Technical University of Denmark



Smart grid Transitions: System solutions and consumer behaviour

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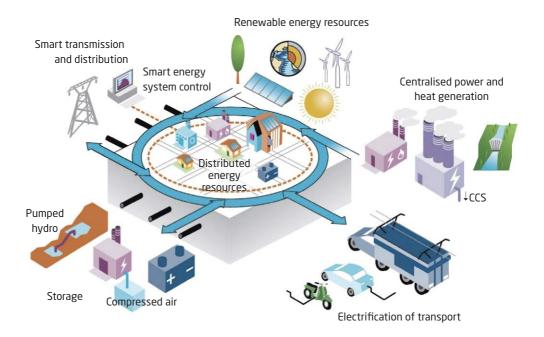
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Smart grid Transitions System solutions and consumer behaviour

August 2017



DTU Management Engineering

Department of Management Engineering

CONTRIBUTION TO FULFILLMENT OF THE SUSTAINABLE DEVELOPMENT GOALS

The research projects that are discussed in this report have contributed to the fulfilment of the following Sustainable Development Goals (SDGs):

- 7 Affordable and clean energy;
- 8 Decent work and economic growth;
- 9 Industry, innovation and infrastructure;
- 11 Sustainable cities and communities;
- 13 Climate action;
- 17 Partnerships to achieve the goals.



Read more about the Sustainable Development Goals at https://sustainabledevelopment.un.org/

Edited by: Leif Sønderberg Petersen, Rikke Brinkø, Claire Bergaentzlé, Simon Bolwig, and Klaus Skytte Design and print: STEP Photos: Colourbox unless otherwise stated ISBN 978-87-93458-51-2 August 2017 Front cover illustration from "Spotlight on Smart and Strong Power T&D Infrastructure", published by International Smart Grid Action Network, May 2016 The production of this publication received financial support from EUDP (Energiteknologisk Udviklings- og demonstrationsprogram) under the Danish Energy Agency.

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KEY FINDINGS

This publication summarises a selection of research projects contributing to the objectives of Annex 7 of the ISGAN project on smart grids.

Among the key findings is that reaching a fully renewable energy system is not only a matter of electricity infrastructure, but also requires an emphasis on other aspects, for example, market mechanisms that support renewable energy integration and enhance flexibility. Demand response, electric vehicles and storage, and synergies with gas and electricity systems are well-known ways of increasing flexibility.

Current market structures and framework conditions facilitate demand response to a lesser extent, and consequently its most beneficial aspects cannot be accessed. Novel market structures should be investigated in conjunction with the development of detailed demand response models.

The Nordic power market is the main driver of flexibility in the Nordic region. The market was not originally designed to handle large shares of variable renewable energy (VRE), which requires certain rules to be redesigned. Regarding regulatory framework conditions, flexibility is not an explicit goal of existing policies, and both drivers and barriers exist to it. An important potential for flexibility in the region is the coupling of electricity markets with the markets for heat, gas and transportation.

Political and social initiatives to promote changing energy behaviour are just as important as technological developments. Government information policies and market-based instruments aimed at influencing the energy choices of consumers often ignore the fact that consumer behaviour is not fully reducible to individuals making rational and conscious decisions. To achieve a transition to sustainable energy, an approach that goes beyond individual consumer choice and puts shared routines and system change at its heart is needed.

The focus on social practices will help the move away from a technology push approach to smart grids. The provision and consumption of energy is usually not a goal in itself: rather, the energy system enables all kind of social activities that need energy, ranging from the energy needed to provide comfort (heating and cooling in houses) to almost all forms of communication and entertainment.

The vision of the tech-savvy individual who, through smart appliances, can draw on detailed, personalized energy data, make rational decisions based on them and act diligently on the insights he has acquired has not yet been realized.

However, in the EcoGrid EU project at Bornholm, the customers themselves have contributed to balancing electricity generation and load in the power system. The results showed that a real-time price signal can be used to activate flexible consumption. It also demonstrated that the greatest peak load reduction in households is achieved when using equipment that enables an automatic response to price signals, as opposed to when using manual solutions.

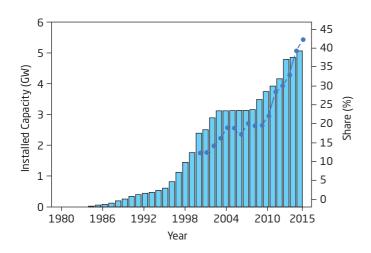
THE DANISH MODEL

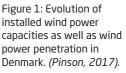
The Danish experiences have shown that, by means of a consistent energy policy with ambitious renewable energy goals, enhanced energy efficiency and support for technical innovation and industrial development, it is possible to sustain significant economic growth, a high standard of living and a high level of security of energy supply, while reducing fossil fuel dependency and mitigating climate change.

The Danish model is fairly unique, as Denmark has historically been one of the most successful countries in supporting the deployment of wind-power generating capacities. Starting from 1979, capacity increased steadily (Figure 1). Major wind-power developments are planned. As of today, wind power is supplemented by non-negligible solar-power capacities, reaching nearly 800 MW by the end of 2015. The successful deployment of capacities and subsequent integration of renewable energy generation is part of a broader evolution from a centralized to a decentralized system of power generation in the country (*Pinson*, 2017).

