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Authors: Barbara Breitschopf, Uta Burghard

No. S05/2023

#### Imprint

# Energy transition: financial participation and preferred design elements of German citizens

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### Abstract

This paper investigates the relation between financial participation and preferences for design elements as well as attitudes towards the energy transition. The design elements are used to characterise dimensions of the energy transition. Based on a survey of more than 1000 German citizens, we find significant differences in attitudes and preferences for design elements of the energy transition between respondents who financially participate and those that do not. We further learn that energy justice is important, but is less supported in case that subsidies of disadvantaged consumers lead to higher burdens for the remaining society.

**Keywords**: energy transition, financial participation, preferences, design elements, dimensions, socio-demographic factors

# Contents

1	Introduction	5
2	Conceptual and methodological approach	7
2.1	Central concepts of the study: financial participation and dimensions of the energy transition	
2.1.1	Financial participation	7
2.1.2	Dimensions of the energy transition	7
2.2	Data collection and survey design	9
2.3	Operationalisation of research questions in the survey	9
2.3.1	Financial participation	10
2.3.2	Attitudes towards the energy transition	10
2.3.3	Dimensions characterised by design elements	11
2.3.4	Relevance of dimensions	12
2.4	Data base and sample description	13
2.5	Data analysis	13
2.5.1	Group comparison tests	13
2.5.2	Cluster analysis	14
2.5.3	Verification of the cluster solutions and comparison tests	16
3	Results	17
3.1	Descriptive results	17
3.1.1	Attitudes towards the energy transition	17
3.1.2	Financial participation in the energy transition	19
3.1.3	Perceived dimensions characterised by design elements of the energy transition	22
3.1.4	Relevance of dimensions and financial participation	
3.2	Preference patterns	36
4	Discussion and Conclusion	41
5	List of Figures	43
6	List of Tables	45
A.1	Survey	46
A.1.1	Quota	46
A.1.2	Questionnaire	47
A.2	Results	58
A.2.1	Sample description	58
A.2.2	Dendrograms	60
A.2.3	Clusters characterised by means – design preferences	63
7	Bibliography	71

#### 1 Introduction

The energy system as a socio-technical system is transforming towards a sustainable energy system, i.e. towards a green, clean or a low-carbon energy system (Tian et al. 2022; Johnstone et al. 2020) to mitigate climate change. The energy transition (ET) is characterised by its differing dynamics, guiding objectives, motivations, actions, policies and pathways and further aspects. According to the German Environmental Agency (UBA 2020) and the Federal Ministry of Economic Affairs and Climate (BMWK 2023), the motivations of the ET are grounded on the provision of sustainable, low-carbon, efficient, affordable and secure energy. It comprises a bundle of activities in several areas such as energy efficiency, renewable energies, nuclear and fossil fuel phase-out, grid extension and enforcement, smart grid and energy storage and negative emissions which are called for by academics as well (Leopoldina et al. 2023; Fraunhofer CINES 2020). Recently, additional actions such as sector coupling including flexibility (Johansen 2022; Reiner Lemoine Institut 2019), and decentralised generation and consumption structures (Maiwald and Schuette 2021) are further important features of the German energy transition (Reiner Lemoine Institut 2019; Fraunhofer CINES 2020).

The European Commission has published the Energy Union strategy (European Commission 2015) aiming at building an energy union that provides secure, sustainable, competitive and affordable energy to all energy consumers. It includes actions in five dimensions: decarbonisation including renewable deployment, energy efficiency, internal energy market (in the EU), energy security, innovation and competitiveness. It also aims at a fair and inclusive energy transition that empowers citizens. At the political level, a mix of different policies such as long-term strategies and targets, regulations and policy instruments including financial (dis)incentives are envisaged to promote the energy transition (Cárdenas Rodríguez et al. 2015; Kitzing et al. 2012; UBA 2020; European Commission 2022b).

Several studies, e.g. Ruddat and Sonnberger (2015), Baur et al. (2022), Wolf et al. (2021) analyse the societal acceptance of the energy transition in general, or of local projects. However, no study looks into the perception and acceptance of specific design elements of the energy transition. Design elements have an impact on how the energy transition is perceived, implemented and understood, i.e. they characterise the energy transition. A bundle of selected design element that address a specific area of the energy transition is called dimension. Thus, design elements characterise the dimensions of the energy transition. For example, design elements on burden sharing address distributional and justice aspects. Design elements addressing the costs of the energy transition reflect the cost dimension. Elements with respect to security of energy supply refer either to the dimension independency with a focus on imports, or reliability if the focus is on internal reliable supply. Policy aspects are captured by the dimension action with design elements encompassing targets and strategies, or measures comprising instruments. Several authors look into the relationship of acceptance and financial participation in the context of the energy transition. There is evidence that participation of residents or communities in renewable energy (RE) projects can increase local acceptance of wind energy projects (Langer et al. 2018; Liebe et al. 2017; Lienhoop 2018; Musall and Kuik 2011; Warren and McFadyen 2010; Breitschopf et al. 2022). They found a positive relation between these factors. However, there is no evidence regarding the link between financial participation and preferred design elements of the energy transition.

Since a broad acceptance of the energy transition is key for a sustainable transition, we work out how such a broadly accepted energy transition could look like. Thus, this research aims at better understanding, which design elements of the energy transition are preferred more and which ones less by citizens and whether and how these preferences are linked to socio-economic or demographic features, to general attitudes towards the energy transition and to financial participation of citizens in the energy transition.

We do this by means of a survey among the German population that includes socio-demographic questions but also questions regarding the attitudes towards the energy transition and the acceptance of selected design elements of the energy transition that are bundled by their link to the respective dimensions.

In the next section, we outline our conceptual and methodological approach. In Section 3, we present the results of the study and the paper concludes with a discussion of our findings in Section 4.

## 2 **Conceptual and methodological approach**

We use an online survey to collect data on German citizens' attitudes towards the energy transition, their form of financial participation and their preferences regarding different design elements of the energy transition. The aim of the survey is threefold:

- 1) To understand which design elements of the energy transition are preferred by citizens.
- 2) To analyse whether citizens' perception of or preferences for certain design elements are linked to financial participation in the energy transition.
- 3) To analyse whether citizens' perception of or preferences for certain design elements are linked to socio-demographic features.

In this section, we describe the central concept of the study, method of data collection, operationalisation of the research approach, sample description and methods of data analysis.

# 2.1 Central concepts of the study: financial participation and dimensions of the energy transition

## 2.1.1 Financial participation

We define financial participation in the energy transition as material-financial participation (Radtke and Renn 2019) where citizens spend money to invest in a renewable energy project (Holstenkamp and Radtke 2018). Thus, they have fixed assets or shares in fixed assets in the area of energy generation, or e-mobility. This includes investments in decarbonisation of heating (e.g. heat pumps) or own electricity generation with a small roof-top PV plant, membership in energy cooperatives or holding shares in solar or wind power parks or investment funds, as well as owning electric vehicles. Small investments, such as purchasing efficient light bulbs in the area of energy efficiency for example, are not taken into account here.

## 2.1.2 Dimensions of the energy transition

In line with the objectives of the Energy Union, a key element of the European Green Deal is the supply of clean affordable and secure energy to all. Renewable energy plays an essential role for providing clean energy, while energy efficiency is key for actually achieving a high share in clean energy. Further, sector integration through smart infrastructure accounting for flexible generation and consumption is another element. Overall, this should come at minimum costs and social fairness (European Commission 2021, 2019). In light of the energy crisis, the European Commission has stressed the significance of energy savings for a secure energy supply, including energy efficiency and behavioural changes (European Commission 2021, 2022a). The strategies and objectives of the German Federal Ministry of Economic Affairs and Climate Actions with respect to the energy transition are in line with those of the European Commission. Key pillars of the energy transition are energy efficiency in buildings and industrial processes, use of renewable energies, smart infrastructure to increase flexible demand and supply of electricity and phasing out of nuclear power and coal (BMWi 2021b). The implementation of the measures such as use of renewable energies, increasing flexibility in energy supply and demand through sector coupling as well as their impacts e.g. on energy prices, economy and environment are monitored on regular basis on behalf of the European Commission or federal government (BMWi 2021a).

Further, we take into account the findings of workshops combined with a survey on perceived effects of the energy transition, as presented in Burghard et al. (2021) as well as the outcome of

scenario workshops as depicted in Dönitz et al. (2023), The scenario developed with the help of the workshop emphasizes the desire for a strong participation and self-supply versus another scenario pointing to an indifference combined with the desire of a low-cost energy supply. The workshop and survey revealed that the dynamics of the energy transition, the environmental effects and the increasing energy costs in financial terms as well as additional burdens for citizens were issues for all participants - whether they participate financially in the energy transition or not. Moreover, renewable energies are seen as an important element, with active participation advocated predominantly by the participating group. In summary, there was overall agreement on the necessity of the energy transition.

Based on the European and German policy mix regarding the energy transition and its implementations as well as the expressed desires and concerns of citizens in the framework of the workshop, we have detected design elements that we sort into the seven dimensions. These dimensions are identified as significant and important for the energy transition as they stand for overall objectives and areas of the energy transition. They encompass financial, security, political, social and societal aspects to implement the energy transition (see Section 2.3). For example, the dimension distribution encompasses four design elements for "burden sharing" based on different principles of sharing: burden sharing on the basis of energy consumption, or burden sharing with reliefs for energy poor supported by the state or by all consumers, burden sharing with support for energy intensive industries. The dimensions are:

<ul> <li><b>1 Distribution</b></li> <li>• social aspects , justice</li> <li>• fairness and competitiveness</li> </ul>	<ul> <li>2 Independency</li> <li>secure energy supply not depending on imports from abroad</li> </ul>	<ul> <li>3 Reliability</li> <li>• affordability and autonomy of households</li> <li>• security aspects regarding prices and energy consumption</li> </ul>
<ul> <li>4 Actions</li> <li>implementation of ET via strategies and targets e.g. renewable energy deployment, efficiency, flexibility</li> </ul>	<ul> <li>5 Measures</li> <li>• policy instruments promoting the ET</li> </ul>	6 Investors <ul> <li>key actors for energy supply</li> </ul>
	<b>7 Cheap/low cost</b> energy transition and trade- off with other aspects	

#### Figure 1: Dimensions of the energy transition (ET) defined by their design elements

1) **Distribution** of burdens aims at understanding which type of burden sharing with respect to the additional costs of the energy transition is preferred, and, thus, includes social, justice, competitiveness and fairness aspects (distribution)

2) **Independency** suggests a secure energy supply not depending on imports from abroad. The term abroad refers either to the EU or to all countries that are not part of the EU (independency)

3) **Reliability** includes the notion of affordability and autonomy of households and covers financial (prices) as well as reliable energy consumption (reliability)

4) **Actions** refer to how the energy transition should be implemented, namely deploying renewable energies, energy efficiency, flexibility and sufficiency and includes policy aspects (strategy and targets) with regard to the implementation of the energy transition (actions)

5) Measures refers to types of policy instruments promoting the energy transition (measures)

6) **Investors** refers to key actors that should play a key role in society with respect to energy supply and includes a societal dimensions (investors)

7) **Cheap or low cost energy transition** represents the notion low cost versus a transition accounting for environmental, security, climate and participatory aspects potentially entailing higher costs (cheap cost)

### 2.2 Data collection and survey design

The online survey was conducted in January 2022 in cooperation with a service provider for online polls. A sample of 1095 respondents was selected from an online panel of German citizens based on quotas with respect to socio-demographic features (see Annex A.1.1).

On average, respondents took 10 minutes to complete the questionnaire, which comprised in total 12 main questions that included sub-questions or statements. The questions covered the seven dimensions that are characterised by their design elements of the energy transition, different forms of financial participation in the energy transition, respondents' motivations to financially participate in the energy transition or not, as well as the perception of the energy transition. In addition, nine questions on socio-demographic data were included in the questionnaire. When using statements, we asked the respondents to agree or disagree on a 5-point Likert scale. The questionnaire is attached in Annex A.1.2.

## 2.3 Operationalisation of research questions in the survey

The questionnaire (Annex A.1.2) encompassed ten questions regarding **socio-demographic** features such as

- sex (male (0), female (1), diverse (2)),
- age groups (age) ranging from 1 to 6 (18-30 years (1), 31-40 years (2), 41-50 years (3), 51-60 years (4), 61-70 years (5)), beyond 70 years (6),
- education levels (edu) ranging from 1 to 3 (low level (1) elementary and primary school, no completed vocational training; medium level (2) secondary school, completed vocational training; high level (3) baccalaureate, university degree),
- residential location (location) encompassing 4 categories from 0 to 3 (rural <= 5000 inhabitants (0), small town between > 5000 and 20000 inhabitants (1), medium town between > 20000 and 100000 inhabitants (2), city with > 100000 inhabitants (3)),
- type and ownership of housing (dwelling) with five categories ranging from 0 to 4 (own house (0) or flat (1), rented house (2) or flat (3), other (4)),
- employment status (job) (employed (0), student (1), pensioner (2), housewife/man (3), unemployed (4), others (5)),
- household type (household) encompassing 6 categories (single (0), with partner (1), with partner and child (2), with child(ren) (3), others (4), flat sharing (5)),
- number of persons living in the household (persons) ranging (between 1, 2, 3 and >= 4 persons,
- and federal states of Germany (state), in total 16 states.

# 2.3.1 Financial participation

Financial participation is captured by the following question:

Do you or your household use or invest in one or more of the following options?

- Small PV plant on the rooftop or a solar module at the balcony (PV plant)
- Holding a share in a wind or PV solar park or green investment fund (shares)
- Member in an energy cooperative (membership)
- Having an electric car (e-car)
- Heating with heat pump, wood, pellet or biogas burner (RE heat)

For the analysis, we create three types of variables for financially participating persons:

- 1. "re\_consump" comprising the participation through having an e-car or heating system that is based on renewable energy sources,
- 2. "re\_electric" comprising all options of financial participation that generate renewable electricity (share, membership, PV plant), and
- 3. "re\_invest" including all participation options of "re\_consump" and "re\_electric".

In addition, we asked to indicate the main reasons for financial participation and non-participation. The following questions are included, and possible answers are rated on a five-point Likert scale from 1 'fully agree' to 5 'fully disagree'.

- 1) What are your reasons for investment in one of these options?
- Economic reasons: return from the PV, or savings of energy expenditures
- Contribution to ET
- Peers
- Information through installer
- Autonomy
- 2) What are the reasons not to invest in one of these options?
- Too expensive
- No financial benefit
- No installer or adviser
- No technical know-how or no time
- No interest to invest
- Nor opportunity to invest a small amount
- Not my job

## 2.3.2 Attitudes towards the energy transition

**Attitudes** are captured by four questions addressing perception of and interest in the energy transition. The attitudes of citizens towards the energy transition are a proxy for how strongly citizens accept or refuse the energy transition. Based on publications assessing the acceptance of the energy transition in Germany, we have included the following statements in our survey:

- 1. "We need a consistent switch to renewable energies, even if it requires a lot of investment. " This is based on Sonnberger and Ruddat (2016) and Ruddat and Sonnberger (2019) and the variable is called "renewables".
- 2. "The expansion of renewable energies should be slowed down" is based on Sonnberger and Ruddat (2016) and Ruddat and Sonnberger (2019). We call the variable "slow-down", or with an inverted scale "slowing".

