as the current thermal performance. Cost-optimal renovation with no preset energy target (Case 2) corresponds to a decrease in energy use of 13.8 GWh (57%) and financial gains of 178 MSEK (28%) for Cluster I and Cluster IV, where the two clusters are characterized by overall low thermal performance and represent 76% of the total heated area in the studied district. Meanwhile, the corresponding figures for Cluster II and Cluster III are 3.2 GWh (47%) and 40 MSEK (22%). Lastly, the suggested renovation strategies are unique to each building type, due to differences

in layout and construction. However, the suggested measures for the buildings in each cluster are rather similar because building properties are comparable to a high degree. This can be exemplified through the selection of 24–36 cm floor insulation in Cluster *I* and Cluster *III* because of a high *U*-value and the selection of inside insulation of the external walls with 20 cm in Cluster *I* and Cluster *III* at the cost-optimum point, which is also explained by the initially poor thermal performance of the external walls.

Author Contributions: B.M. was the project leader. S.A. was responsible for the optimizations performed in energy system optimization software MODEST and helped with writing the paper connected to the MODEST results. V.M. performed and analyzed the optimization and simulation procedures in OPERA-MILP and IDA ICE, and wrote the paper. B.M. contributed with valuable advice and revision of the manuscript. All authors have read and agreed to the published version of the manuscript.

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