The current residential electricity sector in Denmark

Residential electricity consumption accounts for about 30% of total electricity consumption. There are approximately 2.8 million residential customers in Denmark. For households and other small consumers, there is currently no legal requirement to measure electricity consumption on an hourly basis: it is sufficient to record consumption monthly or annually. A smart grid strategy drawn up in 2013 envisages metering and settlement by the hour for all consumers by 2020. (*Danish Ministry of Climate, Energy and Building, 2013*).





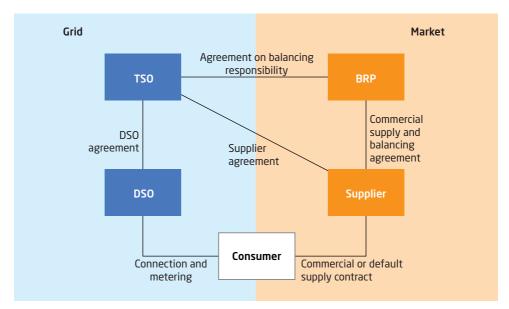


Figure 2: Electricity market roles and contractual relations:

Suppliers enter into a standard contract with Danish Energy Net, the umbrella organisation of network companies. Distribution System Operators (DSOs) are responsible for operating and maintaining the lower voltage infrastructure. The DSO is responsible for metering and owns the meters. The Danish Transmission System Operator (TSO) is responsible for operating and maintaining the high and medium voltage infrastructure. The company is a monopoly owned by the Danish state and regulated based on a cost-plus system. Balancing Responsible Parties are economically responsible towards the TSO to have a balanced portfolio in every single hour. (*Kitzing, 2016*).

The retail electricity market in Denmark has been fully liberalized since January 2003. All electricity consumers have the freedom to choose their electricity supplier. However, use of the electricity network is not part of the free market. The electricity infrastructure is a natural monopoly, both locally (distribution) and nationally (transmission)

Energy regulation and taxes

The Danish Energy Regulatory Authority (DERA) monitors the activities of energy companies. The TSO Energinet.dk has a broad range of obligations, including market monitoring tasks.

Danish energy taxes are three times the European average

Household customers in Denmark pay a comparatively high price for electricity. The cost of energy represents only around 20% of the overall price, and energy taxes are three times the European average. The low share of the cost of energy in the total household energy bill means that the price signals from the market that should stimulate demand response are diluted thus lowering the response. (*Kitzing, 2016*).

District heating as flexibility provider

46% of the net demand for heating in

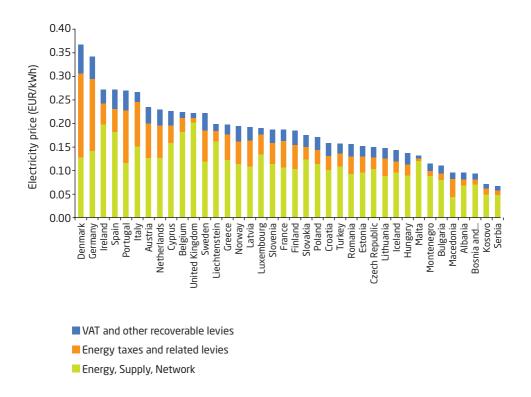


Figure 3: Residential electricity prices in European countries. (Kitzing, 2016).

Denmark is currently covered by district heating, mainly produced by combined heat and power (CHP) plants. Interactions with the district heating system can provide additional flexibility in operating the electric power system by generating heat from CHP plants during periods of high electricity prices or from heat pumps and electric boilers during low electricity price periods. In addition, heat storage, combined with relocation technologies, can provide cost-effective energy storage capacity. Exploiting the existing synergies between these systems can improve the efficiency and flexibility of the overall system and facilitate the penetration of renewable energy sources. Large-scale heat pumps, electric boilers and heat storage have been investigated as sustainable alternatives to CHPs. However, major challenges remain to the large-scale development of these technologies, among others the current taxes on electricity-based heating (*Pinson, 2017; Skytte et al, 2017*).

SYSTEMS SOLUTIONS Flexibility and demand response

Based on scenario development by the Danish Climate Commission, the development of the Danish energy system in the medium term (2030) and in the long term (2050) has been analysed. In the short term, the aim is to investigate the effects of having flexible or inflexible electric vehicles and individual heat pumps, and in the long term the effects of changes in the load profiles due to the changing weights of the demand sectors. The results show that, even with a limited short-term electric car fleet, there will be a significant impact on the energy system, the system's ability to integrate wind power and the demand for condensing the power generating capacity of the system. Charging patterns and flexibility have significant effects on this. Likewise, individual heat pumps may affect the system's operation if they are equipped with heat storage facilities.

The analyses also show that long-term changes in the curve profiles for electricity demand have little impact on the performance of the energy system . The flexibility provided by heat pumps and electric vehicles in the long term overshadows any effects of changes in hourly demand curve profiles. (*Skytte, Pizarro and Karlsson, 2016; Østergaard, 2015*).

	Projected electricity consumption [GWh]			Change	
	2012	2020	2030	2012-2020	2012-2030
Households	9750	9774	10042	1.0025	1.0299
Agriculture	1847	1818	1895	0.9841	1.0255
Industry	7309	7983	8419	1.0922	1.1520
Private service	9604	9937	10801	1.0346	1.1246
Public service	2412	2272	2355	0.9418	0.9763
	30922	31783	33512	1.0278	1.0837
Electrical vehicles	0	140	660		
Individual heat pumps	73	431	778		
Total	30995	32355	34949	1.0439	1.1276

Table 1: Projected electricity demand for aggregated categories of customers in Denmark. (Østergaard, 2015).