- 3. "I see the energy transition as positive for society" is also based on Sonnberger and Ruddat (2016) and Ruddat and Sonnberger (2019), but adjusted (wenn die EW umgesetzt wird, werden kommende Generationen davon profitieren). This variable is called "positive ET"
- 4. "I would like to deal with the energy transition as little as possible" relies on Sonnberger and Ruddat (2016) but is adjusted (ich bin sehr am Thema EW interessiert). This variable is simply expressed by the notion "no interest", or with an inverted scale "interest".

The respondents could indicate on a five-point Likert scale whether they fully (dis)agree, partly (dis)agree, or are indifferent (neither nor).

### 2.3.3 Dimensions characterised by design elements

Finally, the remaining questions focus on the identified seven **dimensions of the energy transition** (see Section 2.1.2). We asked the following questions per dimension and provided a set of potential answers (design elements of the dimensions):

- **Dimension 1: Distribution**: How should the costs arising from the energy transition be distributed across different actors such as well-off and energy poor citizens, SMEs, energy intensive companies? Based on literature findings on cost sharing approaches (Grave et al. 2015) (Pahle et al. 2021) (Groh and Ziegler 2018) the following design elements are identified:
  - Consumption: each energy consumer pays according to its consumption.
  - Social status: each energy consumer pays according to its consumption, but energy poor (social groups with low income) receive a financial support by the state.
  - Social all: each energy consumer pays according to its consumption, but energy poor (social groups with low income) pay less, and the remaining energy consumers compensate this support and pay a bit more.
  - Industry exemption: each energy consumer pays according to its consumption, but energy intensive companies pay less to remain competitive, and the other energy consumers compensate this support and pay a bit more.
- **Dimension 2: Independency**: *Which options contribute to an increasing import independency?* In the light of the war in Ukraine, reducing the dependency on fossil fuels by accelerating Europe's clean energy transition has gained in significance (European Commission 2022a). The design elements include:
  - Low EU imports: low energy imports from EU countries
  - Low global imports: low energy imports from countries outside the EU
  - Generation & storage: self-consumption by households (prosumer)
  - Networks: well-connected EU internal energy networks
- **Dimension 3: Reliability**: Which of the following options are important to ensure a reliable energy supply? For example, the high share of volatile renewables in electricity generation might endanger a reliable power supply (La Mata Pérez et al. 2019). The design elements are:
  - Backups: potentially expensive back-ups in generation
  - Storages: potentially expensive storages
  - Low volatility: low price volatility of energy prices
  - Self-supply electricity: self-generation of electricity by households
  - Self-supply heat: self-generation of heat by households
  - DHC: Connection to a district heating system
- **Dimension 4: Actions**: *How should we achieve the energy transition in Germany?* This dimension refers to the different activities or elements the energy transition is based upon. The design elements comprise the following actions:

- Renewables: deployment of renewable energies
- Efficiency: investments in energy efficiency
- Flexibility: adjustment of electricity consumption to the availability of renewable electricity
- Sufficiency: reducing electricity consumption through behavioral adjustments
- **Dimension 5: Measures**: Which policy measures should the government apply to promote the energy transition? Based on a policy typology (Bemelmans-Videc et al. 2006), the suggested measures are:
  - Regulation: introduction of regulations or standards e.g. in buildings
  - Prohibitions: prohibitions to use certain types of fossil energy carriers
  - Information: informing and appealing to save and use clean energy
  - Costs: higher prices for fossil fuels (e.g. through taxes) to make them more expensive
- **Dimension 6: Investors**: *Who should mainly invest in solar or wind power parks?* A sustainable and secure energy system requires huge investments in energy generation, consumption and infrastructures (McCollum et al. 2018), and across all sectors such as the industry, energy, building, mobility and agricultural sector. These involve different actors from industry, politics and society (BMWK 2023; BMWi 2021b, 2015). Therefore, we include the following design elements:
  - National firms or utilities
  - Municipal utilities
  - International firms or utilities
  - Cooperatives or citizens' communities
  - Green investment funds
  - Citizens with small roof-top PV plants
  - Municipalities as shareholders
- **Dimension 7: Cheap costs (trade-off)**: *How should the government further push the energy transition? Should it focus on cost efficiency only or also on other objectives?* This question addresses the priorities of citizens regarding costs, versus sustainable energy use and secure energy supply, e.g. investigated by Motz (2021). The following design elements are suggested:
  - Cheap: the energy transition should be achieved at lowest costs, e.g. as cheap as possible.
  - Cheap\_secure: as cheap as possible but it could cost a bit more if energy supply becomes more secure.
  - Cheap\_volatile: as cheap as possible but it could cost a bit more if energy prices become less volatile.
  - Cheap\_landscape: as cheap as possible but it could cost a bit more if energy supply does not impact too much the landscape.
  - Cheap\_participation: as cheap as possible but it could cost a bit more if many citizens could participate in the energy transition through memberships in cooperatives, shares in wind power parks or investments in small roof-top PV plants.
  - Cheap\_dynamics: as cheap as possible but it could cost a bit more if the energy transition gains momentum.

### 2.3.4 Relevance of dimensions

Regarding the "dimensions" we did not ask the respondents to express their rating or agreement regarding the dimension, in general. Instead, we have their agreement or disagreement with each suggested design element of the dimension. This means, within a dimension each design element could be rated by the same (dis)agreement level. By taking the average rating per dimension of each respondent, we see which dimensions represented by the selected design characteristics

receive the highest and the lowest rating. We derive from these ratings the perceived importance or relevance of the different dimensions of the energy transition.

#### 2.4 Data base and sample description

The data was cleaned by deleting cases with more than 75% missing values in the questions on attitudes, financial participation and design elements, as well as by deleting cases with extreme positive or negative or average response tendency in the questions concerning the design elements. Finally, a 10% quartile for speeders and a 5% quartile for slow replies were applied. The final data set consisted of 887 cases.

The sample is comparable with respect to age (> 18 years), gender, home ownership (residents living in own dwelling) and education of individuals to the population in Germany.

Overview on socio-demographic characteristics of the sample

				•	
Variable	Obs	Mean	Std. Dev.	Min	Max
sex	887	.5028185	.5002741	0	1
age	887	3.414882	1.578397	1	6
edu	887	2.121759	.721212	1	3
dwelling	887	2.059752	1.303682	0	4
household	887	1.155581	1.244641	0	5
location	887	1.782413	1.114751	0	3
job	887	1.163472	1.387341	0	4
persons	259	2.498069	.8908428	1	4

The socio-demographic variables are depicted in Table 1 and Annex A.2.1.

The socio-demographic variables are depicted in Table T and Annex A.2.1.

Source: own calculation

Table 1:

## 2.5 Data analysis

The data was analysed with the software STATA. In a first step, we conduct a descriptive analysis to see whether any dimension is preferred to other dimensions, or whether a design element within a dimension is preferred to any other characteristic of the same dimension. This descriptive analysis relies on means or shares of the "dimension-variables". Further, we conduct group comparisons to test whether different socio-demographic groups, e.g. age groups, levels of education, sex, residential location, ownership and type of house (dwelling) or financially participating and not participating citizens, differ in their attitudes or preferences with respect to the dimensions of the energy transition. Finally, we employ a cluster analysis to identify different groups according to their preference patterns. The preference pattern displays different preferences for design elements within each dimension by identified socio-demographic characteristics.

### 2.5.1 Group comparison tests

We apply tests for differences between groups that are formed based on their financial participation and socio-demographic characteristics. The analysed groups are independent from each other and are not interrelated (Kühnel and Krebs 2012). The variables used for grouping have either nominal (e.g. financial participation) or ordinal (attitudes, dimensions) scale points. We use the chi2 test for group comparisons based on nominal variables. The effect size is calculated with Cramer's V (StataCorp. 2015), where large effects are >0.5 and very small effects <0.1 (Hedges 2008). Regarding attitudes or dimensions of the energy transition, we treat them as metric variables as they have at least five ordinal scale points (Urban and Mayerl 2018). We apply the non-parametric Mann-Whitney U test. It tests whether the two groups or samples come from the same population regardless of distribution and equal variances (Nachar 2008).<sup>1</sup> When comparing more than two groups, we apply the Kruskal-Wallis test, a generalisation of the Mann-Whitney U test. It tests whether the different samples come from the same population, i.e. the distribution of the variable is the same for all the groups, and under the alternative hypothesis at least two of the samples differ regarding the distribution of the variable of interest (Wollschläger 2020). To depict the effect size, we use Cohen's d<sup>2</sup>. This statistics indicates a small effect with a value of at least .10, of at least .30 a medium effect and of at least .50 a large effect (Cohen 1988).

### 2.5.2 Cluster analysis

To uncover groups in data and better understand large data sets, we conduct cluster analysis. It is applied in many disciplines, such as medicine, biology or economics. For example, in market research a cluster analysis groups a large group of consumers by their preferences for certain products (Everitt et al. 2011). Clustering is feasible with variables or cases, e.g. respondents (Bacher et al. 2022). Thus, we classify respondents into groups that reveal similar specified characteristics or patterns in their preferences for the listed design elements within each dimension of the energy transition. The scale of our data (characteristics) are ordinal data of a five-point Likert scale, which could be treated as continuous or categorical data. We use the design elements of each dimension as variables for clustering at the dimension level: distribution, independency, reliability, actions, measures, costs and investors. This means, with seven dimensions we conduct seven cluster analyses based on the respective design elements.

There exists a large variety of clustering methods. First, we apply a hierarchical cluster analysis with dissimilarity measures. We use the single linkage agglomeration method, which is suited to identify outliers (Bacher et al. 2022). The number of outliers differs between dimensions (4 to 23 outliers). They are subsequently excluded. In the next analysis step, we apply the Ward's method as it keeps the variance between the groups low and has proved to result in well suited clusters (Backhaus et al. 2016). The Ward's linkage approach provides clusters depicted in a dendrogram. Further, we include stopping rules of Calinski and Harabasz (1974) for hierarchical and non-hierarchical cluster analysis, and of Duda (Duda et al. 2001), which is only for hierarchical cluster analysis. This is a kind of distinction analysis. It shows how heterogeneous the clusters are among themselves, and how homogeneous the respective cluster itself is. It is conducted for each cluster solution to analytically determine the appropriate number of clusters (see Everitt et al. (2011), Milligan and Cooper (1985)). Larger values indicate a more distinct clustering. In addition, we use the dendrogram option to visualise potential clusters. This is a common approach for hierarchical cluster analyses such as the Ward's method to determine the number of clusters (Backhaus et al. 2016). Besides these technical aspects, we also account for the number of attribute levels that a socio-economic or demographic variable could take, e.g. levels of education, age group.

The resulting number of clusters per dimension is then applied in the k-means cluster approach together with the stopping rule based on Calinskis and Harabasz (1974) to see how distinct the different numbers of clusters are to each other. The k-means is one of the most well-known partitioning clustering methods (García-Escudero et al. 2010), can be applied to metric or ordinal

<sup>&</sup>lt;sup>1</sup> In case of different variances, it only tests whether there is an equal probability that a randomly selected observation of one group is bigger or smaller than a randomly selected observation of the other group (Sachs & Hedderich, 2006, p. 392; Wollschläger, 2020, p. 465).

<sup>&</sup>lt;sup>2</sup> Cohen's d statistics: a value of at least .10 indicates a small effect, of at least .30 a medium effect and at least .50 a large effect.

data (Backhaus et al. 2016), is independent from the order of the data (Madhulatha 2012) and provides replicable results under a given initial seed set of cluster centres. For the purpose of replication, we select the initial seed value from more than 20 runs of k-means analyses with different initial values (ranging from two to eight digits) that reveals the highest Calinskis and Harabasz stopping rule for each dimension. To avoid a negative impact of single outlying data points in the k-means approach, outliers are excluded based on the single linkage method as in the wards cluster analysis.

The results of the Ward's and k-means cluster analyses are verified with multivariate test statistics<sup>3</sup> as outlined in the next section. Since the Ward's and k-means cluster analysis rely on two different cluster algorithms, the resulting clusters with more than two clusters differ in their composition. Clusters of the Ward's approach are hierarchical, i.e. two or more sub-clusters k can be added to a parent cluster at a higher hierarchical level. This means, the starting point is a cluster for each respondent. Then the clusters are grouped to a larger group based on smallest dissimilarity between groups until k = 1. Each respondent remains in the assigned group, which will be merged with another group afterwards with increasing hierarchy. For example, for k = 3 two of the clusters under k = 4 are merged into one cluster, while the other two clusters remain unchanged. In contrast, the clusters of a k-means analysis cannot be merged as for each clustering level the group membership is recalculated. This recalculation is based on the lowest dissimilarity (Eukldian distance measure). This means, that respondents will be assigned to new groups for each k.

In this study, we apply both clustering approaches. We obtain very similar results for k = 2 with both approaches. Since k-means is considered as a very robust approach, we employ the results of the k-means clustering for analyses of difference (Section 3.2) while we use the results of the Ward's approach to depict the potentially feasible number of clusters by dendrograms illustrating the dissimilarity (Euclidian squared distance measure) at the horizontal line in Annex A.2.1.

Since classification is not a scientific theory where the results might be "true" or "false", but represent a step towards further analyses, the clusters should be judged largely on their usefulness for the specific research context (Everitt et al. 2011). Therefore, we employ two approaches for the selection of the number of k:

- the analytical approach (see section 2.5.2) that suggests in our case two clusters for most of the dimensions,
- the usefulness: the clustering approach serves the purpose to identify for each dimension different bundles of ratings for the respective design elements and describe them by their socio-demographic features. We call these different bundles of ratings preference patterns. For example, cluster A reveals low ratings of all four selected design elements, cluster B a high rating of all. In contrast, cluster C reveals high ratings for two design elements and a low one for the other two, while cluster D's preference pattern is just the other way round. Ideally, the clusters can be described by the respective attribute levels of the socio-demographic features (if significance level is p < .1), e.g. respondents of cluster A living in flats in a rural area without financial participation and age 40 to 50 while cluster D reveals similar attribute levels, but the respondents are mainly of age > 60. Thus, is makes sense to link the number of clusters to the number of the categories (attribute levels) per design element.

