Homeowners' Decisions Towards Energy Renovations - Critical Stages and Sources of Information

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Abstract. The European Commission aims to decrease GHG emissions to 80% below 1990 levels by 2050 (EU, 2017). The housing stock has a considerable share that equals to 40% of energy consumption and 36% of emissions in the EU. The current research aims to evaluate the homeowners' energy renovation decisions on the exterior, interior, and insulation/installation of their house. The householders' renovation decisions are analyzed with regards to (1) which stages to help/support and (2) what information is essential in the renovation process. Considering the extent of difficulty for private homeowners' in accessing information and complexity in conducting the renovation, transaction cost (TC) theory is applied in understanding the decisions. The data has been collected through a survey among 3,776 of the Dutch homeowners in 2012. Then, statistical and logistic regression analysis has been conducted to analyze the renovation decisions for two groups of homeowners: renovators and potential renovators. According to the results and the outcomes of this study: (1) For the renovators: (a) the main identified stages in getting help are in carrying out the renovation, determining the costs, and looking for the reliable professional/ contractor, (b) the main identified sources of information are at the maintenance/ installation companies, family/ friends, and via internet; (2) For the potential renovators: (a) the main identified help stages are in determining the costs, looking for a reliable professional and carrying out the renovation/ improvement, (b) the main identified sources of information are via the internet, by a maintenance/ installation companies, and family/ friends. The main difference among the renovators is for insulation/ installation. The most significant stage in getting help for insulation/installation is to find out the most efficient solutions. Similar results have been found for the potential renovators; the only difference was in the order of the influencing factors.

1 Introduction

The housing stock has a considerable share in energy consumption¹. In the Netherlands, the owner-occupied sector takes a significant share of 69.4% of the building stock. In Europe, the energy label system is used to measure the performance of the building stock. In the Netherlands, the energy label D is the average for the Dutch owner-occupied sector²⁻⁴. Considering a high share of housing and relatively low average energy label, the owner-occupied sector in the Netherlands has a high potential in reducing the energy consumption in the housing stock. It is, therefore, chosen as the focus of our paper.

The aim of renovations by the households is to improve the conditions of the house or to make it more comfortable^{5,6}. However, there are barriers in the renovation process which affect the willingness in investing and renovating by the households⁷. For instance, homeowners cannot easily finance the energy renovation investment, and the process is very complicated. In the Netherlands, the private banking system supports the householders in the renovation by providing mortgages more than the house values. However, the complexities in getting the loans/ subsidies might hinder the homeowners from applying. Additionally, there are uncertainties in the expected benefits of energy efficiency renovations compared to the mortgage costs⁸.

In a renovation process, different stages have hidden costs that are not taken into account but affect their faith in renovation decision. For instance, in an early stage, householders have to spend time and resources in

evaluating the costs and benefits of the renovation. In this paper, a specific type of barriers- transaction costs, is investigated. In any transaction with an external party, some hidden costs exist that the institutional economist called it the 'Transaction Cost (TC)'. The elements that cause the TC are asset specificity, uncertainty, and frequencies. By increasing the asset specificity and uncertainty, the TC escalates^{7,9-11}.

In this paper, the aim is to address the homeowners' transaction cost barriers at different stages of a renovation process. Logistic regression is conducted to examine the importance of TCs barriers quantitatively, between two target groups of householders: the renovators and potential renovators. By energy renovations, we refer to any improvement or significant changes in three different parts of the house; exterior, interior, and insulation and installation.

Section 2 reviews the literature on transaction costs. Section 3 describes the methodology and database of the survey. Sections 4 and 5 present subsequently the results of the analyses, and conclusions.

2 Theoretical Background

The literature on the TCs are reviewed from homeowners' and other stakeholders' perspectives, then the TCs typology and measurement indicators are aligned along the renovation process. Theoretical framework including the renovation stages and related TCs are developed for empirical analysis.