Flexibility by means of large-scale aggregated systems

A large number of units with flexible power consumption are expected to be part of the future power system. In Denmark, examples of these units include electrical heat pumps for heating in buildings and electric vehicles with batteries that can be charged and discharged. If pooled together in a large-scale aggregated system, these smaller consumption units could potentially offer the power system flexibility. They can help to partially balance the fluctuating power production caused by renewable energy sources. In real-time electricity markets, the aggregated units can help minimize the imbalances caused by forecasting errors and in general provide ancillary services. Instead of tracking wind power directly, it is currently much more realistic to interface with electricity markets.

This is an example of a large-scale optimization problem that must be solved reliably and in real time. The so-called Douglas-Rachford splitting can be applied to solving this problem. The resulting power balancing performance runs in a closed loop, while the local constraints and objectives for each unit are satisfied and the aggregator operating costs are reduced (*Halvgaard, Vandenberghe, Poulsen, Madsen and Jørgensen, 2016*).

Benefits and challenges of demand response

Demand response has the potential to bring about a great number of benefits, but there are a number of challenges that must be overcome before it can be considered a valuable contribution to the power system. The overriding issue is the lack of experience

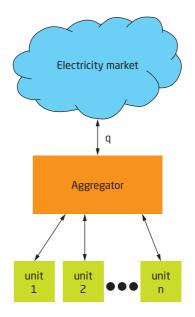


Figure 4: Aggregator role and portfolio of units. The aggregator gets a consumption plan q to follow from the market. (*Halvgaard, Vanden*berghe, Poulsen, Madsen, and Jørgensen, 2016).

and understanding of the nature of demand response, particularly at the system level, where demand from many different sectors and applications is aggregated. Nonetheless it is clear that this resource is highly diverse, so using a single model type to represent all demand is unrealistic.

Similarly, it is evident that demand does not fit the conventional model of economic rationality. The interaction of end-users with demand and the constraints of appliances themselves mean that the resulting demand profile exhibits a non-linear, time varying, dynamic and stochastic relationship to price, even in the best-case scenario, where the price response is determined through the automated control rather than through a response from the end-user. (*Møller* and Andersen, 2015; Katz, Andersen, and Morthorst, 2016)

It is therefore necessary to adopt novel approaches to modelling. In particular, models must be extended to incorporate demand of many different types, to consider the aggregate behaviour at the system level and to show how it interacts with other system resources.

A further aspect of demand response that warrants attention is the uncertainty of the response. Demand is affected by a number of stochastic variables, including the weather and the sheer randomness of end-user behaviour, and consequently the response of demand to price or other control signals is uncertain.

If the intention is to use demand response for the provision of system services, it is imperative to determine the reliability with which the service can be provided.

Demand response, where it is currently employed, participates in the power market only to a limited extent. Current market structures are poorly suited to demand response, and consequently its most beneficial aspects cannot be accessed. Novel market structures should be investigated, and this should be conducted in conjunction with the development of detailed demand response models.

By considering demand response only in isolation, using simplistic models and in the context of existing market frameworks, a full and accurate assessment of the benefits of demand response cannot be made. Novel, integrated approaches are required to reveal its full potential (O'Connell, Pinson, Madsen and O'Malley, 2014).

Load shift incentives for households

Although the demand side is just one flexibility option among others, response from both traditional and new loads (e.g. heat pumps and electric vehicles) will play an increasingly important role in the future. If demand response is to become significant at the household level, we need to know how to make customers adopt flexible technologies and behaviour, as well as evaluate its potential costs and benefits. A large-scale field study has been started in southern Denmark to investigate this.

The results show that flexibility on the demand side can be a helpful and valuable strategy. It is important, however, to keep in mind the extent to which small consumers are able to contribute manually. The ideal case with elastic demand reacting to real-time price signals is likely to be limited to automatically controllable loads that can be shifted without any loss of comfort to the consumer. Traditional household demand is more likely to contribute through simplified signals. The ideal case produces significant benefits of around 7% in a new long-term equilibrium, but the effects of the simplified structures are clearly limited (*Katz, 2015*).

Demand response from supermarket refrigeration

Supermarket refrigeration systems offer demand response capabilities, for example, for participation in the regulating power market. The energy-limited nature of demand response from refrigeration is the key

	B1	B2	B3
2 DR Block Offers	9.54%	18.10%	19.70%
3 DR Block Offers	17.10%	23.42%	21.25%
4 DR Block Offers	20.81%	23.42%	25.13%
5 DR Block Offers	21.23%	23.43%	25.13%
6 DR Block Offers	21.43%	23.63%	26.00%
Fully Modelled Demand	36.78%	41.80%	43.44%
Limited Temperatur Range	24.45%	28.72%	34.22%

Table 2: Cost reductions for regulating power procurement when the demand response resource is represented with a varying number of blocks. (O'Connell, Pinson, Madsen, and O'Malley, 2016).

consideration in this context. By restricting the operating regions of the supermarket refrigeration system, there is a simple relationship between the available up- and down-regulation of power, and the available demand response can be represented in a manner that is sufficiently simple to communicate to a market operator in the form of a bid for the provision of regulating power. Two novel contributions to research into demand response have been used. The first is a method of defining block bids that populations of flexible demand units can offer to the power system or market operator. The block offers reflect the load-shifting abilities of individual demand units, given their flexibility in providing a response to the power system and the subsequent necessity of energy recovery. The second is an optimization framework to dispatch these block offers for demand response alongside conventional generating units for the provision of regulating power. An example of the results is presented in Table 2. See also the section on EnergyLab Nordhavn below.