<sup>&</sup>lt;sup>3</sup> The following assumptions are met: variable measures at a continuous level (5-level Likert scale); categorical variable for groups (e.g. clusters); independence of observation (different respondents in each group or cluster); no significant outliers (given by the data itself); approximately normally distributed dimension variables; homogeneity of variances. In case of two groups

### 2.5.3 Verification of the cluster solutions and comparison tests

The cluster analysis is based on the design elements. The results are verified with multivariate statistics such as Wilk's lambda and Lawley-Hoteling trace (StataCorp. 2015) for each dimension of the energy transition.<sup>4</sup> In addition, the non-parametric Kruskal-Wallis test shows whether there is a difference between at least one of the clusters regarding the dependent clustering variables (i.e. the respective design elements per dimension). Moreover, to identify specific characteristics per cluster, we run pairwise comparison tests to reveal which groups differ from each other with respect to socio-demographic features and financial participation. As mean comparisons mostly assume normality and equal variance, we also run non-parametric tests for different combinations of cluster groups. The analysis is conducted in STATA.

<sup>&</sup>lt;sup>4</sup> The following assumptions are met: variable measures at a continuous level (5-level Likert scale); categorical variable for groups (e.g. cluster, sex, participation); independence of observation (different respondents in each group or cluster); no significant outliers (given by the data itself); approximately normally distributed dimension variables; homogeneity of variances.

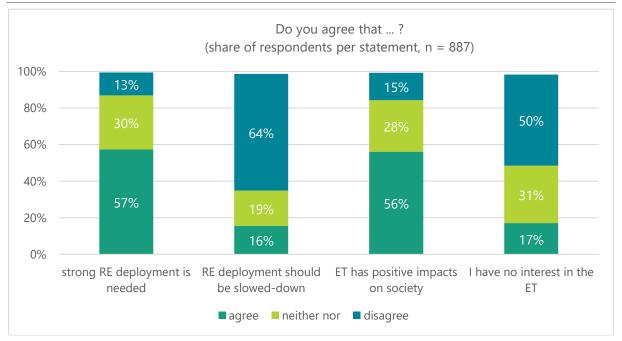
### 3 Results

### 3.1 Descriptive results

In the following sections, we depict the descriptive results for attitudes, financial participation, design elements and dimensions. For illustrative purposes, the scales 'fully (dis)agree' and 'partly (dis)agree' are summarised to agree and disagree, respectively in all descriptive figures indicating shares of agreement or disagreement apart from the dimension "investors".

### 3.1.1 Attitudes towards the energy transition

For the purpose of illustration, we employ a 3-scale classification of the replies in Figure 2, while the cluster analysis is conducted with five scales of (dis)agreements. The majority of the respondents agree to a strong RE deployment (renewables) and consider the ET as positive for society (positive\_et), and disagree to a slow-down of RE deployment (slowing). The correlation of these three questions is above |0.5| (p < .05), while the answers to the question "I have no interest in the ET" correlates with the other three less strongly (correlation < |0.5| with a level of significance of p < .05). For the following analyses, we employ two of these attitudes, namely "renewables" and having "no interest".



# Figure 2: Attitudes with respect to renewable energy (RE) deployment and the energy transition (ET)

Note: since a few respondents indicated to have no opinion, the shares do not exactly sum up to 100% Source: own calculation

The means of the variables are depicted in Table 2; the main differences between sociodemographic groups are given in Table 3.

Statistics	Renewable deployment	Slowing down	Positive impacts on society	No interest		
N	882	874	878	869		
Mean	2.300	3.808	2.417	3.472		
CV	0.488	0.322	0.467	0.329		
Min	1	1	1	1		
Мах	5	5	5	5		

# Table 2:Descriptive statistics of attitudes with respect to renewable energy (RE)deployment and the energy transition (ET)

Source: own calculation; CV: Coefficient of variation (sd/mean)

When testing for differences between different groups based on socio-demographic characteristics, we reversed the coding of the variable "no-interest" into "interest" to make it comparable to the variable "renewables". We describe the findings in Table 3. It displays only those differences by socio-demographic features that are significant (at least at the level of p < 0.1).

	Strong RE deployment is needed (renewables)	Having a high interest in the ET (interest)			
Age groups	Age group 1 (18-30 years) displays the strongest agreement to RE deployment. Comparison of groups: • age group 1 (strongest agreement) to age group 2 (31-40 years)**, Cohen's d: 0.21 • differences between other age groups are not significant at p< 0.05 level	<ul> <li>Age group 1 displays the strongest interest, followed by age group 6 (older than 70 years). Comparison of groups:</li> <li>age group 1 (strongest interest) to age group 2 ***, Cohen's d: 0.39</li> <li>age group 6 to age group 3 (41-50 years) and 4 (51-60 years) is significant at the level of at least p&lt; 0.05</li> <li>age group 1 to age group 6 is not significant, to all other groups (5,4,3,2) it is significant at the level of at least p&lt; 0.05</li> <li>Differences between other age groups are not significant at 0.05 level</li> </ul>			
Education level	<ul> <li>The higher the education level (edu), the stronger the agreement to RE deployment. Comparison of groups:</li> <li>edu 1 (low level of education) to edu 2 (medium level of education)*, Cohen's d: 0.15</li> </ul>	<ul> <li>The higher the education level (edu), the stronger the interest. Comparison of groups:</li> <li>edu 1 to edu 2 *, Cohen's d: 0.17</li> <li>edu 2 to edu 3 ***, Cohen's d: 0.33</li> </ul>			

# Table 3:Description of differences in agreement to RE deployment or interest in the<br/>ET by socio-demographic characteristics and financial participation

	Strong RE deployment is needed (renewables)	Having a high interest in the ET (interest)
	• edu 2 to edu 3 (high level of education) ***, Cohen's d: 0.33	
Type and ownership of housing (dwelling)	No significant differences between house types or ownership	Respondents living in a rented flat (3) display the lowest interest. Comparison of groups:
		<ul> <li>dwelling 2 (rented house) to dwelling 3 (rented flat)*, Cohen's d: 0.28</li> <li>all other groups display no significant difference at the 0.05 level</li> </ul>
Residential location	<ul> <li>Agreement to RE deployment increases from rural (0) to urban (3) areas. Comparison of groups</li> <li>location 0 to location 3 ***, Cohen's d: 0.26</li> <li>differences between other locations not significant at 0.05 level</li> </ul>	No significant differences between rural and urban areas
Employment status (job)	<ul> <li>Students (1) display the highest agreement to RE deployment: Comparison of groups:</li> <li>job 1 to job 0 (employed) ***, Cohen's d: 0.34</li> <li>Differences between other</li> </ul>	<ul> <li>Students (1) display the highest interest in the ET, unemployed (4) the least: Comparison of groups:</li> <li>job 1 to job 0 ***, Cohen's d: 0.39</li> <li>job 4 to job 0 ***, Cohen's d: 0.42</li> <li>Differences between other</li> </ul>
	employment groups are not significant at 0.05 level	employment groups are also significant at 0.05 level
financial participation	Respondents who financially participate display a high agreement to RE deployment at the 0.001 level and a medium to large size effect:	Respondents who financially participate display a high interest at the 0.001 level and a medium to large size effect:
	<ul> <li>re_invest: Cohen's d: 0.48</li> <li>re_electric: Cohen's d: 0.42</li> <li>re_consump: Cohen's d: 0.35</li> </ul>	<ul> <li>re_invest: Cohen's d: 0.43</li> <li>re_electric: Cohen's d: 0.47</li> <li>re_consump: Cohen's d: 0.30</li> </ul>

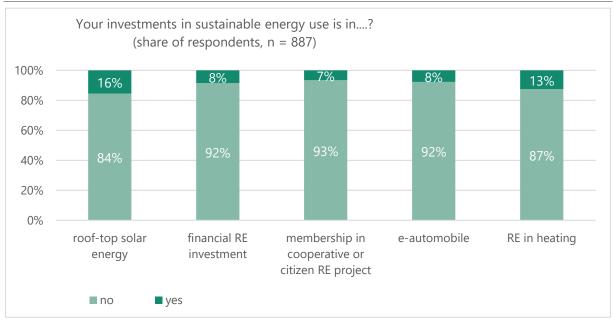
Source: own calculations. Note: significance levels \* = p < 0.1, \*\* = p < 0.05, \*\*\* = p < 0.01.

### 3.1.2 Financial participation in the energy transition

The shares and numbers of respondents who financially participate in the ET (see Section 2.1.1) are depicted in Table 4, while Figure 3 illustrates the different forms of financial participation in detail. Overall, we find that about one quarter of the sample financially participates in one or the other

form, but investments in small PV-roof tops dominate. When looking at the characteristics of respondents that invest we get the following results:

Investments in electricity generation (RE\_electric) is correlated positively to residential location (p < 0.1), ownership and type of dwelling, level of education, employment and age (all with p < 0.01). Respondents in rural areas, as well as those who live in owned houses, tend to have a participation share above average. Moreover, respondents with a high education level and employment or of lower age (age group 1 or 2) also display a participation share above the average. This also applies for "RE\_invest". Regarding "RE\_consump" (definition see Section 2.3.1 or see note in Figure 3) we find that the younger age groups (age group 1 and 2) as well as respondents with a job, or students display an above average share of participation.



#### Figure 3: Forms of financial participation in detail in the sample

Source: own calculation', Note: **RE electric** comprises rooftop solar, financial RE investment and membership; **RE consump** comprises electric vehicles and RE heating; **RE invest** comprises RE electric and RE consump.

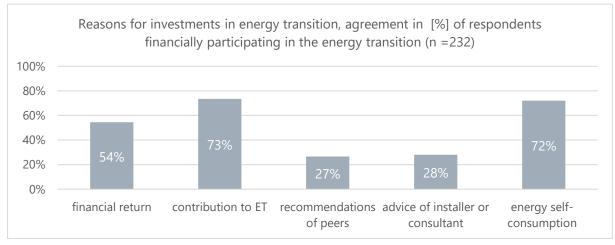
#### Table 4:Frequency of financial participation by types

	RE_invest	RE_electric	RE_consump
Number of participants	232	189	111
Number of non-participants	655	698	776
Shares of participants in %	26.2	21.3	12.5
Shares of non-participants in %	73.8	78.7	87.5

Source: own calculation

The motivations for financially participating in the energy transition are manifold, but dominating motives are contributing to the ET and becoming more independent or autonomous with respect to energy supply and financial aspects (see Figure 4). This question was only addressed to respondents who financially participate.

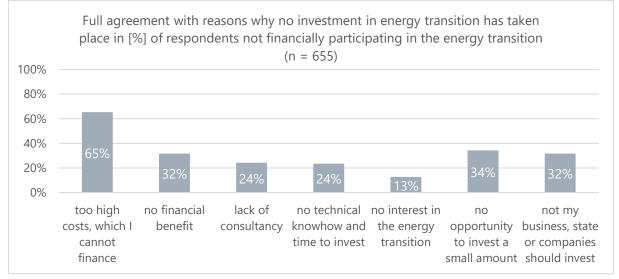
Key barriers to invest in the ET are from the perspective of respondents not financially participating the high costs, followed by a lack of opportunities, or interest or a perceived lack of financial benefits (see Figure 5).





Source: own calculation

#### Figure 5: Reasons to not invest in the energy transition



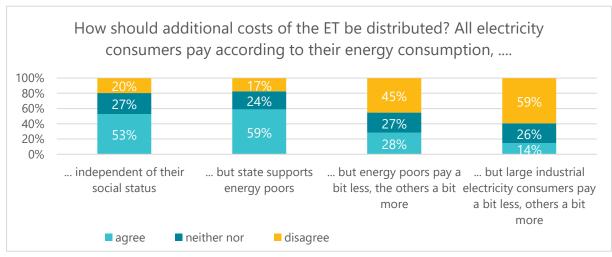
Note: due to data problems with the answer category "partly agree", only the category "fully agree" is depicted here Source: own calculation

Testing for group differences reveals that respondents of age group 1 and 2, or with education level 3, or living in rural areas or couples with at least one child invest significantly more often in the energy transition than the other respective groups (p < .01 for all socio-demographic features). The effect sizes are, however, small. Regarding type of house and ownership, we find that especially owners of houses financially participate more often. This effect is of medium size and significant at the p < .01 level as well.

# 3.1.3 Perceived dimensions characterised by design elements of the energy transition

### 3.1.3.1 Dimension 1: Distribution of costs

The respondents reveal the strongest support for the option that reduces the burden for energy poors through support payments of the state. A simple discharge of energy poors from the costs through higher burdens of the remaining citizens is not supported. Reduced costs for energy intensive industries at the expense of the citizens are refused as well. The second favourite option is that everyone pays according to its energy consumption. The (dis)agreement is depicted in Figure 6, and Table 5 provides a brief statistical description. Significant differences between social-demographic features (groups) are outlined in Table 6.



#### Figure 6: Preferences for distribution of costs

Source: own calculation

#### Table 5:Descriptive statistics of the dimension distribution

Statistics	Based on consumption independent of social status	Social by state support	Social by consumers' support	Industry exemption
N	883	884	884	883
Mean	2.525	2.373	3.233	3.733
CV	0.468	0.507	0.403	0.313
Min	1	1	1	1
Мах	5	5	5	5

Source: own calculation; CV: Coefficient of variation (sd/mean)

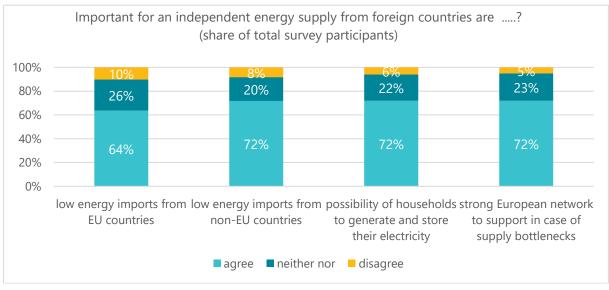
Differences in agreements	Based on consumption	Social by state support	Social by consumers' support	Industry exemption
age		Age group 5 agrees more than age group 1,2,3 (***,Cohen's d 0.39)		
dwelling		House owners agree less than apartment tenants (***,Cohen's d 0.26)		
household	Couples agree more than singles (** , Cohen's d 0.18) or couples with child(ren) (**, Cohen's d 0.19) or singles with child(ren) (***,Cohen's d 0.62)	Singles agree more than couples & persons with child(ren) (*** , Cohen's d 0.18)		
employment		Employees agree less than all other groups (*,Cohen's d 0.29)		
sex	Males agree more than females (***Cohen's d 0.20)		Males agree more than females *** Cohen's d 0.19	Males agree more than females *** Cohen's d 0.23
Financial participation				RE invest*: Cohen's d 0.09

# Table 6:Distribution of significant differences between groups by socio-<br/>demographic features and financial participation

Source: own calculation; Notes: the effect size is Cohen's d; \*  $\alpha < = 0.1$ , \*\*  $\alpha < = 0.05$ , \*\*\*  $\alpha < = 0.01$ ; Social support by burden sharing of all: males agree more than females \*\*\* 0.19

# 3.1.3.2 Dimension 2: Independency from imports

Regarding the independent energy supply from other countries, the majority prefers not to depend on imports from abroad (outside the EU) and supports prosumption and a strong European network to balance bottlenecks. Compared to the other options, the option of low energy imports from the EU elicits least agreement, which means that the respondents consider the internal energy EU market as a potential pillar for an independent energy supply. However, even this option is still agreed to by more than half of the respondents (Figure 7). Table 7 outlines the number of respondents and the mean values. The results of the group comparisons are depicted in Table 8.



