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# Testing regulatory regimes for power transmission expansion with fluctuating demand and wind generation

Wolf-Peter Schill · Jonas Egerer · Juan Rosellón

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**Abstract** Adequate extension of electricity transmission networks is required for integrating fluctuating renewable energy sources, such as wind power, into electricity systems. We study the performance of different regulatory approaches for network expansion in the context of realistic demand patterns and fluctuating wind power. In particular, we are interested in the relative performance of a combined merchant-regulatory price-cap mechanism compared to a cost-based and a non-regulated approach. We include both an hourly time resolution and fluctuating wind power. This substantially increases the real-world applicability of results compared to previous analyses. We show that a combined merchant-regulatory regulation, which draws upon a cap over the two-part tariff of the transmission company, leads to welfare outcomes superior to the other modeled alternatives. This result proves to be robust over a range of different cases, including such with large amounts of fluctuating wind power. We also evaluate the outcomes of our detailed model using the extension plans resulting from a simplified model based on average levels of load and wind power. We show that this distorts the relative performance of the different regulatory approaches.

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## 1 Introduction

The European Union (EU) is undergoing a transformation of its energy system toward a highly renewable-based system. The European power system should be largely carbon-neutral by 2050 in order to reach the ambitious two-degree-goal, according to which global average surface temperature should be prevented from rising more than 2 degrees Celsius above pre-industrial levels. Along with substantial energy efficiency improvements, a promising strategy for decarbonizing the electricity sector is the large-scale expansion of renewable energy sources (RES) such as wind and solar power.

Wind power has two main characteristics. On the one hand, the geographical distribution of wind power resources is uneven. For example, the best European wind resources are mainly located along shorelines and off-shore. On the other hand, wind has severely fluctuating generation patterns.<sup>1</sup> Its large-scale integration into electricity systems thus requires substantial upgrades and extension of existing transmission networks in order to connect distant generation sites and to even out regional imbalances due to those fluctuations. Since electricity transmission networks are natural monopolies, they need to be regulated in order to promote expansion in such a way that social welfare is also optimized. Network owners have no incentives for removing transmission bottlenecks if this reduces their profits in the form of congestion rent losses. Thus, incentive compatible network expansion must be ensured through economic regulation.

The regulation of transmission operations and expansion is widely discussed by regulatory economists. Finding optimal mechanisms is difficult given the specific physical characteristics of electricity networks such as negative local externalities due to loop flows, i.e., electricity flows obeying Kirchhoff's laws. A range of different regulatory schemes and mechanisms have been proposed and applied (Léautier 2000; Kristiansen and Rosellón 2006; Tanaka 2007; Léautier and Thelen 2009; Hogan et al. 2010). However, there is little research on optimal transmission regulation when realistic demand patterns and fluctuating renewable power are considered.

In this applied paper we aim to enhance the economic understanding of how to regulate and expand transmission networks in the context of realistic demand patterns and large-scale wind power in Europe.<sup>2</sup> We combine theoretical research on regulation of transmission expansion with an application to Europe while also deriving policy implications. We test the recently designed Hogan–Rosellon–Vogelsang price-cap mecha-

<sup>1</sup> Schill (2014) studies the effects of fluctuating wind and solar power generation on German residual load patterns.

<sup>2</sup> While we focus on regulated transmission expansion in the Western European transmission system, Egerer and Schill (2014) analyze RES-related network expansion requirements within the German system, taking also into account investments into power plants and storage.

nism (HRV, Hogan et al. 2010), which combines merchant and regulatory structures to promote the expansion of electricity networks. Another approach to transmission expansion is traditional central planning, which may either be carried out within a vertically integrated utility or by a regulatory authority. Another alternative is traditional cost-of-service regulation. In contrast, transmission decisions can also be determined in a totally decentralized, non-regulated way. We are then interested in the relative performance of these various regulatory regimes on transmission network expansion. In all cases, transmission output is defined as financial transmission rights, which are assumed to be auctioned off by a transmission company (Transco). We apply these mechanisms to a stylized model of the Western European transmission network. The transmission model represents real power flows, which allows for the inclusion of specific electricity network characteristics such as loop flows. We explicitly include both an hourly time resolution and fluctuating wind power, which substantially increases the real-world applicability of the approach. We solve the model numerically and compare welfare outcomes and the optimal levels of network expansion for a baseline and some sensitivity analyses. We also examine the drawback of applying a simplified model, which has been used in previous literature, based on average levels of load and wind power. To do so, we solve the simplified model and evaluate its extension outcomes under the actual fluctuations of load and wind power.