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1.1 State-of-the-art

1.1.1 Definition

TC means any unavoidable indirect cost in a transaction that negatively affects the consumers' decision¹². It is a sub-category of 'hidden costs' that have not been adequately considered in the cost analysis and consisting of a search for information, negotiating and monitoring costs.¹³ Three main elements cause the transaction costs: (a) asset specificity: TC can be created whether an asset is allocated for a specific purpose. In case of renovation, the asset specificity can be explained for both human and physical assets. The example of a physical asset is an investment in specific technologies/measurements, and the human asset is the essential skills/knowledge for a renovation, (b) uncertainty: any opportunistic behavior/asymmetric information affects the confidence/ trust/ certainty in making a decision. In renovation decision, two main types of uncertainties exist uncertainty in the expected benefits and opportunistic behavior of other actors, and (c) frequency: the element is related to the uncertainty. By experiencing the renovation and doing more renovation, uncertainties will reduce¹⁴.

1.1.2 Initial research on TCs

New institutional economics have applied TC theories in explaining the behavior of market agents mainly through imperfect and asymmetric information. The main and starting point in the TC studies focus on the organization and enterprise level of analysis^{15,16}. The studies focus on different aspects, (a) in the planning phases, such as searching for information¹⁷, (b) in the executing phase, controlling, and enforcing¹⁶, (c) and overall activities^{18,19}. The current study follows the last category of the literature and considers the TCs of the overall activities in the renovation process.

1.1.3 Householders' perspective

Few studies have investigated the TC from householders' perspectives in the renovation processes²⁰. Some literature has analyzed the homeowners' TC, not for the renovation decision, but other activities, such as the impact of transaction cost on more stay in a particular house²¹. The second group has partly considered the TCs along with other influencing factors⁷, and not much research on the householders' TC for the renovation process. Among them, some researchers aim to quantify the TC. For instance, Bjorkqvist and Wene (1993)²⁰ estimated the TC in changing the heating system equal to 18 hours for Swedish single family dwellings (13-28% of the predicted investment cost). The authors have defined the TC as a time spent in each decision stage. To quantify the TC have aroused some critics due to unclear time allocation for a specific activity.

1.1.4 Insights from other actors' perspectives

Mundaca et al. (2013)¹⁰ have reviewed TCs comprehensively from investors/project developers' perspectives. The assumption is that agents have bounded rationality¹ and do not have access to complete information. In their article, the authors developed a taxonomy for TCs consisting of five types of costs: search for information costs, negotiation costs, approval and certification costs, monitoring and verification costs, and trading costs. Besides, the authors explained a list of factors in the implementation and operation of low-carbon technologies that are influencing the nature and scale of TCs. Endogenous factors, such as the size and complexity of the project, the high number of intermediaries, and fewer experiences in doing a project might increase the TC. Finally, an interesting finding of their research is that the sources and estimates of TCs are specific to the cases and circumstances.

Qian et al. (2014)²² developed a TC framework from the real estate developers' and householders' perspective. The aim was to study the reluctance of the market to invest in energy efficiency measures. The authors concluded that TCs are the main factors hindering building energy efficiency market penetration. Another research done by Qian et al. (2015)²³, assumed the individual stakeholders steadfastly guard their interests in any investment decisions. The authors investigated the extra TCs affecting the willingness of the stakeholders to take part in green investment. The findings manifested that the choice between developers and end-users over investing in green building is a complex game problem, where TC could be conceptualized and showed their essential role. By minimizing the TCs incurred in the complex decision, it will not only be beneficial to the stakeholders involved but also bring net regenerative outcomes to society.

1.1.5 Measurement indicators of TC

In a renovation and from householders' perspective, TC can be categorized into the following three aspects:

- (a) Time and effort in finding information/ knowledge/ experts/ financial support, etc. The householders are usually not educated with knowledge of technology, construction measures or financial schemes. Therefore, there is a need to find a way to the trustworthy source of information themselves, or access to the experts²⁴⁻²⁷;
- (b) Complexity in a renovation process, such as the cognitive burden of making complex and irreversible decisions, or complexity in implementing the renovation⁷;

¹ Bounded rationality has two blades; cognitive limitation of an agent and environment structure around the agent³⁴.