#### Figure 7: Preferences for options entailing independency from imports

Source: own calculation

#### Table 7: Descriptive statistics of the dimension independency

Statistics	Low global imports	Low EU imports	Generation & storage by households	Networks
N	884	883	884	883
Mean	1.938	2.1558	1.946	1.961
сѵ	0.5408	0.4838	0.506	0.482
Min	1	1	1	1
Max	5	5	5	5

Source: own calculation; CV: Coefficient of variation (sd/mean)

# Table 8:Dependency: significant differences between groups by socio-demographic<br/>features and financial participation

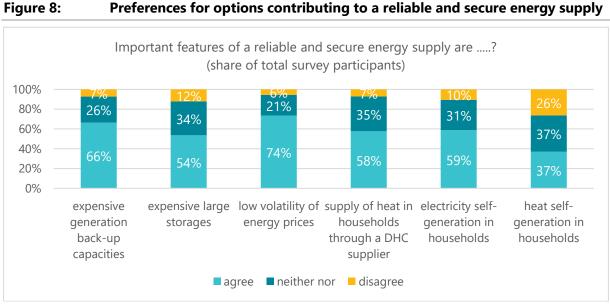
Differences in agreements	low global imports	low EU imports	generation & storage by households	networks
age		Age groups 2, 5 and 6 agree more than age groups 1, 3 and 4 **, (Cohen's d 0.19-0.25)		Agreement increases with age groups, e.g. age group 1 or 2 agrees less than age group 5 (***,Cohen's d 0.37)

Differences in agreements	low global imports	low EU imports	generation & storage by households	networks
dwelling				House owners agree more than apartment tenants <sup>*</sup> , Cohen's d 0.13
education		Edu level 2 agrees more than edu level 1 (**,Cohen's d 0.21) or 3 (***,Cohen's d 0.23)	Edu level 1 agrees less than edu level 2 (**,Cohen's d 0.28) or 3 (***,Cohen's d 0.41)	Edu level 1 agrees less than edu level 2 (**,Cohen's d 0.21) or 3 (***,Cohen's d 0.35)
employment		Employees agree less than pensioners or unemployed (**,Cohen's d 0.15)		Employees agree less than pensioners (***,Cohen's d 0.22)
sex		Males agree more than females (***,Cohen's d 0.17)		Males agree more than females (***,Cohen's d 0.11)
financial participation	RE invest: (***,Cohen' s d 0,21)		RE invest: (***,Cohen's d 0.42)	

Source: own calculation, Notes: the effect size is Cohen's d; \*  $\alpha < = 0.1$ , \*\*  $\alpha <= 0.05$ , \*\*\*  $\alpha <= 0.01$ ;

# 3.1.3.3 Dimension 3: Reliability of energy supply

With respect to a reliable and secure energy supply, the majority considers stable prices as the most important option, followed by expensive back-up capacities. In contrast, relying on self-generated heat seems to be the least preferred option (Table 9 and Figure 8).



Source: own calculation

#### Table 9:Descriptive statistics of the dimension reliability

Statistics	Backups	Storages	District heating	Self-supply electricity	Self-supply heat	Low price volatility
N	885	881	882	881	884	881
Mean	2.134	2.395	2.269	2.261	2.818	1.930
сѵ	0.459	0.4288	0.416	0.460	0.398	0.490
Min	1	1	1	1	1	1
Мах	5	5	5	5	5	5

Source: own calculation; CV: coefficient of variation (sd/mean)

In Table 10, the results of differences by groups are shown for the design options "storages" and "backups" as well as "self-supply of electricity" and "self-supply of heat" in one column, respectively.

Table 10:	Reliability: significant differences between groups by socio-demographic
	features and financial participation

Differences in agreements	Storages <i>or</i> backups	District heating (dhc)	Self-supply electricity <i>or</i> heat	Low price volatility
age		Older age groups display a higher agreement (e.g. age group 2 to 5***, Cohen's d 0.4)		Older age groups display a higher agreement (e.g. age group 2 to 5***, Cohen's d 0.69)
dwelling	Storage: house owners agree more than		Heat: house owners agree more than	

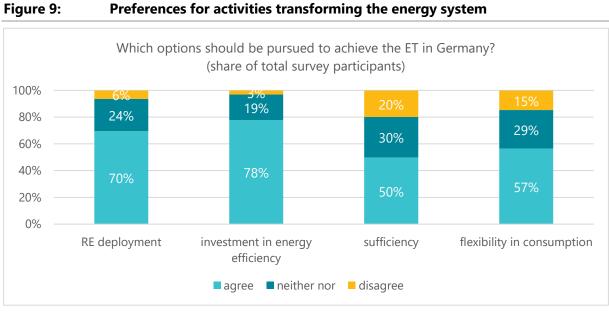
Differences in agreements	Storages <i>or</i> backups	District heating (dhc)	Self-supply electricity <i>or</i> heat	Low price volatility
	tenants (of flats)***, Cohen's d 0.27		tenants (of flats)***, Cohen's d 0.25	
education			Electricity: edu level 3 agrees more than edu level 2 ***, Cohen's d 0.2 or 1*** Cohen's d 0.31	Edu level 2 agrees more than edu level 1***, Cohen's d 0.29 or 3***, Cohen's d 0.25
household size		Singles display highest agreement** (Cohen's d 0.23 between singles and couples with child)	Heat: couples with child(ren) display highest agreement**, e.g. compared to singles Cohen's d 0.25	Singles display the highest agreement**, e.g. compared to couples with children Cohen's d 0.23
employ- ment		Employed display lower agreement than unemployed or pensioners **, Cohen's d 0.17		Employed display lower agreement than unemployed or pensioners ***, Cohen's d 0.36
sex	Storage: males agree more ***, 0.18 Backups: males agree more **, 0.17		Electricity: males agree more*** 0.16	
financial partici- pation	Storage: RE invest agree more **, Cohen's d 0.19		Electricity and Heat: RE invest agree more ***, Cohen's d 0.47 (elect),*** Cohen's d 0,28 (heat)	RE invest agree less **, Cohen's d 0.15

Source: own calculation; Notes: the effect size is Cohen's d; \*  $\alpha < = 0.1$ , \*\*  $\alpha < = 0.05$ , \*\*\*  $\alpha < = 0.01$ ;

self-supply heat: there is a decreasing agreement with increasing urban environment (heat) \*\*\*, effects are very small.;

# 3.1.3.4 Dimension 4: Actions to achieve the targets of the energy transition

When asking which activities or actions the German government should take to advance the ET, investments in energy efficiency received the most support, followed by renewable energy (RE) deployment. The sufficiency option, in contrast, elicits the least support. Statistical descriptions and shares by agreement are given in Table 11 and Figure 9.



Source: own calculation

#### Table 11:Descriptive statistics of the dimension action

Statistics	RE deployment	Efficiency	Flexibility	Sufficiency
Ν	886	887	887	886
Mean	2.039	1.827	2.371	2.530
CV	0.481	0.484	0.459	0.464
Min	1	1	1	1
Мах	5	5	5	5

Source: own calculation; CV: Coefficient of variation (sd/mean)

# Table 12:Action: significant differences between groups by socio-demographic<br/>features and financial participation

Differences in agreements	RE deployment	Efficiency	Flexibility	Sufficiency
age			Age group 5 show higher agreement * than age group 3 and 2, 0.18-0.20	Age groups 5 and 6 show higher agreement** than 1 and 2, Cohen's d 0.22-0.24
dwelling or location	Individuals living in rural location display	Rural location less stronger agreement * or	Significant differences between dwellings-groups**,	

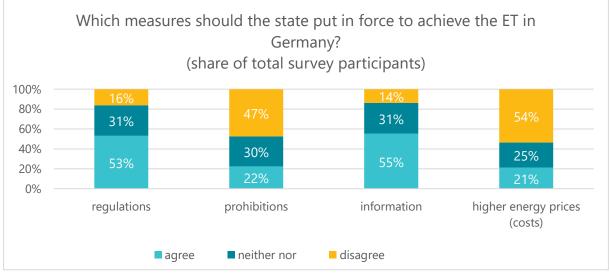
Differences in agreements	RE deployment	Efficiency	Flexibility	Sufficiency
	less agreement * or ***, size effects between Cohen's d 0.13- 0.27		but between the main groups of house owners and apartment tenants the difference is not significant	
education	With increasing edu level stronger agreement * or **, Cohen's d 0.15			
financial participation	RE invest agree***, Cohen's d 0.29		RE invest agree***, Cohen's d 0.19	

Source: own calculation. Note: the effect size is Cohen's d; \*  $\alpha < = 0.1$ , \*\*  $\alpha < = 0.05$ , \*\*\*  $\alpha < = 0.01$ ;

### 3.1.3.5 Dimension 5: Policy measures to support the energy transition

As regards policies, a clear preference is on informing and setting standards while prohibitions and higher prices are strongly refused (see Figure 10 and Table 13).

Figure 10:	Preferences for policy measures supporting the energy transition
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Source: own calculation

Statistics	Regulations	Prohibitions	Information	Costs				
Ν	881	882	882	880				
Mean	2.481	3.402	2.417	3.543				
сѵ	0.467	0.367	0.446	0.360				
Min	1	1	1	1				
Мах	5	5	5	5				

#### Table 13: Descriptive statistics of the dimension measures

Source: own calculation; CV: Coefficient of variation (sd/mean)

# Table 14:Measures: significant differences between groups by socio-demographic<br/>features and financial participation

Differences in agreements	Regulations	Prohibitions	Information	Higher prices (costs)
age	Differences in agreement between age groups*** but no tendency across age groups	Age group 1 and 2 display less disagreement than age groups 4 and 5**, Cohen's d 0.20-0.40		Younger age groups disagree less, e.g. age group 1 and 2 disagree less than age group 4**, 5***, Cohen's d 0.26 – 0.55,
location	Urban location (2, 3) agree more than rural (0, 1)***, Cohen's d 0.29- 0.35	Urban location (2, 3) disagree less than rural (0, 1) **, Cohen's d 0.28- 0.46		Urban location (2, 3) disagree less than rural (0, 1) **, Cohen's d 0.22- 0.39
education	Edu level 3 agree more than edu level 2**, Cohen's d 0.17	Edu level 3 disagree less than edu level 2***, Cohen's d 0.29	Edu level 3 agree more than edu level 2 or 1 ***, Cohen's d 0.24- 0.47	Edu level 3 disagree less than edu level 2 and 1***, Cohen's d 0.31-0.46
employment sex				Employed disagree less than unemployed and pensioners**, Cohen's d 0.16
financial	RE invest agree	RE invest disagree	RE invest agree	RE invest disagree
participation	***, Cohen's d 0.28	less***, Cohen's d 0.28	***, Cohen's d 0.31	less***, Cohen's d 0.37

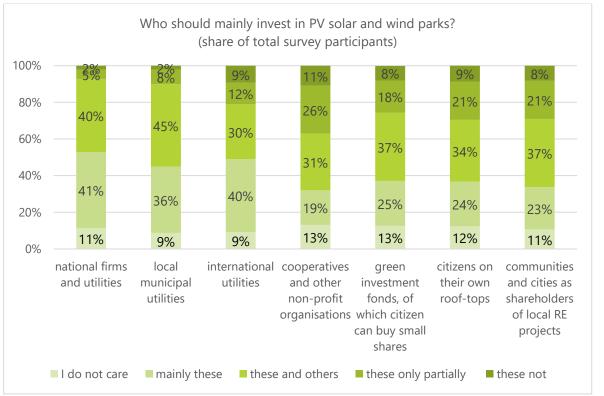
Source: own calculation. Note: the effect size is Cohen's d; \*  $\alpha$  < = 0.1, \*\*  $\alpha$  <= 0.05, \*\*\*  $\alpha$  <= 0.01

## 3.1.3.6 Dimension 6: Investors as actors of the energy transition

This dimension investigates from citizens' perspective, which type of investors should (mainly) invest in the energy transition. The answer categories of this dimension differ from the others and are ordinal variables. The respondents display a weak preference for national firms and utilities, and local municipalities as investors (for both investor types, 81% replied "mainly these" or "these and others") while international utilities received only 70% agreement and a higher rejection rate. In contrast, investors that enable a financial participation of citizens, for example cooperatives or own rooftop installations, are less supported and more rejected than national utilities and local municipalities.

Moreover, we apply Chi<sup>2</sup>-Tests to see whether the replies to the design elements differ between identified groups. We find that

- preferences for the investor types citizens, international firms, and cooperatives are related to financial participation (RE\_electric) at a significance level of p < .001, and investment fonds at p < .05. The statistical tests suggest that respondents who financially participate tend to prefer more strongly citizens, cooperatives, and less strongly international firms as investors. In contrast, respondents who do not financially participate in the energy transition show the highest indifference level for investment fonds.</li>
- differences (Chi<sup>2</sup> significance level of at least p < 0.05) between socio-demographic characteristics give evidence that
  - house owners tend to dislike internationals as investors, and like municipalities while respondents living in a flat are indifferent towards municipalities as investors.
  - respondents in urban areas tend to prefer a fond more than those in rural areas.
  - male respondents reveal a stronger dislike of international firms as investors than females, while females tend to have less preference for citizens as investors. In contrast, men tend to prefer municipalities as investors.
  - Preferences for municipalities and municipal utilities differ by age groups, but there is no clear pattern or tendency of preference, apart from the fact that the two oldest age groups show a preference for these two investor types.





Source: own calculation

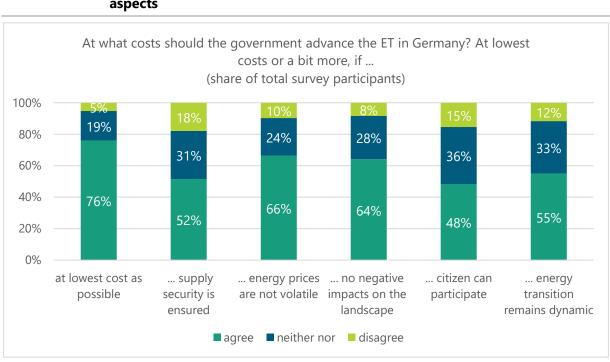
Table 15: Descriptive statis	tics of the dimension investor
------------------------------	--------------------------------

Statistics	Citizens	Commu- nities as share- holders	National firms and utilities	Inter- national utilities	Munici- pal utilities	Fond	Coopera- tives
N	883	887	884	882	882	882	882
Min	1	1	1	1	1	1	1
Мах	5	5	5	5	5	5	5

Source: own calculation; CV: Coefficient of variation (sd/mean)

# 3.1.3.7 Dimension 7: Low costs versus other aspects of the energy transition

A clear majority of the respondents wishes an energy transition at least cost (cheap). However, a certain trade-off between costs (cheap) and price volatility (cheap-volatile) impacts on the landscape (cheap-landscape), dynamics of the energy transition (cheap-dynamics) and energy supply security (cheap-secure) is accepted. The trade-off between costs and financial participation of citizen (cheap-participation) is the least supported option (48% agreement), but the rejection of the trade-off between costs and supply security is larger (18% rejection), (survey before the energy crisis). The results are depicted in Table 16, Table 17 and Figure 12.