We find that network extension in Western Europe not only increases social welfare due to diminished congestion, but also leads to price convergence and therefore a large redistribution of social welfare.<sup>3</sup> Comparing different regulatory approaches, we find that a combined merchant-regulatory regime leads to welfare outcomes that are close to the optimum achieved by a social planner, and far superior to other modelled alternatives. We show that this result is robust over all modelled cases. We also find that the combined merchant-regulatory regime leads to a situation in which a substantial portion of the Transco's income consists of a fixed tariff part. The intertemporal rebalancing of the two-part tariff carried out by the Transco, so as to expand the network, is such that the fixed fee is considerably higher than the decrease of the variable part. The fixed tariff part also turns out to be relatively large compared to extension costs, a distributive issue that might be addressed through a proper choice of weight of profits in the welfare criterion. Yet exploring these distributive issues in detail is beyond the scope of this article and is left to further research. As for model simplifications, we find that these severely distort results on the relative performance of different regulatory approaches.

The remainder of the paper is structured as follows. Section 2 reviews the relevant literature. Sections 3 and 4 introduce the model and its application to a stylized Western European example. Results are presented and discussed in Sect. 5. We start with baseline assumptions (5.1), followed by three sensitivity analyses which reflect different assumptions on extension costs (5.2), increased wind capacity (5.3), and dif-

<sup>3</sup> For an Italian case study, Boffa et al. (2010) find that transmission expansion leads to cost savings for consumers. In our paper, we show that while removing congestion in the Western European interconnection harms consumers in Germany and France because of increasing spot prices, consumers in Belgium and the Netherlands benefit from network expansion.

ferent discount rates (5.4). The drawback of using a simplified model is evaluated in Sect. 5.5. The last section summarizes and concludes.

## 2 Literature

There are two main distinct analytical approaches to transmission investment: one employs the theory based on long-term financial transmission rights (LTFTR, merchant approach), while the other is based on the incentive regulation hypothesis (performance-based-regulation, PBR, approach). The PBR approach to transmission expansion relies on incentive regulatory mechanisms for a transmission company (Transco). One example is Vogelsang (2001, 2006), where price-cap regulation solves the duality of incentives for the transmission firm both in the short-run (congestion) and in the long-run (investment in network expansion). Equilibrium for this duality is studied by the peak-load pricing literature: in equilibrium, the per-unit marginal cost of new capacity must be equal to the expected congestion cost of not adding an additional unit of capacity (Crew et al. 1995). Alternative regulatory PBR approaches provide the firm with incentives to make efficient investment decisions through penalizing congestion (Grande and Wangesteen 2000; Léautier 2000, and Joskow and Tirole 2005). In the international practice, PBR schemes to guide the expansion of the transmission network have been applied in England, Wales, and Norway.<sup>4</sup>

In the Vogelsang (2001) two-part tariff regulatory model, incentives for efficient investment in the expansion of the network are obtained by the rebalancing of fixed and variable charges, while convergence to the steady state Ramsey-price equilibrium depends on the type of weights used. Ramsey prices result from the solution of the program, where a regulator seeks to maximize social welfare subject to the individual rationality constraint of a firm with increasing returns to scale. The prices are such that they differ from marginal cost inversely proportionally to the elasticity of demand. A Laspeyres index weight (previous period quantity weight) promotes intertemporal convergence of transmission tariffs to Ramsey prices, while average revenue weights (endogenous current period quantity weights) cause divergence from the Ramsey equilibrium (Armstrong et al. 1994).