Flexibility via energy markets

The most likely developments in the Nordic and Baltic region will be the substantial penetration of VRE in the technology mix. This poses the challenge of managing greater levels of uncertainty and variability in the operation of power systems. To address this challenge, flexibility – defined in the Flex4RES project as a measure aimed at keeping a balance between generation and consumption – must be activated. A diverse mixture of resources on both the demand and supply sides and the role of enablers, such as grid infrastructure, are crucial to keep the necessary balance between supply and demand.

The Nordic power market is the main driver of flexibility in the region. Furthermore, interconnection capacity is well developed throughout the region. However, because the energy market was not originally designed to handle large shares of VRE, certain rules may have to be redesigned.

As a result of the typically higher costs of

12:00 the day before		1 hour before delivery	
ELSPOT	ELBAS	REGULATING POWER	
Day-ahead	Intra-day/Adjustment	Real-time/Balance	
- Hourly schedule for next day - Needed by slow plants	- Allow schedule changes - Important for VRE	 Ensures real-time supply/demand balance Important for compensademand calculation error 	ating

Figure 5: Market structure at the Nordic power market with the three physical markets: Elspot, Elbas and Regulating Power. (Bergaentzlé, Boscán, Skytte, Soysal, and Olsen, 2016).

flexible supply as compared to VRE, flexible plants are less profitable to operate and to invest in. In hours with little VRE generation, security of supply and resource adequacy could be challenged. Thus, an important open question for policy design is whether the existing Nordic power market can actually handle this problem without introducing capacity mechanisms.

Regarding the regulatory framework, flexibility is not an explicit goal of existing policy, and both drivers and barriers exist. Hydropower is a case in point. Restrictive directives concerning water and rivers limit both the deployment and the flexible operation of large-scale hydropower plants in most Nordic countries.

The role of nuclear power in the region will also have an impact on flexibility. Sweden has a policy which is increasingly loading financial conditions on nuclear producers, and Lithuania is phasing out nuclear power. These developments leave room for dispatchable technologies to keep operating, despite the fact that larger shares of VRE tend to depress the price level and the number of hours with prices high enough to operate large dispatchable plants. Finland plans to add new nuclear facilities, thus increasing the inflexibility of the system and the need for other sources of flexibility.

An important potential for flexibility in the region is the coupling of electricity markets with the markets for heat, gas and transportation which can be done both at transmission and distributed levels and should be done in a smart way in order to optimize the system stability.

Another important potential source of flexibility is VRE producers themselves. RES support schemes should be explicitly linked to market prices, and there must in addition be an explicit regulatory incentive for VRE producers to act flexibly (*Bergaentzlé, Boscán, Skytte, Soysal and Olsen, 2016*).

Analysing the electricity spot price

A way to analyse spikes and drops in the electricity spot price is to use the so-called Independent Spike Models (ISM) for electricity spot prices that use regime switching. In a research project, these models were fitted to the Nord Pool spot data to characterize the size and intensity of these deviations. The model was then used to evaluate quantitatively the effects when modifying consumption in order to mimic how additional renewables are integrated into the power system, or conversely the effects when smoothing consumption by using strategies that can be implemented in smart grids. After considering several variables, it was found that consumption can improve forecasts in all directions (going to and from spikes or drops), resulting in a model that is significantly better statistically than the corresponding time-homogeneous model in describing the extreme dynamics in the Nord Pool electricity spot market (Lindström, Norén and Madsen, 2015).

Smart meters could enhance demand-side flexibility

Smart meters are being rolled out in most countries, and changes are being introduced in retail electricity markets. This is paving the way to developing demand-side flexibility further. However, it is the regulatory frameworks and the market conditions that ultimately determine what business models will emerge and will be consolidated. At present, there are no clear business cases for consumers to be flexible. In that respect, electricity tariffs may have to be redesigned with the introduction of dynamic tariffs in order to strengthen the price signal transmitted by the wholesale market without distorting it and eventually to improve the business case for load adjustments (Bergaentzlé and Skytte 2017).

Overall, therefore, the Nordic-Baltic region has a quite flexible power system, but important challenges lie ahead, particularly those stemming from the greater reliance on VRE. Consequently, it is of fundamental importance to address the market and the regulatory changes that need to be introduced in a timely manner (*Bergaentzlé, Boscán, Skytte, Soysal and Olsen, 2016*).

Flexibility in power consumption

Scandinavia was one of the first regions in the world to liberalize its electricity sector. The market operator for Scandinavia, now also covering other countries, such as the UK and the Baltic States, is Nord Pool. In both markets and operations, the forecasting of renewable energy generation is of the utmost importance. Denmark was one of the first countries to integrate forecasts into operational practice.

Flexibility in power system operation is high in Denmark, thanks to the system's interconnections, as well as the CHP plants. Flexibility in electric power consumption is seen as providing a potentially new degree of freedom in power system operation, being also relatively cheap, or at least competitive with other flexibility options in terms of operational costs, while requiring limited investment costs. Substantial changes have also been made in the natural gas market. A gas exchange, Gaspoint Nordic, has been established so that the players have the market place they need to trade natural gas. Utilizing power-to-gas in Denmark reduces total system costs and the curtailment of wind power, thus highlighting the benefits of investing in this new technology (Pinson, 2017).