# Figure 12: Preferences for trade-off between costs of the energy transition and other aspects

Source: own calculation

Statistics	Cheap	Cheap - secure	Cheap - volatile	Cheap - landscape	Cheap - participation	Cheap - dynamics
Ν	879	883	876	883	883	882
Mean	1.821	2.542	2.172	2.185	2.532	2.360
сѵ	0.524	0.435	0.456	0.461	0.435	0.454
Min	1	1	1	1	1	1
Мах	5	5	5	5	5	5

#### Table 16: Descriptive statistics of the dimension costs and trade-offs

Source: own calculation; CV: coefficient of variation (sd/mean)

The trade-off between cheap and dynamics of the energy transition is not displayed in Table 17; it only differs with respect to the age group (p < 0.05): middle-aged groups agree the least.

# Table 17:Costs: significant differences between groups by socio-demographic<br/>features and financial participation

Differences in agreements	Cheap – at lowest cost	Cheap - secure	Cheap - volatile	Cheap - landscape	Cheap- participation
age	Age group 5 agrees more than age group	Difference in agreement*** but no clear	Age group 5 agrees more than age group 1***,	Age group 5 agrees more than age groups 1, 2,	

Differences in agreements	Cheap – at lowest cost	Cheap - secure	Cheap - volatile	Cheap - landscape	Cheap- participation
	1***, Cohen's d 0. 64	pattern across age groups	Cohen's d 0. 28	3, 4 **, Cohen's d 0,23-0.36	
sex					males agree more**, Cohen's d 0.12;
location	Differences between locations*** but no clear pattern	Urban locations (2, 3)** display a stronger agreement, Cohen's d 0.20-0.28			
education	Edu level 2 agree most ***, Cohen's d 0.21- 0.34	-			
employment	Employed agree less than unemployed or pensioners ***, Cohen's d 0,25		Employed agree less than unemployed or pensioners ***, Cohen's d 0,18	Employed agree less than unemployed or pensioners ***, Cohen's d 0,25	
Financial participation	RE invest agree less ***, Cohen's d 0.31	RE invest agree***, Cohen's d 0,26			RE invest agree ***, Cohen's d 0.35

Source: own calculation;

Notes: the effect size is Cohen's d; \*  $\alpha$  < = 0.1, \*\*  $\alpha$  <= 0.05, \*\*\*  $\alpha$  <= 0.01;

cheap: with increasing age group, increasing agreement, but low significance between adjacent age groups, high between 1 and 5; Households: significant differences between groups for cheap vs cheap-volatile, -dynamics, -secure and -participation, but no clear pattern.

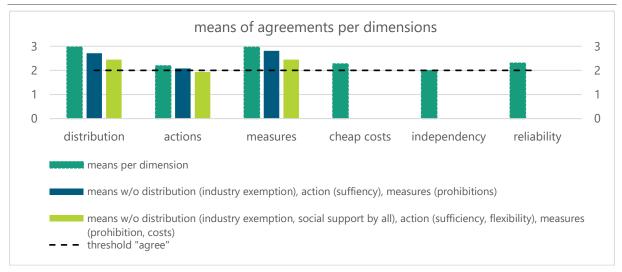
# 3.1.4 Relevance of dimensions and financial participation

In addition to preferences for selected design elements, we investigate whether respondents reveal different average rating levels per dimension. We calculate the individual means of agreement per respondent across the design elements within each dimension. Then we calculate the means per dimension based on the individual means. Since the dimensions are shaped and defined by our selection of design elements, we check for sensitivity of the means. Hence, we exclude in two steps a few design elements that have received very bad ratings. As a result, we receive the mean rating per dimension based on the individual means with all design elements and a reduced set of design

elements, i.e. a set without the rather negatively rated design elements. In addition, we test whether the means of the ratings per dimension differ by financial participation.

Figure 13 illustrates these different means per dimensions with a full and reduced set of design elements. The dashed line represents the level below which respondents display an agreement (threshold "agree"). We find that independency is the best-rated dimension, followed by actions. If actions do not include the design elements flexibility and sufficiency, then it becomes the best-rated dimension. In contrast, distribution issues and policy measures obtain the least agreement (near to indifference). Even without the negatively connoted design elements, their rating remains below that of the other dimensions.

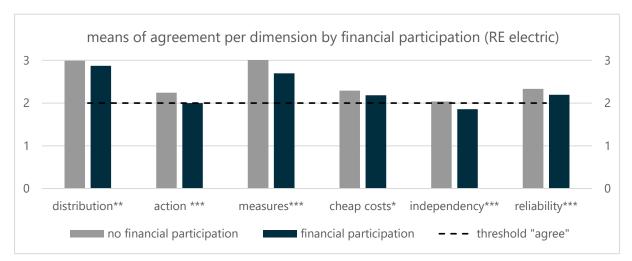




Source: own calculation; Note: scale from 1 = fully agree to 5 = fully disagree

Testing for differences between financially participating and non-participating respondents gives evidence that the rating significantly differs by financial participation ( $p \le 0.05$ ,  $p \le 0.1$  for cheap costs with re electric and  $p \le 0.01$ ,  $p \le 0.5$  for cheap costs with re-invest). Those that financially participate in the energy transition reveal a stronger agreement to and rating of the dimensions. This means, they tend to accept more the suggested design elements, including even less favourable policies or measures (see Figure 14). However, it is to note that these results only apply to this selected bundle of design elements and might differ in case other design elements are included.

# Figure 14: Average ratings per dimension at a scale from 1 to 5 (fully agree- fully disagree), by financial participation



Source: own calculation. Note: \*  $\alpha$  <= 0.1, \*\*  $\alpha$  <= 0.05, \*\*\*  $\alpha$  <= 0.01; Note: scale from 1 = fully agree to 5 = fully disagree

### 3.2 Preference patterns

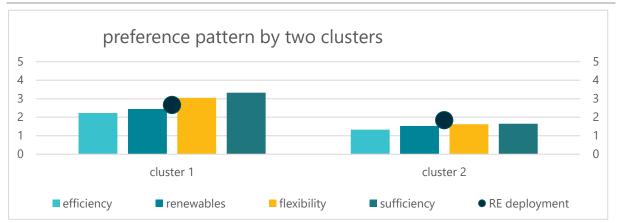
As outlined in Section 2.5.2, we apply two clustering approaches to identify groups with different preference patterns for the design elements of each dimension of the energy transition.

The analyses reveal that for each dimension the highest dissimilarity is mostly between two distinct groups. Accepting a lower level of dissimilarity, the analysis also displays five to six rather distinct clusters in each dimension for both cluster approaches. This allows comparing and aligning the number of clusters to the number of categories (attribute levels) of socio-demographic variables such as education, financial participation, etc.

In the following, we present the mean value of the design elements of each dimension and cluster. These mean values illustrate different preferences of each cluster with respect to the individual design elements of each dimensions, i.e. we get a preference pattern of each cluster and k value per dimension.

As outlined in Section 2.5.2, the results of the k-means and Ward's approach slightly differ due to the different clustering mechanism, but for k = 2 the results are very similar. Even for k = 5 the clusters display very similar characteristics with respect to their means of agreement to the design elements. In this Section 3.2, we depict the results of the k-means clustering approach for k = 2, unless the analytical approach suggests a different k, while dendrograms of the Ward's approach are shown in Annex A.2.2. Moreover, to elicit further research ideas with respect to potential preference patterns, we depict the results for k = 5 clusters of the Ward's and k-means' approach in Annex A.2.3.

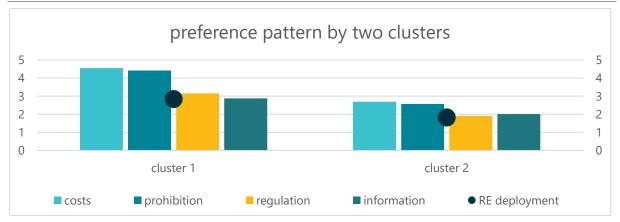
For the k-means analysis with k = 2, the parametric and non-parametric tests on differences between the clusters with respect to the design elements per dimension are all highly significant (p < 0.01) across all dimensions, clustering approaches, and number of clusters. In addition, the means of the attitudes per cluster correlate with the means of the respective design elements across all dimensions. The means of the attitudes per cluster are depicted for RE deployment (renewables) as dark green circle, and the means of each design element per dimension are illustrated as bars in the following figures.



### Figure 15: Preference patterns for k = 2 clusters of the dimension action

Source: own calculation. Note: bars and circle represent means for each design element and cluster; the scale is ranging from 1 = fully agree to 5 = fully disagree

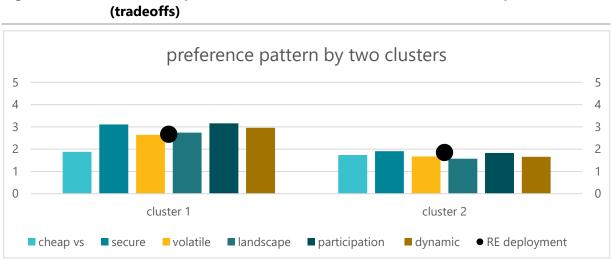
Individuals in cluster 2 of the dimension action agree more strongly than those in cluster 1 to all items within the dimension action (Figure 15). Cluster 2 includes significantly more respondents who financially participate ( $p \le 0.05$ ), are owners of houses or apartments (p < .1), belong to the older age groups 4, 5 and 6 (p <= 0.01), and tend to have a higher education of level 2 or 3 (p < .1). The respondents of cluster 2 reveal a positive attitude towards the energy transition (p <= 0.01).



#### Figure 16: Preference patterns for k = 2 clusters of the dimension measure

Source: own calculation. Note: bars and circle represent means for each design element and cluster; the scale is ranging from 1 = fully agree to 5 = fully disagree

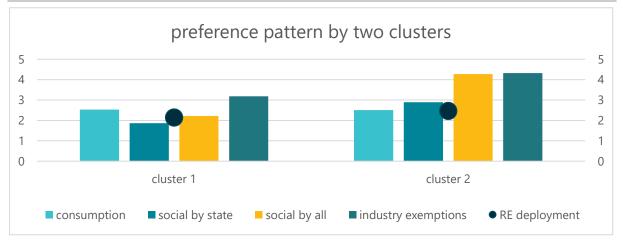
Individuals in cluster 2 of the dimension measure agree more strongly to all items within this dimension than those in cluster 1 (Figure 16). Cluster 2 includes significantly more respondents who financially participate ( $p \le 0.01$ ), are likely to live in urban areas (p < .01), belong to the younger age groups 1 and 2 (p < .01), and tend to have a higher education at level 3 (p < .01). The respondents of cluster 2 reveal a positive attitude towards the energy transition (p < .01).

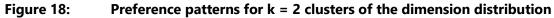


### Figure 17: Preference patterns for k = 2 clusters of the dimension cheap costs

Source: own calculation. Note: bars and circle represent means for each design element and cluster; the scale is ranging from 1 = fully agree to 5 = fully disagree

Individuals in cluster 2 tend to accept more a trade-off between costs and other aspects of the energy transition such secure energy supply, stable energy prices, low impact on landscape, participation of citizens and dynamic transition than those in cluster 1 - with the exception of the item cheap to which respondents in both clusters strongly agree (Figure 17). Cluster 2 includes significantly more respondents who financially participate (p < .1) and belong either to the age group 1 or 5 and 6 (p < .01).





Source: own calculation. Note: bars and circle represent means for each design element and cluster; the scale is ranging from 1 = fully agree to 5 = fully disagree

Individuals in cluster 1 rate all items of the dimension distribution of costs more positively than persons in cluster 2 (Figure 18). One exception is the item distribution of costs on the basis of energy consumption, which is rated similarly positively in both clusters. These two clusters of distribution aspects display no significant differences between groups formed on the basis of sociodemographic characteristics or financial participation.

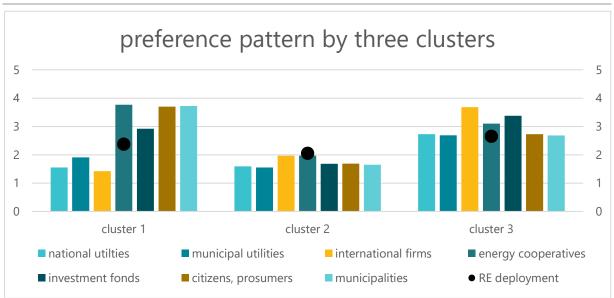


Figure 19: Preference patterns for k = 3 clusters of the dimension investors

Source: own calculation. Note: bars and circle represent means for each design element and cluster; the scale is ranging from 1 = fully agree to 5 = fully disagree

Cluster 3 includes respondents who have no explicit preferences for any type of investors, while Cluster 2 includes respondents who agree to all types of presented investors (Figure 19). In contrast, in cluster 1, the preference is strong for utilities and low for the all other options in which citizens could be involved. In cluster 2 and 3, more respondents financially participate (p < .01). Cluster 2 includes more males, cluster 3 more females (p < .01).

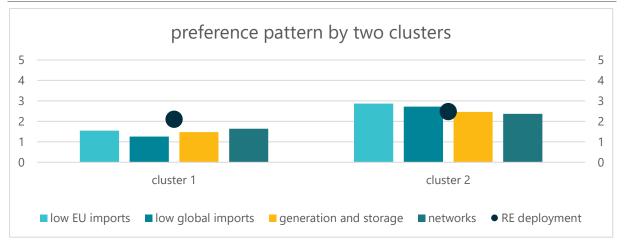


Figure 20: Preference patterns for k = 2 clusters of the dimension dependency

Source: own calculation. Note: bars and circle represent means for each design element and cluster; the scale is ranging from 1 = fully agree to 5 = fully disagree

Individuals in cluster 1 rate all items of the dimension dependency more positively than persons in cluster 2 (Figure 20). Cluster 1 of the dimension dependency includes more respondents who financially participate (p < .01) and belong to the older age groups 5 and 6 (p < .05).