- (c) Disruption in the ordinary life and likely hassle factor during the renovation; and
- (d) Time and effort in finding a reliable information/expert.

TCs is higher in the presence of imperfect and asymmetric information since the householders might pay higher prices to access reliable information/ professional²⁸. Finally, the barriers related to the TC might lead to a non-optimal investment of a renovation process.

1.2 Conceptual framework

A renovation consists of different stages including considering phase (understanding the needs, information searching and pre-evaluating), planning, finalizing the decision, executing, and experiencing (post-evaluating)²⁹. In considering phase, the critical influencing factors are socioeconomic factors, such as age, education, and income. In the planning phase, awareness of the benefits can persuade homeowners to renovate. Consequently, he householders need to investigate different aspects, such as different stages that they encounter for a specific type of renovation, or necessary permits for a renovation that they might need to acquire^{11,27,30}. Additionally, before making a decision, it is essential to have information about the energy-saving measures. After decision-making and implementing the renovations, the experiences are circulated through social networks of the householders. This circulation of information also influences the future renovation for other householders³¹. Table 1 explains the TC in different stages of renovation processes.

Table 1. Transaction costs in different stages of a renovation based on the literature review

Stage	a) Considering	b) Planning
TC	• Time and effort to determine the costs and benefits of renovation • Time and effort to determine the available ESMs • Time and effort to determine the appropriate ESMs	• Time and effort to get the essential permit for renovation • Time and effort to find the stages in renovation • Time and effort in finding people who share the experiences • Time and effort for planning
TC Element	• Asset specificity • Uncertainty	• Asset specificity in knowledge and skills • Uncertainty in planning

Stage	c) Decision	d) Executing
TC	• Time and effort to find reliable professional and experts • Time and effort to find subsidies/ benefits	• Mess and nuisance during the renovation • Uncertainty in doing by myself/contractors

TC Element	Asset specificity in physical assets and knowledge and skills	Asset specificity in knowledge and skills

Stage	e) Experiencing
TC	Time and effort in finding the next steps in the renovation
TC Element	Asset specificity in knowledge and skills

2 Methodology

2.1 Survey and database

A survey has been conducted among 3,776 homeowners in the Netherlands. The questionnaire contains three sections: a) households features and b) buildings features, c) the renovation in the exterior, interior, and insulation and installation. The homeowners answered if they have done/ planned a renovation in the last/next two years.

2.2 Method of Analysis

The importance of getting help in different stages of renovation decisions and the sources of information are investigated using the logistic regression. In the analysis, the dependent variable is the renovation decision and binary. There are some assumptions in conducting logistic regressions, including binary dependent variable, not having multicollinearity between independent variables and large sample size. We have tested all these assumptions, and the assumptions have been verified. The Variance Inflation Factors (VIF) are conducted to test the multicollinearity among independent variables. The VIF = 2.5 is the initial point of concern and VIF greater than 10 shows multicollinearity³².

$$\text{Log} \frac{P(\text{renovation})}{1 - P(\text{renovation})} =$$

$$X_{\text{Socio-demographic variables}} + X_{\text{Drivers}} + X_{\text{Barriers}}$$

(1)

Where P is the probability of the events, and X represents independent variables. After estimation, the model is validated by the Omnibus tests of model coefficients and the Hosmer and Lemeshow test. The Omnibus test demonstrates whether the model predicts the outcome with the explanatory variables better than without³³. The Omnibus tests are statistically significant, and the models are validated. The Hosmer and Lemeshow test indicate the goodness of fit. This test should not be significant to represent a good model which were not significant in our regressions.