The EcoGrid EU demonstration project for large-scale smart grids

One of the world's largest research and demonstration experiments, the EcoGrid EU project, was initiated in 2011 on the Danish island of Bornholm. The project involves nearly 2000 households and small businesses taking part in a market-based demand response experiment. The hypothesis of the project was that electricity markets could evolve so as to issue prices that would optimally support and control demand response by taking advantage of the dynamic and conditional elasticity in demand. In practice, this conditional dynamic elasticity is linked to the thermal inertia of buildings, flexibility in the charging patterns of electric vehicles, etc.

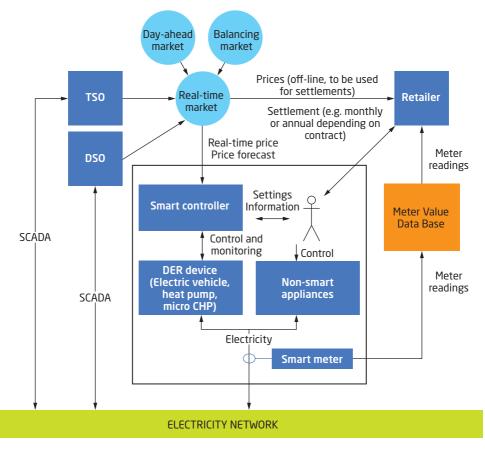
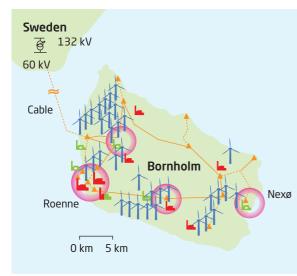


Figure 6: Complete architecture of the EcoGrid EU experiment, combining control aspects to emulate demand response, market concepts to operate it, as well as metering and settlement aspects. (*Pinson, 2017*).

The evaluation revealed that, even though demand response could help, difficulties in predicting the localized demand response potential for small groups of electric loads, combined with the uncertainty inherent in such responses, was potentially hampering the viability of demand response as a practical solution (*Pinson, 2017*).

Lessons learnt from EcoGrid EU

In the EcoGrid EU market, the customers themselves contribute to balancing electricity generation and load in the power system. The results show that a real-time price signal can be used to activate flexible consumption. By using a five-minute real-time signal, the total peak load is reduced by approximately 670 kW or 1.2% of the peak load on Bornholm. Households with equipment to control their heating systems so they respond automatically to price signals accounted for 87% of peak load reduction.



In a replication perspective, customer involvement is the key to success (*EcoGrid EU*, 2015).

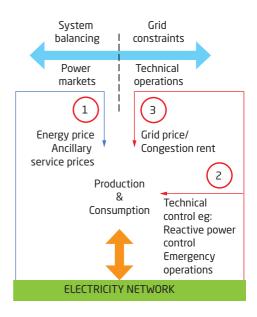


Figure 8. The EcoGrid EU demonstration phases. (*Ding, 2012*).

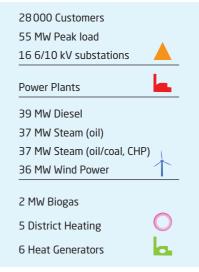


Figure 7. The Bornholm distribution system. (Ding, 2012).

Demand response modelling based on EcoGrid EU project data

In a research project, algorithms responding to real-time electricity prices were researched and benchmarked according to comfort and cost. After this simulation, real power system data from the EcoGrid EU project and methods to quantify an aggregated load were developed. These methods can be used for real-time operation and to support investment decisions. More specifically, they can be used to forecast the response to electricity pricing and to classify different types of customers. The proposed models are then embedded in new five-minute electricity markets for system balancing and local congestion management. The main conclusion of this study is that political and social initiatives to promote changing energy behaviour are just as important as technological developments (*Larsen E.M.*, 2016).

Smart grid conformance tests

To minimize the add-on costs for smart gridready products for domestic domains like PV systems, heat pumps and EV home chargers, the aim of the smart grid Open project (SGO) was to develop a smart grid-ready conformance test method. Different standards were reviewed and assessed. The SGO project found that a very simple smart grid control using two digital lines as implemented in Germany for the grid control of heat pumps and PV systems may give 80% smart grid effect for 20% complexity and cost, not only for heat pumps, but also for most domestic devices, including battery energy storage (*Technological Institute, 2017*).

Towards fully renewable energy systems in Denmark

The Danish energy system is characterised by its strong interconnections with neighbouring countries. An overview of interconnections as of 2014 is given in Figure 9. However, reaching a fully renewable energy system is not only a matter of electricity infrastructure, but also of placing the emphasis on other aspects, for example, market mechanisms that support renewable energy integration and enhance flexibility (demand response, electric vehicles and storage, synergies with gas and electricity systems) (*Pinson, 2017*).



Figure 9: Interconnection to the Danish power system. (*Pinson, 2017*).

Figure 10: The EnergyLab Nordhavn project uses the new Copenhagen quarter Nordhavn as laboratory for energy technology. Read more at http://www.energylabnordhavn.dk/. Photo: DTU



Figure 11: Middelgrunden windfarm in front of Copenhagen Harbour.