The merchant approach to transmission expansion is based on auctions of LTFTRs. The long-run concept is important for investors of transmission expansion projects. Such projects usually have an installed lifetime of at least 30 years, so that auctions allocate FTRs with durations of several years. Incremental LTFTRs implicitly define property rights. FTR auctions are carried out within a bid-based security-constrained economic dispatch with nodal pricing of an independent system operator (ISO). The ISO runs a power flow model that provides nodal prices derived from shadow prices of the model's constraints. FTRs are subsequently calculated as hedges from nodal price

<sup>4</sup> During the 1990s, an 'uplift management rule' was applied in England and Wales (Léautier 2000). Such a rule made the Transco responsible for the full cost of an 'out-turn' plus any transmission losses. The out-turn defined the cost of congestion as the difference between the price actually paid to generators and the price that would have been paid absent congestion. In Norway, a revenue-cap approach—which precludes having to exactly define the output produced by a Transco—has also been used in practice (Jordanger and Grønli 2000).



differences. Externalities in electricity transmission are mainly due to loop flows that arise from interactions in the transmission network. The effects of loop flows imply that transmission opportunity costs and pricing critically depend on the marginal costs of power at every location in the network. Loop flows generate negative externalities to property right holders. In the merchant approach, the ISO retains some capacity or FTRs in order to deal with such externalities. Equivalently, the agent making an expansion is required to ‘pay back’ for the possible loss of property rights of other agents (Bushnell and Stoft 1997; Kristiansen and Rosellón 2010). In international practice, FTR auctions have been used in the US Northeast (NYISO, PJM ISO, and New England ISO), in California, as well as in Oceania.<sup>5</sup>

A second-best standard that combines the merchant and PBR transmission models is proposed by the *HRV* model. This is done in an environment of price-taking generators and loads. A crucial aspect is the redefinition of the transmission output in terms of incremental LTFTRs in order to apply the basic price-cap mechanism in Vogelsang (2001) to real world networks within a power flow model. This is mainly done to address loop flows in meshed networks through the use of point-to-point transactions and to achieve a well behaved transmission cost function.<sup>6</sup> The Transco intertemporally maximizes profits subject to a cap on its two-part tariff, but the variable fee is now the price of the FTR output based on nodal prices. Again, the rebalancing between the variable and fixed charges encourages the efficient expansion of the network.<sup>7</sup> The *HRV* mechanism is already tested in model-based analyses for simplified grids in Western Europe, the Northeast USA and South America (Rosellón and Weigt 2011; Rosellón et al. 2011; Ruíz and Rosellón 2012). The testing of the *HRV* regulatory model results in the Transco expanding the network such that prices develop in the direction of marginal costs. The nodal prices that were subject to a high level of congestion before the expansion converge to a common marginal price level. These results show that the *HRV* mechanism has the potential to foster investment in congested networks in an overall desirable direction. Yet these analyses neglect important peculiarities of real-world power systems.

In this applied paper we incorporate both variable power demand and fluctuating renewables into the regulatory logics of the *HRV* model. In doing so, we confirm the robustness of some key results obtained by Rosellón and Weigt (2011), who draw on a simplified model and assume unrealistic initial price differences between countries. Likewise, we aim to also contribute with a novel comparison of diverse regulatory mechanisms to the case of fluctuating and geographically dispersed renewables. We also show that such a comparison may be flawed when a simplified model is used.

<sup>5</sup> See Rosellón and Kristiansen (2013) for a detailed analysis on theory and practice of FTR auctions. There is shown the practical international implementation of such auctions as well as a discussion on its potential application in Europe.

<sup>6</sup> See Rosellón et al. (2012). Under a conventional linear definition of the transmission output—similar to the output definition for other economic commodities—well-behaved cost and demand functions may not hold in an electricity network with loop flows (see Wu et al. 1996). Decreasing marginal cost segments and discontinuities in costs can arise during a transmission expansion project.

<sup>7</sup> The *HRV* model aims to be applicable for any expansion project and in any type of transmission topology. Its piecewise differentiability and continuity is analyzed in Rosellón et al. (2012) and tested in Rosellón and Weigt (2011), Rosellón et al. (2011), and Ruíz and Rosellón (2012).