3 Results

In this part, the results of the regression analysis are presented. The important stages and sources of information of renovators and potential renovators are explained in the tables of each subsection. Table 2 shows the list of TCs factors in the regression analysis. The socio-demographic factors are also included in the regression analysis.

Table 2. Critical stages and sources of information (independent variables)

Stages	Sources of information
(1) Determining if the house maintenance is good enough, (2) Planning the work, (3) Determining the costs, (4) Finding funding/ financing, (5) Finding a good professional/ contractor, (6) Carrying out the renovation/ improvement, making a more energy-efficient house, and Performing the work (the householders).	(1) Maintenance/ installation company (2) Family/friends (3) Internet (4) Construction store / DIY (5) Municipality

3.1 Critical stages and sources of information in the exterior part of a building

Based on the analysis, the critical stages are similar for the renovators and potential renovators. The regression analyses are presented in For the potential renovators, the significant stages in help acquisition of potential renovators are whether they are planning to do the work and finding a reliable professional/ contractor. The respondents that have indicated asking information from family and friends are more likely to do a renovation (Table 4).

Table 4. Logistic regression on exterior renovation decision in the next 2 years (potential renovators)

	B	S.E.	Wald	Sig.
Age group			6.219	0.045
Age group(45-64)	-0.799	0.755	1.121	0.290
Age group(65-105)	-1.472	0.685	4.624	0.032
Score - Wood and paint outside	-0.470	0.139	11.435	0.001
Score - Isolation of the ground floor	-0.192	0.097	3.933	0.047
Score - Foundation	0.238	0.124	3.692	0.055
Help - In planning the work	-0.686	0.411	2.781	0.095
Help - In finding a good professional / contractor	0.767	0.392	3.819	0.051
Information - From family / friends	-0.760	0.392	3.762	0.052
Additional driver? - Reduce the transfer tax				
if more energy efficient within a year of purchase.	0.844	0.386	4.785	0.029
Constant	5.392	1.617	11.119	0.001

. For the renovators, the significant stages on help acquisitions are when the renovators have done the work and looked for a reliable professional/ contractor. The significant sources of information are at the maintenance/ installation companies and via the internet.

Table 3. Logistic regression on exterior renovation decision in the last 2 years (renovators)

Y	B	S.E.	Wald	Sig.	Exp(B)
Age	-0.013	0.007	3.740	0.053	0.987
Education			11.968	0.018	
education(1)	-1.306	0.633	4.255	0.039	0.271
education(2)	-0.569	0.335	2.886	0.089	0.566
education(3)	-0.295	0.327	0.81	0.368	0.745
education(4)	0.216	0.38	0.325	0.569	1.242
Average net monthly income of households	0.294	0.111	7.025	0.008	1.341
Help - In performing the work (yourself)	0.615	0.225	7.437	0.006	1.849
Help - In finding a good professional/ contractor	0.396	0.193	4.220	0.040	1.486
Information - via an internet page	-0.497	0.19	6.853	0.009	0.608
Information - at a maintenance/ installation company	0.442	0.178	6.187	0.013	1.556
Score - Roof construction & roof covering	-0.128	0.069	3.403	0.065	0.88
Score - Glass insulation	-0.217	0.069	9.917	0.002	0.805
Score - Wood and paint outside	0.32	0.063	25.471	0.000	1.378
Score - Foundation	0.154	0.066	5.51	0.019	1.167
Hot water - Heating system - Block heating	0.271	0.127	4.587	0.032	1.312
Constant	-0.431	0.858	0.253	0.615	0.65

For the potential renovators, the significant stages in help acquisition of potential renovators are whether they are planning to do the work and finding a reliable professional/ contractor. The respondents that have indicated asking information from family and friends are more likely to do a renovation (Table 4).