EnergyLab Nordhavn: Towards a carbon-neutral Danish capital

Denmark's capital, Copenhagen, aims to be a carbon-neutral city by 2050. In practice, a relevant initiative is the development of the Nordhavn neighbourhood to become a smart living lab for energy and its connection with other infrastructure. The EnergyLab Nordhavn project places emphasis on energy system integration, interaction with the transportation system, the development of ICT- and storage-based management solutions for increased flexibility in power system operation, active distribution network planning etc. (*Pinson, 2017*).

The Danish goal to become independent of fossil fuels by 2050 is realistic

Denmark's 'Partnership Smart Energy Networks - Research, Development and Demonstration' has drawn up fifteen recommendations for research, development and demonstrations in the area of smart energy, all supporting the national goal of becoming independent of fossil fuels by 2050. Several road-map reports indicate that it is both technically possible and economically feasible to achieve this. The Partnership believes that smart integration of the energy system is the key to the solution. However, this transition in respect of the energy system will take time, with many possible solutions and paths to follow, and many strategic decisions to be taken along the way (Nørgård, 2016).

CONSUMER BEHAVIOUR AND BUILDINGS

Many households in Denmark have installed Solar-power systems or household windmills. Thus, households are expected to contribute to the integration of variable renewable energy sources into the energy system by providing flexibility. The ongoing smart meter roll-out is a first step in this direction, but it is not enough to prompt consumers to adopt it. The current pricing system does not allow or encourage very much flexibility from residential electricity customers. New regulations and fee structures are probably required. New types of electricity consumption, especially heat pumps and electric vehicles, need to be embraced and integrated properly into the system so that their potential to provide flexibility can be exploited. This might require more dynamic electricity supply tariffs, network tariffs and even dynamic taxation (*Kitzing, 2016*).

Consumer behaviour in transitions to new energy systems

Current government information policies and market-based instruments aimed at influencing the energy choices of consumers often ignore the fact that consumer behaviour is not fully reducible to individuals making rational and conscious decisions all the time. To achieve a transition towards sustainable energy, an approach that goes beyond individual consumer choice and puts shared routines and system change at its heart is needed.

How do users adopt new technologies?

A number of studies of how users actually adopt new energy technologies have shown that consumer behaviour involves much symbolic, practical and cognitive work beyond the initial purchasing decision. Users not only learn how to use the new technology, they also develop new usages and fit them to their existing everyday routines, thereby gradually altering these routines. Users are also instrumental in providing advice to other, less experienced and/or potential users. This side of user activity is not captured by formal economic models, which tend to see the user mainly as a mere choice-maker in the market.

In contrast, the literature on technology appropriation suggests that consumption is an active process in which a large group of consumers construct and share the meanings of new technologies and help to define new usage practices, thus helping to consolidate and stabilize new energy systems. After stabilization, however, many ordinary consumers indeed buy a product, plug it in and use it according to pre-defined meanings and preferences as configured by the early majority of creative user-consumers. This is important in capturing the role of users in disruptive system change (*Schot, Kanger and Verbong, 2016*).

Users are important stakeholders in the development of smart grids

User roles should be taken more seriously in relation to smart grids, and experts should regard users as important stakeholders and potential participants in the innovation process. The focus on social practices will help the move away from a technology push approach to smart grids. The provision and consumption of energy is usually not a goal in itself: rather, the energy system enables all kinds of social activities that need energy. In modern society, this includes almost all social activities, ranging from the energy needed to provide comfort (heating and cooling in houses) to almost all forms of communication and entertainment.

The user as innovator

In the innovation studies literature, users have traditionally been conceptualized as buyers or consumers, but in recent decades we observe a shift towards the study of the so-called 'democratization' of innovation, meaning that the field acknowledges that (and researches how) users can play roles such as co-producers of innovations as well. This trend is supported by improvements in computer and communications technology that enable users to develop their own new products and services.

So, in what ways can citizens influence the development of the smart grid? We can attempt to create a typology of roles by juxtaposing them according to two dichotomies (see Figure 12). The first dichotomy is that between restrictive or barrier-like user roles and enabling or empowering ones: users can either aid the transition to smart grids or block it. The second dichotomy is that between passive and active roles.

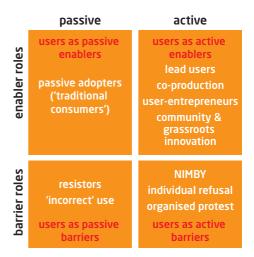


Figure 12: User roles in sustainable energy innovation. (Verbong, 2016).

Passive barrier roles

In the lower left quadrant, we find the passive barrier roles: e.g. not participating in using the available options provided by the smart energy system.

• Passive enabler roles

In the upper left quadrant, we find the 'traditional consumer': the passive adopter of an innovation.

• Active barrier roles

More active user barriers are found in the lower right quadrant: active resistance by individual households to a smart grid innovation (e.g. refusing to install smart meters or to give access to data) and the so-called NIMBY ('Not In My Back Yard') phenomenon.

Active enabler roles

Active enabler roles reside in the upper right quadrant. For example, users can become so-called 'lead users' who act as key sources of the information and ideas that lead to innovations.

These possible user roles have their own complex social dynamics and generative mechanisms (*Verbong, 2016*).