### 3 The model

Table 1 lists all model sets and indices, parameters, and variables. We assume a market design with nodal pricing based on real power flows and financial transmission rights (FTRs). A single Transco holds a natural monopoly on the transmission network. The Transco decides on network extension and auctions off transmission capacity in the form of FTRs to market participants. We do not explicitly model this point, but assume that expected FTR auction revenues are equal to congestion rents of the system. Accordingly, we just assume that the Transco maximizes profit, which consists of congestion rents and—depending on the regulatory regime—a fixed income part. Whereas the Transco is not involved in electricity generation, an independent system operator (ISO) manages the actual dispatch in a welfare-maximizing way. The ISO collects nodal payments from loads and pays the generators. The difference between these payments is the congestion rent, which is transferred to the Transco.<sup>8</sup> We model three different regulatory cases in which we assume the Transco to be unregulated regarding network expansion (*NoReg*), cost-regulated (*CostReg*), or *HRV*-regulated. We compare these regulatory cases to a baseline case without any network expansion (*NoExtension*) and to a welfare-maximizing benchmark (*WFMax*), in which a social planner makes combined decisions on network expansion and dispatch. The problem formulation entails two levels (bilevel programming). In the regulatory cases, the Transco's profit maximization constitutes the upper-level optimization problem. In the welfare-maximizing benchmark, the upper-level program represents the social planner's maximization problem. On the lower level, we formulate the ISO's welfare-maximizing dispatch as a mixed complementarity problem (MCP).<sup>9</sup> The combination of lower and upper level problems constitutes a mathematical program with equilibrium constraints (MPEC).<sup>10</sup>

We assume a standard linear demand function (1):

$$p_{n,t,\tau} = a_{n,\tau} + m_{n,\tau} q_{n,t,\tau}. \quad (1)$$

where  $p_{n,t,\tau}$  is the electricity price at node  $n$  in regulatory period  $t$  and hour  $\tau$ , whereas  $q_{n,t,\tau}$  describes the corresponding electricity demand. Given (1), the lower level dispatch problem consists of Eqs. (2)–(9). These represent an MCP formulation of the ISO's constrained welfare maximization problem, which is provided in Appendix 7.1<sup>11</sup> We model real load flows between single nodes with the simplified DC load

<sup>8</sup> More precisely, congestion rents are redistributed to FTR holders. The Transco's FTR auction revenues thus include these payments. As we do not explicitly model FTR auctions, we make the simplifying assumption that congestion rent is transferred to the Transco.

<sup>9</sup> Gabriel et al. (2013) give an introduction to complementarity modeling in energy markets. Further mathematical background is provided by Facchinei and Pang (2003).

<sup>10</sup> Hobbs et al. (2000) were among the first to apply an MPEC approach to power market modelling.

<sup>11</sup> We assume that the power plant fleet does not change over the whole modeled period. In the real world, we would expect interactions between generation capacity investments and transmission investments, as shown both theoretically and numerically by Sauma and Oren (2006). In a companion paper, we study the impact of a changing generation mix on both welfare-optimal and regulated transmission investment (Egerer et al. 2015).



**Table 1** Sets and indices, parameters, variables

Symbol	Description	Unit
<b>Sets and indices</b>		
$n, nn \in N$	Nodes	
$l \in L$	Line	
$s \in S$	Generation technology	
$t \in T$	Regulatory time periods	years
$\tau \in T$	Dispatch time periods	hours
<b>Parameters</b>		
$m_{n,\tau}$	Slope of demand function	
$a_{n,\tau}$	Intercept of demand function	
$\bar{g}_{n,s}$	Maximum hourly generation capacity	MWh
$c_s$	Variable generation costs	€/MWh
$ec_l$	Line extension costs	€/MW
$\varepsilon$	Price elasticity of demand at reference point	
$P_l^0$	Initial line capacity	MW
$I_{l,n}$	Incidence matrix	
$X_l^0$	Initial line reactance	$\Omega$
$B_{n,nn,t}$	Network susceptance matrix of period t	$1/\Omega$
$slack_n$	Slack node (1 for one node, 0 for all others)	
$\delta^s$	Social discount rate	
$\delta^p$	Private discount rate	
$r$	Return on costs (in case of cost-based regulation)	
<b>Variables</b>		
$wf$	Overall welfare	€
$\Pi$	Transco profit	€
$q_{n,t,\tau}$	Hourly demand	MWh
$g_{n,s,t,\tau}$	Hourly generation	MWh
$p_{n,t,\tau}$	Hourly electricity price	€/MWh
$\Delta_{n,t,\tau}$	Voltage angle	
$\lambda_{1,l,t,\tau}$	Shadow price of positive line capacity constraint	€/MWh
$\lambda_{2,l,t,\tau}$	Shadow price of negative line capacity constraint	€/MWh
$p_{n,t,\tau} = \lambda_{3,n,t,\tau}$	Shadow price of market clearing constraint (electricity price)	€/MWh
$\lambda_{4,n,s,t,\tau}$	Shadow price of generation capacity constraint	€/MWh
$\lambda_{5,n,t,\tau}$	Shadow price of slack constraint	€/MWh
$ext_{l,t}$	Line extension	MW
$P_{l,t}$	Line capacity of period t	MW
$X_{l,t}$	Line reactance of period t	$\Omega$
$fixpart_t^{CostReg}$	Fix tariff part in case of cost-based regulation	€
$fixpart_t^{HRV}$	Fix tariff part in case of HRV regulation	€