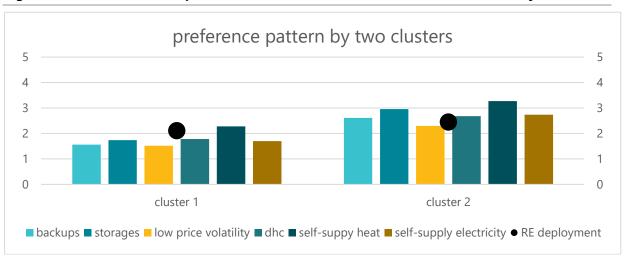


Figure 21: Preference patterns for k = 2 clusters of the dimension reliability

Source: own calculation. Note: bars and circle represent means for each design element and cluster; the scale is ranging from 1 = fully agree to 5 = fully disagree

Individuals in cluster 1 rate all items of the dimension reliability more positively than persons in cluster 2 (Figure 21). Cluster 1 of the dimension reliability includes more financially participating respondents (p < .05), that live in rural areas (p < .01) and belong to the age groups 5 and 6 (p < .1).

### 4 Discussion and Conclusion

The analysis shows that there is a strong agreement to the energy transition in terms of renewable energy deployment and its high dynamics. However, a high share of respondents (around one third) reveals an indifference with respect to the energy transition. This relatively high share of indifference is also reflected in the comparatively low level of disagreement (50%) to the statement of "no interest".

Further, we find that younger people and citizens with a high education display a stronger interest in and support for the energy transition, but the effect size is small to medium. We also find that citizens living in rented apartments reveal the lowest interest in the energy transition. We assume that this is grounded in the fact that they have no possibility to decide on sustainable heating and electricity generation with PV rooftop plants. Respondents living in urban areas also tend to agree more to the energy transition, but the effect is small.

Regarding financial participation, about 16% of the respondents have a small solar roof-top or balcony generation unit, while 13% use renewables in heating. About 8% hold either a membership or financial investment in a large project with renewable energies. The analysis points out that especially respondents owning a house financially participate more often than non-house-owners. Likewise, young or well-educated respondents or couples with at least one child also tend to participate more often. Regarding the attitude towards the energy transition, the analysis shows that the agreement to the energy transition is significantly stronger and of medium or large size among respondents who financially participate in the energy transition.

Main reasons for participation is the desire to contribute to the energy transition and become more autonomous through self-generation and financial aspects. In contrast, key barriers for those respondents who do not financially participate are the high expenditures for investments, which they cannot finance via debt or equity. Furthermore, lack of knowledge about opportunities to participate may also play a role.

Regarding the agreements and support of the different design elements per dimension, we can show that respondents who are financially participating show a higher agreement to some design elements and dimensions. Overall, we find that energy justice is important for many respondents as long as they do not have to pay for the subsidies of energy poors or disadvantaged consumers.

When it comes to the dimension investors, respondents who financially participate tend to prefer more strongly citizens and cooperatives and less strongly international firms, while non-participants display an indifference for investment funds. How to distribute the financial burdens of the energy transition between energy consumers is unrelated to financial participation or non-participation, except for industry exemptions, which are slightly and to a small extent supported by individuals financially participating. Regarding import dependency, financially participating respondents strongly consider the reduction of global energy imports and the increase of self-generation and storage as an important contribution to independency. The latter effect is medium to large. The analysis for reliability displays similar results, storages and self-supply are supported (small to medium effect) while the need for low price volatility is less important for financially participating respondents. In addition, the agreement to flexibility and RE deployment as important measures of the energy transition is higher for those financially participating (small to medium size effect). The disagreement with prohibitions and higher costs is lower and the agreement to regulation and information is higher, in the case of financial participation (medium size effect). Regarding costs, we learn that financially participating respondents agree a bit less to achieving the energy transition at least cost, and are willing to pay a bit more for a secure energy supply (medium size effect).

The clustering reveals for all dimensions that a strong agreement with any design element of the dimension correlates with a similar positive attitude towards the energy transition. Our findings of the cluster analysis with two clusters suggest two patterns of preferences: "support" versus "low support". The preference pattern support can be characterised by a very positive attitude towards the energy transition, and by financial participation for all dimensions apart from the dimension distribution of costs. Regarding reliability, independency, low costs and actions to implement the energy transition, we find that the supportive group includes significantly older respondents (mainly age group 5 to 6). Other socio-demographic features of the preference pattern "support" vary across the dimensions. However, since the number of attribute levels of these factors is larger than two (the number of clusters), an analysis with more differentiated preference patterns is suggested.

This study shows once again that financial participation can increase the acceptance of the energy transition and the acceptance of key design elements of the energy transition. It gives evidence that the support and acceptance for various design elements of the energy transition can also be linked to different socio-demographic factors that are not related to financial participation. For example, with k = 2 clusters we find that respondents of the old age group as well as respondents with financial participation rather support selected design elements, while with respect to financial participation. This shows that the identification of preference patterns for selected design elements and its relation to socio-demographic factors needs more research.

Albeit these significant differences and links between preferences and socio-demographic factors, causality could not be investigated in this study. Longitudinal studies would have to be carried out to answer this question. Methodologically, it can also be stated that the level of the questions is relatively challenging and requires a certain understanding of the complexity and familiarity with topics of the energy transition. This means that people who hardly deal with energy issues in everyday life might have had difficulties answering some of the questions. In a future study on this topic, more specific information on selected important topics could therefore be provided at the beginning of the survey. For the part of the respondents who already participate financially in the energy transition, it can be assumed that they also have a higher level of knowledge on the topic of the energy transition and its dimensions.

## 5 List of Figures

Figure 1:	Dimensions of the energy transition (ET) defined by their design elements	8
Figure 2:	Attitudes with respect to renewable energy (RE) deployment and the energy transition (ET)	17
Figure 3:	Forms of financial participation in detail in the sample	20
Figure 4:	Reasons to invest in the energy transition	21
Figure 5:	Reasons to not invest in the energy transition	21
Figure 6:	Preferences for distribution of costs	22
Figure 7:	Preferences for options entailing independency from imports	24
Figure 8:	Preferences for options contributing to a reliable and secure energy supply	26
Figure 9:	Preferences for activities transforming the energy system	28
Figure 10:	Preferences for policy measures supporting the energy transition	29
Figure 11:	Preferences for certain types of investors	
Figure 12:	Preferences for trade-off between costs of the energy transition and other aspects	33
Figure 13:	Average ratings per dimension at a scale from 1 to 5 (fully agree- fully disagree)	35
Figure 14:	Average ratings per dimension at a scale from 1 to 5 (fully agree- fully disagree), by financial participation	36
Figure 15:	Preference patterns for $k = 2$ clusters of the dimension action	
Figure 16:	Preference patterns for $k = 2$ clusters of the dimension measure	
Figure 17:	Preference patterns for k = 2 clusters of the dimension cheap costs (tradeoffs)	38
Figure 18:	Preference patterns for $k = 2$ clusters of the dimension distribution	
Figure 19:	Preference patterns for $k = 3$ clusters of the dimension investors	
Figure 20:	Preference patterns for $k = 2$ clusters of the dimension dependency	
Figure 21:	Preference patterns for $k = 2$ clusters of the dimension reliability	40
Figure 22:	Characteristics of k = 5 clusters of dimension actions, k-means	64
Figure 23:	Characteristics of k = 5 clusters of dimension actions, Wards	64
Figure 24:	Characteristics of k = 5 clusters of dimension measures, k-means	65
Figure 25:	Characteristics of k = 5 clusters of dimension measures, Wards	65
Figure 26:	Characteristics of k = 5 clusters of dimension trade-off of costs, k-means	66
Figure 27:	Characteristics of k = 5 clusters of dimension trade-off of costs, Wards	66
Figure 28:	Characteristics of k = 5 clusters of dimension investors, k-means	67

Figure 29:	Characteristics of k = 5 clusters of dimension investors, Wards	67
Figure 30:	Characteristics of k = 5 clusters of dimension distribution, k-means	68
Figure 31:	Characteristics of k = 5 clusters of dimension distribution, Wards	68
Figure 32:	Characteristics of k = 5 clusters of dimension dependency, k-means	69
Figure 33:	Characteristics of k = 5 clusters of dimension dependency, Wards	69
Figure 34:	Characteristics of k = 5 clusters of dimension reliability, k-means	70
Figure 35:	Characteristics of k = 5 clusters of dimension reliability, Wards	70

## 6 List of Tables

Table 1:	Overview on socio-demographic characteristics of the sample	13
Table 2:	Descriptive statistics of attitudes with respect to renewable energy (RE) deployment and the energy transition (ET)	18
Table 3:	Description of differences in agreement to RE deployment or interest in the ET by socio-demographic characteristics and financial participation	18
Table 4:	Frequency of financial participation by types	20
Table 5:	Descriptive statistics of the dimension distribution	22
Table 6:	Distribution of significant differences between groups by socio- demographic features and financial participation	23
Table 7:	Descriptive statistics of the dimension independency	24
Table 8:	Dependency: significant differences between groups by socio- demographic features and financial participation	24
Table 9:	Descriptive statistics of the dimension reliability	26
Table 10:	Reliability: significant differences between groups by socio-demographic features and financial participation	26
Table 11:	Descriptive statistics of the dimension action	28
Table 12:	Action: significant differences between groups by socio-demographic features and financial participation	28
Table 13:	Descriptive statistics of the dimension measures	
Table 14:	Measures: significant differences between groups by socio-demographic features and financial participation	30
Table 15:	Descriptive statistics of the dimension investor	32
Table 16:	Descriptive statistics of the dimension costs and trade-offs	33
Table 17:	Costs: significant differences between groups by socio-demographic features and financial participation	33

## A.1 Survey

## A.1.1 Quota

Variables	Characteristics	Share
Age	18-30	18%
	31-40	18%
	41-50	17%
	51-60	21%
	61-70	17%
	71-80	9%
Gender	male	50%
	female	51%
	other	0%
education	lower	21%
	medium	45%
	upper	35%
persons	1 person	3%
	2 persons	13%
	3 persons	8%
	more than 4 persons	6%
dwelling	own house	24%
	own flat	9%
	rented house	6%
	rented flat	60%
	others	1%
household size	single person household	33%
	with partner	37%
	with partner and children	21%
	alone with children	4%
	others	0%
	flat-sharing community	6%
location of dwelling	rural municipality (<= 5 000 inhabitants)	19%
	small town (> 5 000 - 20 000 inhabitants)	21%
	medium town (> 20 000 - 100 000 inhabitants)	27%
	city (> 100 000 inhabitants)	34%

## A.1.2 Questionnaire

#### 2 Fragen zur Person

#### Fragen zu Ihnen als Person

(alle Fragen dieser Seite sind Pflichtfragen und Sie können erst nach Beantwortung im Fragebogen fortfahren) Bitte geben Sie Ihr Geschlecht an:

Bitte geben Sie Ihr Geschlecht an:	
O männlich	
O weiblich	
O anderes	
Ihr Alter ist:	
Was ist Ihr höchster Bildungsabschluss?	
O Kein Schulabschluss	
O Grund- oder Hauptschulabschluss	
O Mittlere Reife	
O Abitur oder Fachhochschulreife	
O Sonstiges:	
Welche berufliche Qualifikation haben Sie?	
O Abgeschlossene Ausbildung	
O Hochschulabschluss	
O Akademischer Grad	
O Sonstiges:	
O Keine	
Wie ist Ihre aktuelle Wohnsituation?	
O Eigene(s) Haus(hälfte)	
O Eigentumswohnung	
O Gemietete(s) Haus(hälfte)	
O Mietwohnung	
O Sonstiges:	
Wie groß ist Ihr Haushalt?	
O Einpersonenhaushalt	
O Mit Partner:in	

- Mit Partner:in und Kind(ern)
- Alleine mit Kind(ern)
- O Wohngemeinschaft
- O Sonstiges:

#### Wie groß ist Ihre Gemeinde bzw. Stadt in der Sie leben?

- O Landgemeinde bis 5.000 Einwohner:innen
- O Kleinstadt mit ca. 5.000 20.000 Einwohner:innen
- O Mittlere Stadt mit 20.000 100.000 Einwohner:innen
- O Größere Stadt (> 100.000 Einwohner:innen)

#### In welchem Bundesland leben Sie?

Baden-Württemberg (BW) Freistaat Bayern (BY) Berlin (BE) Brandenburg (BB) Bremen (HB) Hamburg (HH) Hessen (HE) Mecklenburg-Vorpommern (MV) Niedersachsen (NI) Nordrhein-Westfalen (NRW) Rheinland-Pfalz (RP) Saarland (SL) Sachsen (SN) Sachsen (SN) Schleswig-Holstein (SH) Thüringen (TH)

#### Was trifft überwiegend auf Sie zu?

- O Ich bin berufstätig (inkl. Auszubildende, Personen in Elternzeit oder Altersteilzeit)
- O Ich bin Schüler:in, Student:in
- O Ich bin Rentner:in / Pensionär:in
- O Ich bin Hausfrau/-mann oder versorge Kinder und/oder pflegebedürftige Personen
- O Ich bin arbeitslos
- O Keine der genannten Auswahlmöglichkeiten

3 Einstellung zur EW						
Stimmen Sie folgenden Aussagen zu?						
	stimme vollständig zu	stimme eher zu	teils / teils	stimme eher nicht zu	stimme überhaupt nicht zu	keine Meinung
Wir brauchen einen konsequenten						
Umstieg auf erneuerbare Energien,	0	0	0	0	0	0
auch wenn es viele Investitionen	0	0	0	0	0	0
erfordert.						
Der Ausbau von erneuerbaren	0	0	0	0	0	0
Energien sollte abgebremst werden.	0	0	0	0	0	0
Ich sehe die Energiewende als positiv	0	0	0	0	0	0
für die Gesellschaft.	0	0	0	0	0	0
Ich möchte mich möglichst wenig mit	~	0	~	0	0	0
der Energiewende befassen.	0	0	0	0	0	0
Nutzen oder investieren Sie oder Ihr H	aushalt in die	folgenden Di	nge? 🕢			
Zum Beispiel durch	ja	nein				
Photovoltaik- und/oder Solarthermie-						
Anlage auf dem eigenen Hausdach	0	0				
Geldanlage in einen Windpark, eine	~	~				
Photovoltaik-Großanlage oder in einen	0	0				
ökologischen Investmentfonds(?)	0	0				
Beteiligung an einer Energie-	0	0				
Genossenschaft oder an einem						
Bürger-Solar- oder -Windpark						
Elektroauto im Haushalt	0	0				
Wärmepumpe oder Holz-	0	0				
Pelletheizkessel, oder Biogaskessel	0	0				

#### Sie haben eine oder mehrere der Antworten mit "ja" beantwortet.

Das Nutzen bzw. Investieren in eines oder mehrere der genannten Dinge nennen wir im Folgenden "finanzielle Beteiligung an der Energiewende".