Table 4. Logistic regression on exterior renovation decision in the next 2 years (potential renovators)

	B	S.E.	Wald	Sig.	Exp(B)
Age group			6.219	0.045	
Age group(45-64)	-0.799	0.755	1.121	0.290	0.450
Age group(65-105)	-1.472	0.685	4.624	0.032	0.229
Score - Wood and paint outside	-0.470	0.139	11.435	0.001	0.625
Score - Isolation of the ground floor	-0.192	0.097	3.933	0.047	0.825
Score - Foundation	0.238	0.124	3.692	0.055	1.268
Help - In planning the work	-0.686	0.411	2.781	0.095	0.504
Help - In finding a good professional / contractor	0.767	0.392	3.819	0.051	2.153
Information - From family / friends	-0.760	0.392	3.762	0.052	0.468
Additional driver? - Reduce the transfer tax					
if more energy efficient within a year of purchase.	0.844	0.386	4.785	0.029	2.326
Constant	5.392	1.617	11.119	0.001	219.615

3.2 Critical stages and sources of information in the interior type of renovation

For the renovators, the significance stage in help acquisition is on determining the costs of renovation/ improvement. The respondents that indicate a construction store/ Do-It-Yourself (DIY) companies, and the internet as a reliable source of information are more likely to renovate (Table 5).

Table 5. Logistic regression on the interior renovation in the last 2 years (renovators)

Y	B	S.E.	Wald	Sig.	Exp(B)
Age	-0.013	0.007	3.919	0.048	0.987
Number of people			10.781	0.029	
number of people(1)	0.306	0.203	2.281	0.131	1.358
number of people(2)	0.649	0.312	4.331	0.037	1.913
number of people(3)	0.954	0.335	8.130	0.004	2.596
number of people(4)	0.746	0.486	2.357	0.125	2.108
Help - In determining the costs	-0.590	0.180	10.787	0.001	0.555
Information - Via an internet page	0.784	0.205	14.599	0.000	2.190
Information - With family / friends	0.642	0.191	11.350	0.001	1.901
Information - At a construction store / DIY	1.138	0.342	11.047	0.001	3.119
Information - At a maintenance/ installation company	0.594	0.183	10.498	0.001	1.810
Score - Toilet and bathroom	0.106	0.062	2.949	0.086	1.112
Constant	-0.117	0.600	0.038	0.845	0.889

For the potential renovator, the significant stages in help acquisition are in determining the best way to perform the

renovation, making the renovation more energy efficient, and finding a reliable professional/ contractor. The significant sources of information are via the internet, from family/ friends, and by a construction store/ DIY company (Table 6).

Table 6. Logistic regression on the planned interior renovation decision in the next 2 years (potential renovators)

Y	B	S.E.	Wald	Sig.	Exp(B)
Typew(1)	1.107	0.332	11.139	0.001	3.025
Education			7.949	0.093	
education(1)	-2.125	1.135	3.501	0.061	0.119
education(2)	-0.029	0.614	0.002	0.962	0.971
education(3)	-0.342	0.557	0.377	0.539	0.710
education(4)	-0.915	0.583	2.464	0.116	0.400
Bouwjaar			6.482	0.090	
bouwjaar(45-70)	0.921	0.499	3.407	0.065	2.511
bouwjaar(71-90)	-0.074	0.410	0.032	0.858	0.929
bouwjaar(>91)	-0.276	0.452	0.372	0.542	0.759
Hot water - Heating system - Ordinary combi boiler	-0.688	0.349	3.897	0.048	0.503
Help - In determining how they can best carry out the renovation / improvement	0.612	0.318	3.716	0.054	1.845
Help - In determining how they can make the house more energy-efficient	-1.280	0.334	14.668	0.000	0.278
Help - When finding a good professional / contractor	-1.080	0.331	10.670	0.001	0.340
- Via an internet page	0.572	0.335	2.915	0.088	1.772
Information - From family / friends	0.889	0.322	7.616	0.006	2.432
Information - At a construction store / do it yourself shop	1.604	0.534	9.022	0.003	4.971
Score - Interior - Paint, wallpaper and tile work	-0.443	0.160	7.643	0.006	0.642
Score - Interior - Heating	-0.332	0.149	4.963	0.026	0.718
Score - Interior - Electricity	0.284	0.150	3.565	0.059	1.328
Constant	4.668	1.475	10.009	0.002	106.456

3.3 Critical stages and sources of information in the insulation and installation type of renovation

For the renovator, the significant stages in help acquisition are in making the house more energy-efficient, planning the work, and finding funding/ financing options. The respondents that indicate a construction store / Do-It-Yourself Company and a maintenance/ installation company a reliable source of information is more likely to renovate (Table 7).