flow approach (Schweppe et al. 1988; Leuthold and Weigt 2012). Equations (2)–(9) must be satisfied in every single hour  $\tau$ .

$$0 \leq -a_{n,\tau} - m_{n,\tau} q_{n,t,\tau} + p_{n,t,\tau} \quad \perp q_{n,t,\tau} \geq 0 \quad (2)$$

$$0 \leq c_s - p_{n,t,\tau} + \lambda_{4,n,s,t,\tau} \quad \perp g_{n,s,t,\tau} \geq 0 \quad (3)$$

$$0 = \sum_{l \in L} \frac{I_{l,n}}{X_{l,t}} \lambda_{1,l,t,\tau} - \sum_{l \in L} \frac{I_{l,n}}{X_{l,t}} \lambda_{2,l,t,\tau} + \sum_{nn} p_{nn,t,\tau} B_{nn,n,t} + \lambda_{5,n,t,\tau} slack_n, \quad \Delta_{n,t,\tau} \text{ free} \quad (4)$$

$$0 \leq - \sum_n \frac{I_{l,n}}{X_{l,t}} \Delta_{n,t,\tau} + P_{l,t} \quad \perp \lambda_{1,l,t,\tau} \geq 0 \quad (5)$$

$$0 \leq \sum_n \frac{I_{l,n}}{X_{l,t}} \Delta_{n,t,\tau} + P_{l,t} \quad \perp \lambda_{2,l,t,\tau} \geq 0 \quad (6)$$

$$0 = - \sum_s g_{n,s,t,\tau} + \sum_{nn} B_{n,nn} \Delta_{nn,t,\tau} + q_{n,t,\tau}, \quad p_{n,t,\tau} \text{ free} \quad (7)$$

$$0 \leq -g_{n,s,t,\tau} + \bar{g}_{n,s} \quad \perp \lambda_{4,n,s,t,\tau} \geq 0 \quad (8)$$

$$0 = slack_n \Delta_{n,t,\tau}, \quad \lambda_{5,n,t,\tau} \text{ free} \quad (9)$$

Equations (2)–(4) represent the partial derivatives with respect to  $q_{n,t,\tau}$ ,  $p_{n,t,\tau}$ , and the voltage angle  $\Delta_{n,t,\tau}$ .  $I_{l,n}$  is the incidence matrix of the network, which provides information on how the nodes are connected by transmission lines  $l$ . The parameter  $X_{l,t}$  describes the reactance for each transmission line.  $B_{n,nn}$  is the network susceptance between two nodes. Equations (5) and (6) demand that the power flows on each line do not exceed the respective line's capacity  $P_{l,t}$ . Equation (7) ensures nodal energy balance: generation minus net outflow has to equal demand at all times. Equation (8) constrains generation of technology  $s$  to the maximum available generation capacity at the respective node. Finally, (9) establishes a point of reference for the voltage angles by exogenously setting the parameter  $slack_n$  to 1 for one node in the network. For all other nodes,  $slack_n$  equals 0.