#### Warum beteiligen Sie sich finanziell an der Energiewende?

	trifft vollständig zu	trifft eher zu	teils / teils	trifft eher nicht zu	trifft überhaupt nicht zu	keine Angabe
Weil						
ich dadurch einen finanziellen Vorteil						
habe, z.B. eine kleine Rendite mit	0	0	0	0	0	0
meiner Anlage erziele oder						
Energiekosten einspare.						
ich zur Energiewende beitragen	0	0	0	0	0	0
mõchte.						
mir das Bekannte/Freunde/Familie	0	0	0	0	0	0
empfohlen haben.						
mir das mein Handwerker/Installateur	0	0	0	0	0	0
oder Energieberater empfohlen hat.						
ich es gut finde, mich selbst mit	0	0	0	0	0	0
Energie zu versorgen.						
Weiteres, und zwar:	0	0	0	0	0	0

#### Sie haben keine der Antworten mit "ja" beantwortet.

Das Nutzen bzw. Investieren in eines oder mehrere der genannten Dinge nennen wir im Folgenden "finanzielle Beteiligung an der Energiewende".

#### Warum beteiligen Sie sich nicht finanziell an der Energiewende?

	trifft vollständig zu	trifft eher nicht zu	teils / teils	trifft eher nicht zu	trifft überhaupt nicht zu	keine Angabe
Weil		_		_		-
es für mich zu hohe Kosten sind, die	0	0	0	0	0	0
ich nicht stemmen kann.						
ich keinen finanziellen Vorteil davon habe.	0	0	0	0	0	0
ich keinen Handwerker, Installateur						
oder Energieberater habe, der/die	0	0	0	0	0	0
mich berät und das installiert.						
ich kein technisches Verständnis oder						
auch keine Zeit habe, mich damit auseinander zu setzen.	0	0	0	0	0	0
ich kein Interesse an der						
Energiewende habe.	0	0	0	0	0	0
ich keine Investitionsmöglichkeit						
gefunden habe, einen kleinen	0	0	0	0	0	0
Geldbetrag anzulegen oder zu investieren.						
investieren.						
Politik und/oder der Unternehmen ist.	0	0	0	0	0	0
Weiteres, und zwar:	0	0	0	0	0	0

Durch die Energiewende fallen im Strombereich möglicherweise höhere Kosten an. Wer soll diese Kosten übernehmen?								
	stimme vollständig zu	stimme eher zu	teils / teils	stimme eher nicht zu	stimme überhaupt nicht zu			
Der Staat soll alle Mehrkosten, die								
möglicherweise durch die	0	0	0	0	0			
Energiewende anfallen, zahlen (mit	0	0	0	0	0			
den Steuereinnahmen).								
Die Verbraucher:innen sollen die								
Kosten entsprechend ihres	0	0	0	0	0			
Energieverbrauchs zahlen.								
Wie sollen die durch die Energiewende	möglicherweis	e höheren Koste	n für Verbrauc	her:innen vertei	It werden?			
	stimme vollständig zu	stimme eher zu	teils / teils	stimme eher nicht zu	stimme überhaupt nicht zu			

#### Alle, die Strom verbrauchen, zahlen abhängig von ihrem Verbrauch, es gibt 0 0 0 0 0 keine Ausnahmen. 0 0 0 0 0 Alle, die Strom verbrauchen, zahlen abhängig von ihrem Verbrauch, aber sozial schwächere Gruppen erhalten einen Zuschuss vom Staat zu den Energiekosten. Alle, die Strom verbrauchen, zahlen abhängig von ihrem Verbrauch, aber sozial schwächere Gruppen zahlen 0 0 0 0 0 etwas weniger. Die restlichen Stromverbraucher zahlen dafür etwas mehr. Alle, die Strom verbrauchen, zahlen abhängig von ihrem Verbrauch, aber große industrielle Stromverbraucher (beispielsweise Papierhersteller, 0 0 0 0 Aluminiumproduzenten) bezahlen 0 weniger, damit sie weiterhin wettbewerbsfähig bleiben. Die restlichen Stromverbraucher zahlen

dafür etwas mehr.

Um Strom mit erneuerbaren Energien erzeugen zu können, müssen Anlagen finanziert und errichtet werden. Das bedeutet, jemand, der sein Geld für diese Anlagen gibt, investiert in diese Anlagen.

Wer soll hauptsächlich in Windparks oder Photovoltaikanlagen investieren?

	Ja überwiegend diese Personen/ Organisationen	Diese und andere Personen/ Organisationen zu ungefähr gleichen Anteilen	Diese Personen/ Organisationen nur zu einem kleinen Teil	Nein, auf keinen Fall diese Personen/ Organisationen	Ist mir egal
Nationale Firmen und private					
Energieversorgungsunternehmen	0	0	0	0	0
(Bsp. E.ON, EnBW, Naturstrom).					
Kommunale					
Energieversorgungsunternehmen der	0	0	0	0	0
öffentlichen Hand, wie Stadtwerke oder	0	0	0	0	0
Gemeindewerke.					
Internationale, große Firmen und	0	0	0	0	0
Energiekonzerne (Bsp. Shell, BP).	0	0	0	0	0
Bürgerinitiativen (Bürgerenergieparks)					
und Energie-Genossenschaften oder	0	0	0	0	0
ähnliche nicht gewinnorientierte	0	0	0	0	0
Organisationen.					
Investmentfonds die nachhaltige,	0	0	0	0	0
ökologische oder grüne Projeke					
finanzieren, und an denen sich					
Bürger:innen auch mit kleinen					
Geldbeträgen beteiligen können.					
Bürger:innen, die Photovoltaik-Anlagen					
auf dem eigenen Hausdach installieren	0	0	0	0	0
können.					
Dörfer oder kleine Städte als					
(Mit)Eigentümer von Solar- oder	0	0	0	0	0
Windkraft-Anlagen, welche auf deren	~	~	- -	0	~
• • • • • • •					

Gemarkung errichtet werden.

In der Zeitung ist manchmal davon zu lesen, dass Deutschland bei der Energieversorgung vom Ausland abhängig ist, das bedeutet, dass Deutschland sich nicht vollständig selbst mit Energie (Strom, Gas, Öl) versorgen kann. Wichtig für eine vom Ausland unabhängige Energieversorgung ist, dass ...

	stimme voliständig zu	stimme eher zu	teils / teils	stimme eher nicht zu	stimme überhaupt nicht zu
möglichst wenig Energie (wie					
Erdgas und Strom) von anderen EU-	0	0	0	0	0
Ländern importiert wird.					
möglichst wenig Energie (wie					
Erdgas und Strom) von Ländern	0	0	0	0	0
außerhalb der Europäischen Union	0	0	0	0	0
(EU) importiert wird.					
die einzelnen Haushalte die					
Möglichkeit haben, ihren Strom selbst					
zu erzeugen oder gar zu speichern	0	0	0	0	0
(Bsp. Photovoltaik-Anlage und					
Batteriespeicher).					
die Strom- und Gasleitungen in					
Europa gut miteinander verbunden					
sind und sich europäischen Länder so	0	0	0	0	0
gegenseitig bei überschüssiger oder					
fehlender Energie aushelfen können.					

	stimme voliständig zu	stimme eher zu	teils / teils	stimme eher nicht zu	stimme überhaupt nicht zu
	0	0	0	0	0
sehr viele, auch teure					
Stromerzeugungsanlagen als Back-up					
(Sicherung) bereitstehen, so dass					
diese immer bei Stromknappheit					
einspringen und genügend Strom					
liefern können.					
sehr viele, auch teure Speicher					
bereitstehen um Engpässe	0	0	0	0	0
aufzufangen					
es wenig Preisschwankungen für	0	0	0	0	0
Erdgas und Strom gibt.	0	0	0	0	0
die Haushalte ihre Wärme über ein					
Fern- oder Nahwärmenetz(?)	0	0	0	0	0
beziehen, sofern das möglich ist.					
die Haushalte möglichst selbst ihren					
eigenen Strom mit Solaranlagen	0	0	0	0	0
erzeugen.					
die Haushalte ihre Wärme selbst mit	0	0	0	0	0
Holz/Pelletöfen erzeugen.	0	0	0	0	0

#### Hier geht es um eine unterbrechungsfreie und beständige Energieversorgung. Wichtig für eine sichere und zuverlässige Energieversorgung ist, dass... 🔕

Die Energiewende hin zu einer klimafreundlichen Energieversorgung können wir auf verschiedene Weise schaffen, z.B. durch Nutzung erneuerbarer (sauberer) Technologien in der Energieerzeugung, durch sparsame Geräte und Gebäude und durch Veränderung unseres Verhaltens.

Wie sollen wir in Deutschland die Energiewende schaffen?

	stimme voliständig zu	stimme eher zu	teils / teils	stimme eher nicht zu	stimme überhaupt nicht zu
Überwiegend durch Investitionen in					
erneuerbare Erzeugungstechnologien,	0	0	0	0	0
wie Wind- und Solarenergie, und	0	0	0	0	0
Speichertechnologien.					
Durch Einbau sparsamer (effizienter)					
Heizungen, gut gedämmter Gebäude,	0	0	0	0	0
stromsparender Geräte.					
Durch mehr Genügsamkeit beim					
Energieverbrauch, zum Beispiel durch					
niedrigere Raumtemperaturen im	0	0	0	0	0
Winter oder weniger Beleuchtung im					
Haus.					
Durch Anpassung meines	0	0	0	0	0
Stromverbrauchs (z.B.					
Waschmaschine, Stromheizung,) an					
die Zeiten, in denen ausreichend					
Strom durch Sonnen- oder					
Windenergie zur Verfügung steht.					

#### Mit welchen Maßnahmen soll der Staat die Energiewende voranbringen?

	stimme vollständig zu	stimme eher zu	teils / teils	stimme eher nicht zu	stimme überhaupt nicht zu
Durch Vorschriften, beispielsweise					
durch Vorgabe von Grenzwerten					
(Standards) für den Energieverbrauch	0	0	0	0	0
bei Elektrogeräten oder beim CO2-					
Ausstoß von Heizungen.					
Durch Verbote, wie Verbot von Öl- oder					
Gasheizungen in Gebäuden, Verbot	0	0	0	0	0
von Verbrennungsmotoren im Auto.					
Durch Informationen und Appelle an					
die Menschen, weniger Energie zu	0	0	0	0	0
verbrauchen und nur saubere Energie	0	0	0	0	0
zu erzeugen/kaufen.					
Durch höhere Preise für fossile					
Energien (z.B. mehr Steuern auf Erdöl,	0	0	0	0	0
Erdgas, Diesel, Benzin), so dass es zu	0	0	0	0	0
teuer wird, diese zu kaufen.					

#### Häufig wird in der Zeitung berichtet, dass die Stromkosten durch Investitionen in erneuerbare Energien ansteigen können, oder auch die Kosten für Wärmeversorgung, wenn eine neue sparsamere Heizung oder erneuerbare Energien genutzt werden sollen.

Wie soll der Staat die Energiewende voranbringen?

	stimme vollständig zu	stimme eher zu	teils / teils	stimme eher nicht zu	stimme überhaupt nicht zu
so kostengünstig wie möglich	0	0	0	0	0
kostengünstig, aber es darf denn	och etwas te	urer sein,			
wenn wir dadurch keinen					
Stromausfall haben, oder unsere	0	0	0	0	0
Energieversorgung unabängig ist vom					
Ausland (Versorgungssicherheit).					
wenn wir dadurch keine starken	~	0	0	0	0
Strompreisschwankungen haben.	0	0	0	0	0
wenn solche Anlagen zur	0	0	0	0	0
Energieerzeugung gebaut werden, die					
die Landschaft weniger beeinträchtigen					
(beispielsweise Solaranlagen an					
Gebäuden).					
wenn sehr viele Bürger:innen sich in					
Form von Genossenschaften,					
Bürgerparks oder Kleinanlagen direkt	0	0	0	0	0
finanziell an der Energiewende					
beteiligen können.					
wenn der Umbau des					
Energiesystems schneller erfolgt als	0	0	0	0	0
bisher.					

## A.2 Results

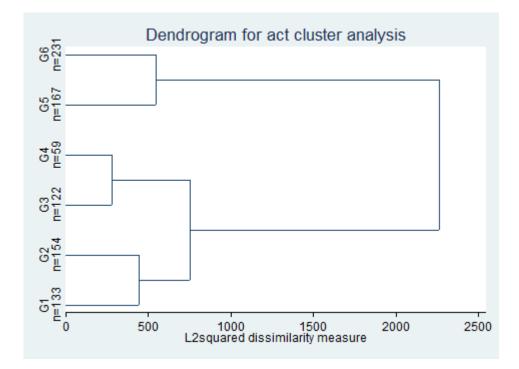
## A.2.1 Sample description

age	Freq.	Percent	Cum.
1	140	15.78	15.78
2	150	16.91	32.69
3	141	15.90	48.59
4	198	22.32	70.91
5	174	19.62	90.53
6	84	9.47	100.00
Total	887	100.00	
edu	Freq.	Percent	Cum.
1	183	20.63	20.63
2	413	46.56	67.19
3	291	32.81	100.00
Total	887	100.00	
dwelling	Freq.	Percent	Cum.
0	214	24.13	24.13
1	76	8.57	32.69
2	50	5.64	38.33
3	537	60.54	98.87
4	10	1.13	100.00
Total	887	100.00	
location	Freq.	Percent	Cum.
0	163	18.38	18.38
1	179	20.18	38.56
2	233	26.27	64.83
3	312	35.17	100.00
Total	887	100.00	

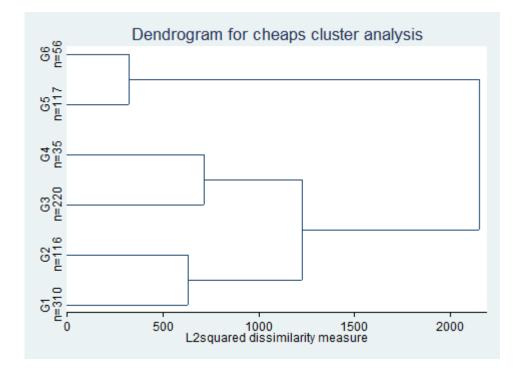
household	Freq.	Percent	Cum.
0	306	34.50	34.50
1	318	35.85	70.35
2	176	19.84	90.19
3	40	4.51	94.70
5	47	5.30	100.00
		0.00	
Total	887	100.00	
job	Freq.	Percent	Cum.
0	456	51.41	51.41
1	54	6.09	57.50
2	265	29.88	87.37
4	112	12.63	100.00
Total	887	100.00	
persons	Freq.	Percent	Cum.
1	28	10.81	10.81
2	116	44.79	55.60
3	73	28.19	83.78
4	42	16.22	100.00
Total	259	100.00	
state	Freq.	Percent	Cum.
BB	28	3.16	3.16
BE	53	5.98	9.13
BW	106	11.95	21.08
BY	141	15.90	36.98
HB	6	0.68	37.66
HE	62	6.99	44.64
HH	22	2.48	47.13
MV	10	1.13	48.25
NI	71	8.00	56.26
NRW	195	21.98	78.24
RP	44	4.96	83.20
SH	41	4.62	87.82
SL	17	1.92	89.74
SN	53	5.98	95.72
ST	22	2.48	98.20
TH	16	1.80	100.00
Total	887	100.00	