The contribution of passive consumers to demand response

Dynamic tariffs in particular are gaining interest as a way of changing consumption patterns. Indirect control is one such dynamic tariff that uses an incentive signal, e.g. a real-time price, to influence the load. Indirect control does not require an exact response from any one customer, but with a large number of loads that exhibit somewhat similar behaviour, a statistically likely response can be forecast. Methods have been developed to characterize price-responsive demand from the EcoGrid EU demonstration in a way that was a bid into a real-time market. The experiment uses a market framework to schedule regulating power from conventional forms of generation and DR to meet the real-time balancing needs of the system, needs which are growing due to increased production from wind-power.

*	253 households with smart meters	No pricing information	279/621 kW average/peak load
Reference			
Manual	455 households with smart meters	Receive real-time pricing, but must alter consumption manually	287/750 kW average/peak load
Fidiludi			
💏 💣 脊 ІВМ НР	195 households with smart meters and automation equipment	Heat pumps react autonomously to prices	317/710 kW average/peak load
М М М	322 households with smart meters and automation equipment	Resistive electric heating reacts autonomously to prices	394/854 kW average/peak load
TNO HP	84 households with smart meters and automation equipment	Heat pumps react autonomously to prices	123/293 kW average/peak load
Siemens EH	398 households with smart meters and automation equipment	Resistive electric heating, water boilers and control- lable PV react to aggregator control	300/810 kW average/peak load

Table 3: Summary of EcoGrid EU customer groups. (Larsen, 2017)

Customers were grouped and analysed according to the manufacturer controlling the devices. A number of advanced statistical models were used to show significant flexibility in the load, peaking at 27% for the best performing groups (*Larsen, 2017*).

A bidding model for a cluster of priceresponsive consumers

Another direction for price-responsive consumers to go in is to join up as a cluster of flexible power consumers, where flexibility is understood as the ability of each consumer in the cluster to change her consumption depending on the electricity price and her personal preferences. The portfolio of flexible consumers is managed by a retailer or aggregator, which bids in a wholesale electricity market on behalf of its customers. Traditionally, this bid would simply be a forecast of the load. However, the price response of the pool could also be captured through a more complex, but still quite common market bid that consists of a stepwise marginal utility function, maximum load pick-up and drop-off rates, and maximum and minimum power consumption in a manner analogous to the energy offers made by power producers. A case study has shown that the estimated bid successfully models the price response of the pool of houses in such a way that the mean absolute percentage error incurred when using the estimated market bid to predict consumption within the pool of houses is kept between 14% and 22% for all the months of the test period (Saez-Gallego, Morales, Zugno and Madsen, 2016).

A social science based agenda for research on smart grids

A technology-dominated approach to smart grids will very likely not produce the intended results. Therefore, a new social science-based agenda for research into smart grids is needed. The main elements are:

- Developing more socially embedded visions for smart grids and the services they will provide;
- A shift in the focus on developing smart grid components and systems towards the services they will deliver;
- Development and testing of innovative user-centred business models and ecosystems.

Generally, more attention should be paid to the potentially innovative role of users in smart grid development and in sustainable innovations more broadly (*Verbong, 2016*).

Experience with consumer communications and involvement

The EcoGrid project has acquired experience of the needs of the electricity consumer and the demand for smart grid-related technology. The most active participants in EcoGrid were men over fifty years of age and two-person households. This may indicate that smart grid solutions must be designed and marketed differently if they are to succeed in involving women, younger people and families more actively in the future.

Recommendations for new smart grid projects:

• Communication strategy and contingency plan: From the very beginning of the project, it is important to anchor it broadly. A contingency plan should be drawn up to avert adverse consequences of unplanned events such as server crashes, etc.

- Pre-testing of the project: A pre-test should be conducted, including the entire value chain and a limited number of users.
- Requirements for technological solutions and usability: Remote updating of equipment should be possible so that errors can be solved centrally. There must be user access, e.g. to interrupt automatic control so that the customer can switch to manual control

(Trong, Salamon and Dogru, 2016a; Trong, Salamon and Dogru, 2016b).

Human agency in smart grid security and resilience

The internet will be used as part of the smart grid infrastructure, e.g., to enable communication with end-user services. Consequently, developing technologies to ensure the security and resilience of smart grids and the internet is of paramount importance. Human agency will affect how electricity grids could be made "smarter" using ICT. Individuals can have several roles:

- Customer and small-scale producer: individuals who have a contractual relationship to the electricity supplier and to the distribution system operator (DSO). Increasingly the customers themselves become suppliers of electricity from, e.g., photovoltaic (PV) installations.
- Consumer and user: end-users of the electricity grid who want to use the power to have it warm or cool, to run a computer in their business or to travel to work.
- Citizen: individuals who have the right to vote for their political views and the duty to contribute to the public good as taxpayers.

A differentiated view of human agency helps predict the consequences for security and resilience and indicates how one should act accordingly in the innovation process. This is the aim of the EU-funded SPARKS project (*Kubeczko*, 2015).

Smart meters and smart apps

Denmark has passed legislation requiring all electricity consumers in Denmark to have intelligent meters installed by the end of 2020. This has initiated discussions among energy system stakeholders about utilizing the data for purposes other than billing, e.g. load forecasting and consumer classification. Transitions between consumer classes are relevant when planning for future power supplies, and the insights from smart meter analytics can help identify changes in consumption and transitions. A review has shown that, using only consumption data, electricity consumers can be segmented into smaller and more homogenous clusters. It is generally accepted that smart meter data is very applicable for cluster analysis, with overall satisfactory performance for individual methods. It is appropriate to move the focus from the simple classification of smart meter consumption data to show how these findings provide value in a societal setting. This could apply to tariff development or in consumption flexibility analysis (*Tureczek, 2017*).