Table 7. Logistic regression on insulation - installation renovation decision in the last 2 years

Y	B	S.E.	Wald	Sig.	Exp(B)
Help - In determining how they can make the house more energy-efficient	1.48	0.20	55.27	0.00	4.41
Help - In planning the work	-0.31	0.17	3.50	0.06	0.73
Help - In finding funding - financing options	0.57	0.31	3.38	0.07	1.77
Information - at a construction store / DIY	-0.37	0.21	3.18	0.07	0.69
Information - at a maintenance or installation company	0.40	0.16	6.30	0.01	1.48
Average net monthly income of households	-0.25	0.09	7.07	0.01	0.78
Hot water - Heating system - HR - Combi Boiler	0.37	0.08	19.83	0.00	1.45
Constant	0.19	0.40	0.22	0.64	1.21

For the potential renovators, the significant stages in help acquisitions are in making the house more energy efficient, the best way to carrying out the renovation/ improvement, and in finding funding/ financing options. The identified sources of information are via the internet, maintenance/ installation companies and family and friends (Table 8).

Table 8. Logistic regression on the planned insulation-installation renovation decision in the next 2 years

Y	B	S.E.	Wald	Sig.	Exp(B)
Average net monthly income of households	-0.282	0.156	3.255	0.071	0.755
Number of people			9.705	0.046	
number of people(1)	0.609	0.298	4.165	0.041	1.838
number of people(2)	0.750	0.395	3.609	0.057	2.117
number of people(3)	0.950	0.405	5.510	0.019	2.586
number of people(4)	1.430	0.562	6.468	0.011	4.178
Help - In determining how they can make the house more energy-efficient	0.862	0.257	11.258	0.001	2.369
Help - In determining how they can best carry out the renovation/ improvement	-0.735	0.229	10.292	0.001	0.479
Help - In finding funding or financing options	0.511	0.260	3.857	0.050	1.667
Score - Ease of use and comfort of the house- Heat insulation of the house	-0.174	0.073	5.717	0.017	0.840
Constant	1.769	0.741	5.695	0.017	5.867

4 Conclusion

This study contributes to evaluating the transaction cost barriers in a renovation process from the householders' perspectives. An empirical analysis of Dutch homeowners has been conducted based on the survey among 3,776 households. Based on the theory, the asset specificity, uncertainty, and frequency determine the TC. Transaction costs slow down or sometimes prevent the renovation. There are different stages in the renovation which have different TCs. In the beginning, the asset specificity is essential, and in later stages, the uncertainties in the renovation process are critical, such as asymmetric information between the homeowners and contractors. The TC decrease when the homeowners experience the renovation. Based on the regression analysis, the significance of TC of different types of renovation is examined for the homeowners. The main identified conclusions are as follow:

- For the renovators, the main identified stages in getting help are in carrying out the renovation, determining the costs, and looking for the reliable professional/ contractor. The primary identified sources of information are at the maintenance/ installation companies, family/ friends, and via the internet.
- For the potential renovators, the main identified help stages are in determining the costs, looking for a reliable professional and carrying out the renovation/ improvement. The primary identified sources of information are via the internet, by maintenance/ installation companies, and family/ friends.
- The main difference between different types of renovation is for insulation/ installation. The main significant stage in getting help for insulation/installation is to find out how to make the house more energy efficient. For the potential renovators, the similar results have been achieved; the only difference was on the order of the influencing factors.

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