### A.2.2 Dendrograms

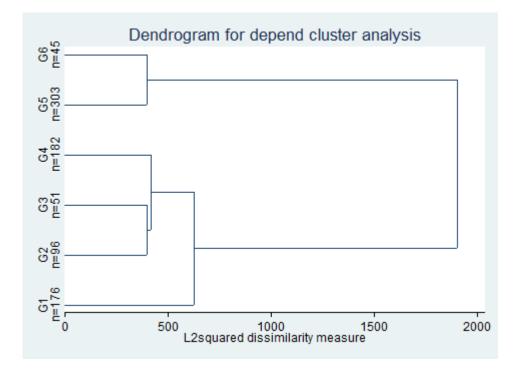
Ward's cluster by options, i.e. actions, how to transform the energy system (dimension options)



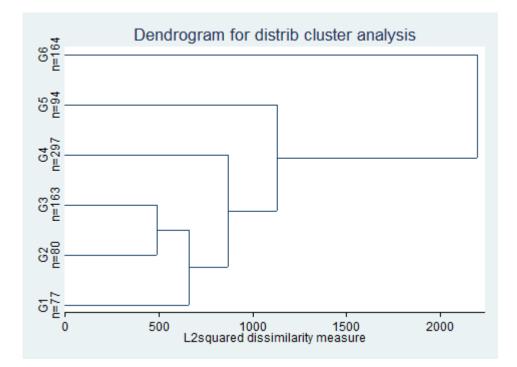
Ward's cluster by trade-offs between costs and other aspects that need to be taken into account when transforming the energy system (dimension cheap transition)



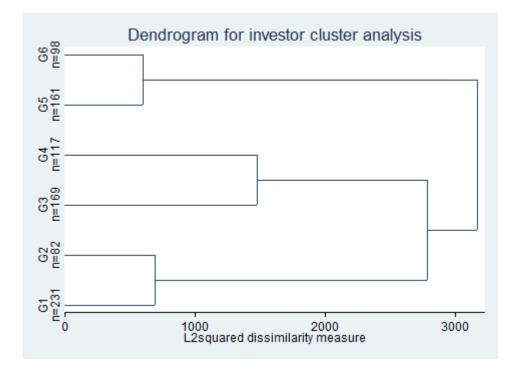
Ward's clusters by potential designs for energy independency, i.e. options that contribute to lower import dependency (dimension dependency)



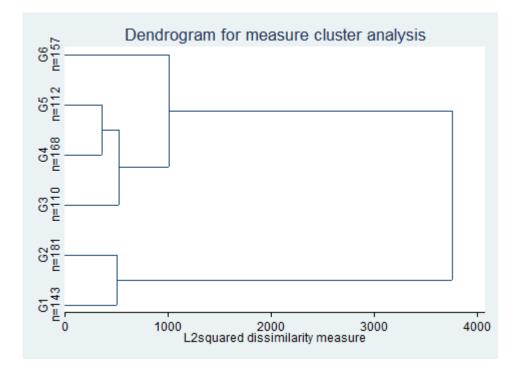
Ward's clusters by distribution of costs of the energy transition (dimension distribution)

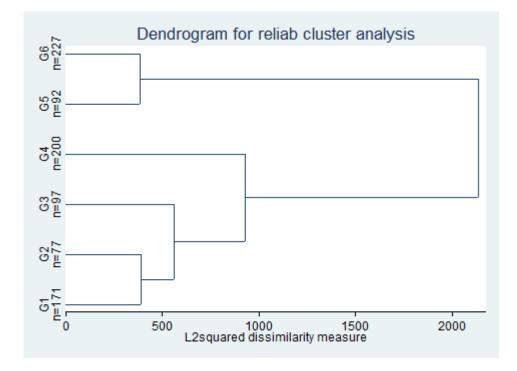


Ward's cluster by design elements depicting different investors in renewable energy plants (dimension investor)



Ward's cluster by policies promoting the energy transition (dimension measures)



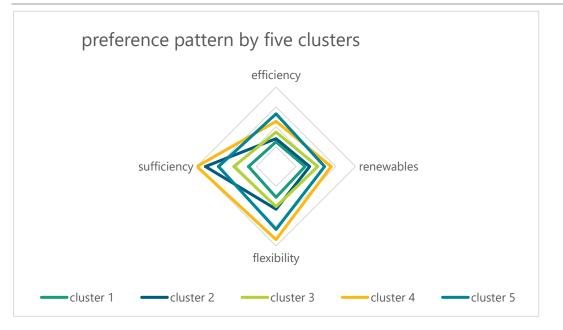


Ward's cluster by design elements depicting reliability of energy supply (dimension reliability)

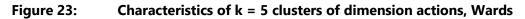
### A.2.3 Clusters characterised by means – design preferences

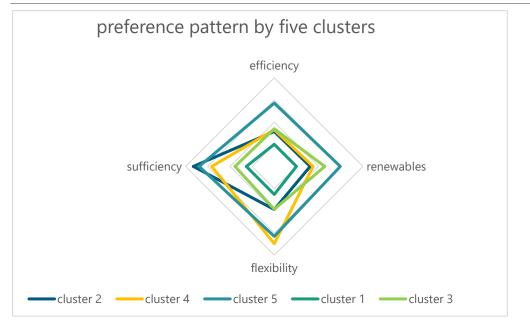
Applying k-means clustering (Figure 22) with k = 5 we get five distinct preference patterns with respect to the focused actions efficiency, renewables, sufficiency and flexibility that are displayed by their means of (dis)agreement. Cluster 1 is characterised by a very high degree of agreement to the selected actions, while cluster 2 shows a high agreement except for sufficiency. In contrast, cluster 3 reveals a generally high agreement, but lower as cluster 1. Cluster 4 strongly refuses sufficiency and flexibility options while in cluster 5 citizens refuse less renewables, sufficiency and flexibility but more efficiency.

When applying Ward's clustering, the preference patterns becomes in this case more pronounced. Cluster 1, 2 and 3 are quite similar in their preferences. Cluster 4 still supports efficiency and renewables but refuses more flexibility and less sufficiency, while cluster 5 reveals the least overall agreement with these actions.



### Figure 22: Characteristics of k = 5 clusters of dimension actions, k-means





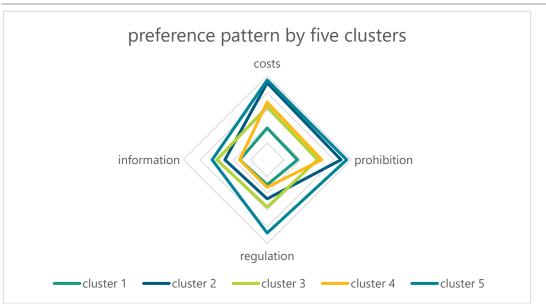
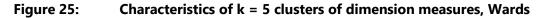
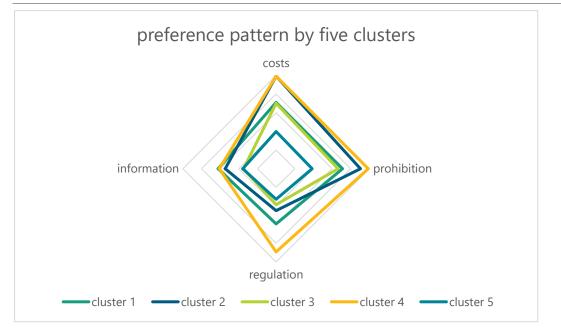


Figure 24: Characteristics of k = 5 clusters of dimension measures, k-means





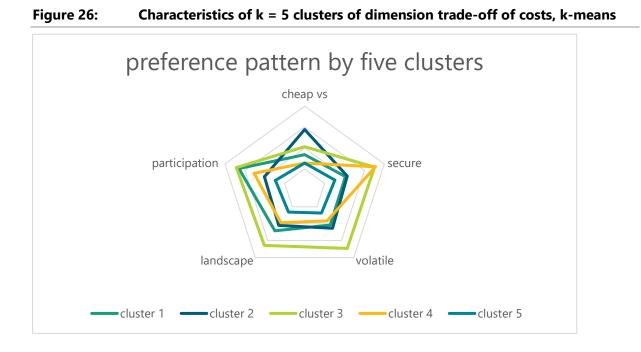
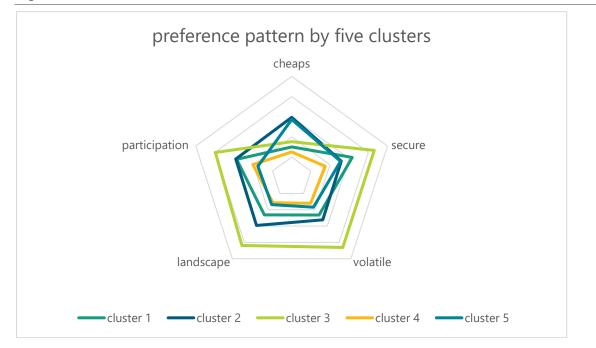
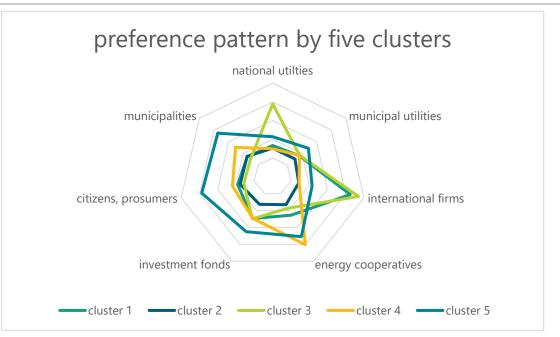
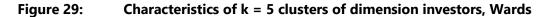


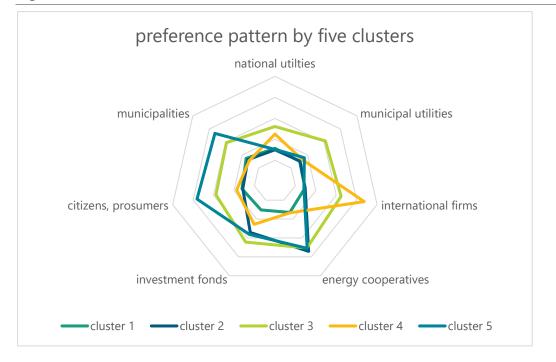
Figure 27: Characteristics of k = 5 clusters of dimension trade-off of costs, Wards

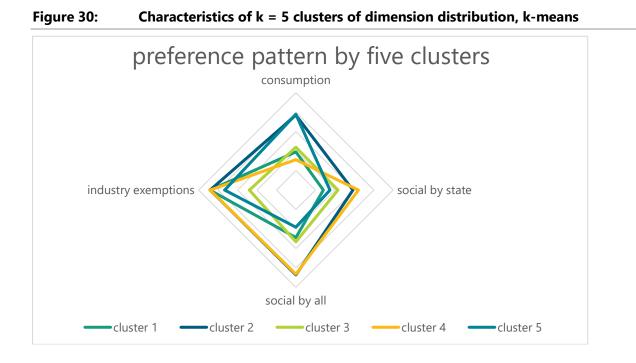




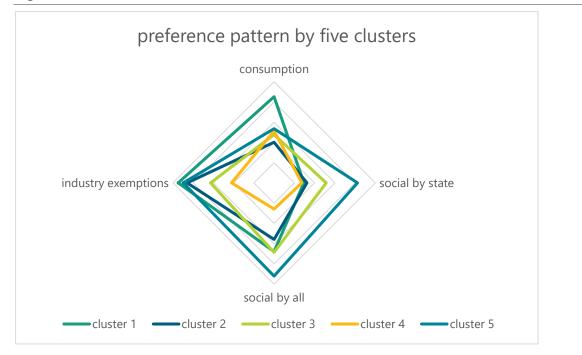


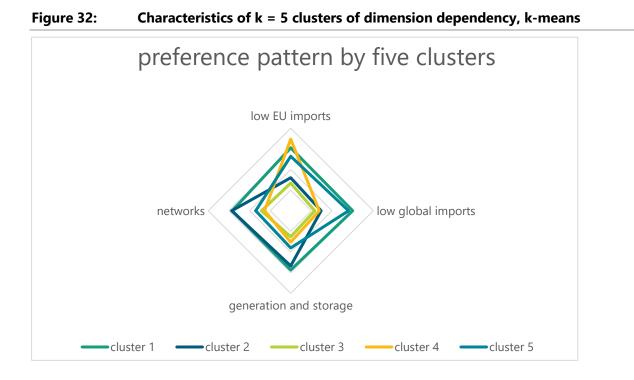




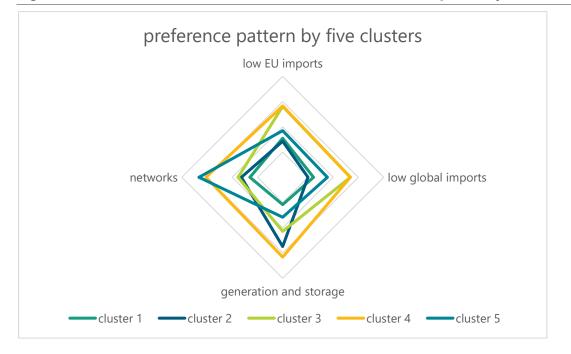


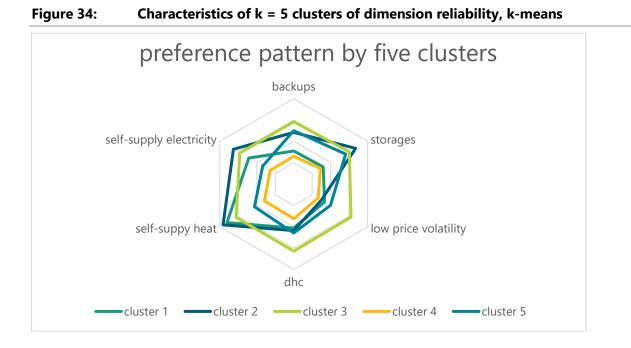
### Figure 31: Characteristics of k = 5 clusters of dimension distribution, Wards

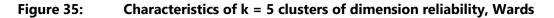


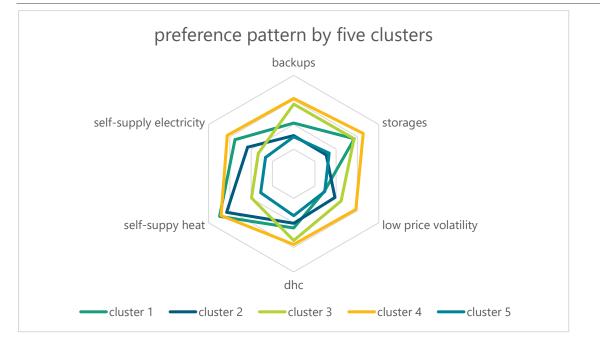












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