Smart meters for consumer classification

Even for similar residential buildings, huge variations in energy consumption can be observed, mainly due to the different behaviour of occupants, and this impacts on both thermal (temperature setting, window opening, etc.) and the electrical (appliances, TV, computer, etc.) consumption. Given the increasing use of smart metering, the opportunity and potential for the indirect observation and classification of occupants' behaviour is possible. By using the so-called Hidden Markov Models to make frequent measurements of electricity consumption from smart metering data, customer behaviour can be classified (Liisberg, et al., 2016).

SSmE smart app

Most people in the Global North are characterized by passive engagement in energy in their daily lives. A smart app pilot project in Holland aims at involving customers

more. The project rests on the assumption that, when provided with information about energy usage, individual participants are willing and able to adjust their energy consumption patterns. Usage data is available in real time, enabling the user to monitor the level of electricity consumption with an app, the SsmE app. This app has been developed by the Dutch SSmE project (Samen Slim met Energie, or Together Smart with Energy).

Results show that the vision of the tech-savvy individual, who, through smart appliances, can draw on detailed, personalized energy data, make rational decisions based on them and act diligently on the insights he has acquired was not realized in the SSmE project (Verkade, 2017).

PEAKapp project

Another smart app experiment is PEAKapp. The overall goal of PEAKapp project is to



Figure 13: Snapshots of the SSmE app. (Verkade, 2017).

develop, validate and launch an ICT ecosystem that motivates and supports citizens to adopt and sustain behavioural changes which will reduce their household energy consumption and shift consumption to hours with high shares of VRE in the energy system. The ICT ecosystem will require smart meters. Validation of the ICT ecosystem will be carried out in some EU countries, and analyses of the collected data will allow insights into consumer behaviour (*PEAKapp*, 2017).

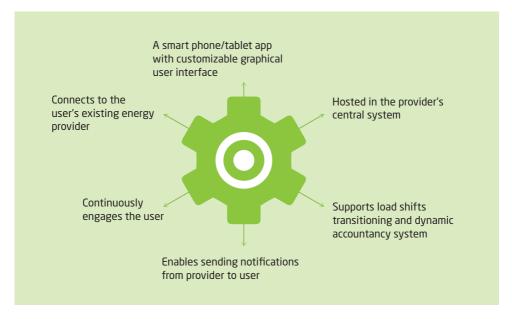


Figure 14: PEAKapp functions. (PEAKapp, 2017).

The variability of energy use in residential buildings

Variations in the energy use of buildings are considered significant with respect to their integration into the overall energy grid. Especially where integrated district energy systems are dominant, accurately predicting the operational energy use of a building or cluster of buildings is crucial. These variations are mainly attributed to the following areas:

- a) The passive parameters, mainly representing the building envelope and possibly the equipment; and
- b) the active components, representing users and climate.

Uncertainty analysis has proved to be the main approach to determining the effect of

uncertainty on building energy performance. Moreover, sensitivity analysis is conducted to analyse variations in building parameters and their effects on energy use.

A new study aims at identifying the parameters that are responsible for the variations in energy performance by investigating simple building models. Secondly, by introducing a sensitivity analysis, the key variables that affect energy use in residential buildings can be determined and a new methodology proposed for parameter optimization. The derived results will be evaluated based on a reference scenario and will create a methodology for realistically estimating the magnitude of key variables in building performance. The next step will be to apply this methodology to housing stock models *(Gianniou, 2016).*

Flexibility in private homes

The DREAM project - Danish Renewable Energy Aligned Markets - has gathered insights into the complex task of implementing flexibility in private homes, municipal buildings and industry in areas without collective heating systems. Here, it is important that as many heat pumps as possible will replace oil-fired burners. The project used anthropological, technical and economic analysis. It identified potentially commercially viable solutions for implementing smart grid-ready equipment to entities with relatively low energy consumption, like private houses, the public sector and small industries in areas where the only collective energy source available is electricity (Teknologisk Institut, Dansk Energi, Deloitte, Billund Kommune, Danfoss, Billund Varmeværk, Energinet.dk, 2015).

Technology and social aspects are equally important

A greater focus on social practices will help the move away from a technology push approach to smart grids. The provision and consumption of energy is usually not a goal in itself: rather, the energy system enables all kinds of social activities that need energy. In

modern society, this includes almost all social activities, ranging from the energy needed to provide comfort (heating and cooling in houses) to almost all forms of communication and entertainment.

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Smart grid Transitions: System solutions and consumer behaviour

This publication summarises a selection of research projects contributing to the objectives of Annex 7 of the International Smart Grid Action Network (ISGAN) project on smart grids.

ISGAN - the Implementing Agreement for a Co-operative Programme on smart grids functions within a framework created by the International Energy Agency (IEA).

The main objective of Annex 7 is to investigate institutional change associated with smart grid deployment. Using the framework of transition management, this Annex aims to encourage international, coordinated trans-disciplinary research activity in the social sciences supporting and complementing technology-oriented smart grid activities. A further goal is to collect information and knowledge from innovation studies, political science, institutional economics, sociology and energy law and make it palpable for policymakers and other stakeholders.

Finally, it aims to give support to policymakers in the field of smart grids by focusing on the direction, efficacy and efficiency of the energy system transition.

Read more: http://www.iea-isgan.org

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