Whereas the lower-level problem (2)–(9) has to be solved for every single hour  $\tau$ , the upper-level problem needs to be inter-temporally optimized over all regulatory periods  $t$ . For the three regulatory regimes, the upper level problem is represented by (10):

$$\max \Pi = \sum_{t \in T} \left( \left( \sum_{\tau \in T} \sum_{n \in N} \left( p_{n,t,\tau} q_{n,t,\tau} - \sum_{s \in S} p_{n,t,\tau} g_{n,s,t,\tau} \right) + fixpart_t - \sum_{l \in L} \sum_{tt < t} ec_l ext_{l,tt} \right) \frac{1}{(1 + \delta^p)^{t-1}} \right) \quad (10)$$

The Transco's decision variable is capacity extension of transmission lines  $ext_{l,t}$ , which incurs extension costs  $ec_l$  (annuities).<sup>12</sup> In the *NoReg* case, transmission invest-

<sup>12</sup> We do not consider capital costs of the initial network or operational expenses of the Transco.

ments have to be fully recovered by congestion rents, i.e.,  $fixpart_t = 0$ . Accordingly, the Transco will only extend such lines that increase congestion rents. Both future revenues and future costs are discounted with a private discount rate  $\delta^p$ . In the *CostReg* case, we assume that the Transco not only receives congestion rents, but may also charge an additional  $fixpart_t$  which reimburses the line extension cost and grants an additional return on costs ('cost-plus' regulation). Equation (11) shows that the fixed part of a given period includes the costs (annuities) of all network investments made so far plus a return on costs  $r$ . With positive  $r$ , the Transco may find it optimal to expand all transmission lines infinitely. We thus include an additional constraint stating that Eq. (11) only holds as long as line extension does not exceed the optimal levels as determined by the welfare-maximizing benchmark.<sup>13</sup> In the *HRV* case, the Transco may also charge a fixed tariff part, on which Eq. (12) sets a cap. It includes previous period quantity weights (Laspeyres weights). In its general form, it also includes a retail price index  $RPI$  and an efficiency factor  $X$ . We set both  $RPI$  and  $X$  to zero in the model application, as we assume real prices and neglect efficiency gains.

$$fixpart_{t+1}^{CostReg} = \sum_{l \in L} ec_{l,ext_{l,t}}(1+r) + fixpart_t^{CostReg} \quad (11)$$

$$\frac{\sum_{n \in N} \sum_{\tau \in T} \left( p_{n,t+1,\tau} q_{n,t,\tau} - \sum_{s \in S} p_{n,t+1,\tau} g_{n,s,t,\tau} \right) + fixpart_{t+1}^{HRV}}{\sum_{n \in N} \sum_{\tau \in T} \left( p_{n,t,\tau} q_{n,t,\tau} - \sum_{s \in S} p_{n,t,\tau} g_{n,s,t,\tau} \right) + fixpart_t^{HRV}} \leq 1 + RPI - X \quad (12)$$

In both the *CostReg* and the *HRV* cases, the fixed tariff part allows the Transco to recover its network extension costs. In contrast, this is not true in the *NoReg* case, in which the Transco will only invest in transmission extension if it leads to increases in congestion rents that are larger than extension costs.

In the baseline and in the welfare-maximizing benchmark case, the upper level problem does not represent a Transco's profit-maximization, but rather a social planner's maximization of social welfare. It is described by (13). The social planner uses a social discount rate  $\delta^s$ , which may be smaller than the private discount rate  $\delta^p$  used by a Transco.

$$\max wf = \sum_{t \in T} \left( \left( \sum_{\tau \in T} \sum_{n \in N} \left( a_{n,\tau} q_{n,t,\tau} + \frac{1}{2} m_{n,\tau} q_{n,t,\tau}^2 - \sum_{s \in S} c_s g_{n,s,t,\tau} \right) - \sum_{l \in L} \sum_{tt < t} ec_{l,ext_{l,tt}} \right) \frac{1}{(1 + \delta^s)^{t-1}} \right) \quad (13)$$

<sup>13</sup> Note that this requires the regulator to have sufficient knowledge about which lines should be increased.

Network extension causes additional inter-period constraints on line capacity (14), line reactance (15), and network susceptance (16), which are also included in the MPEC.

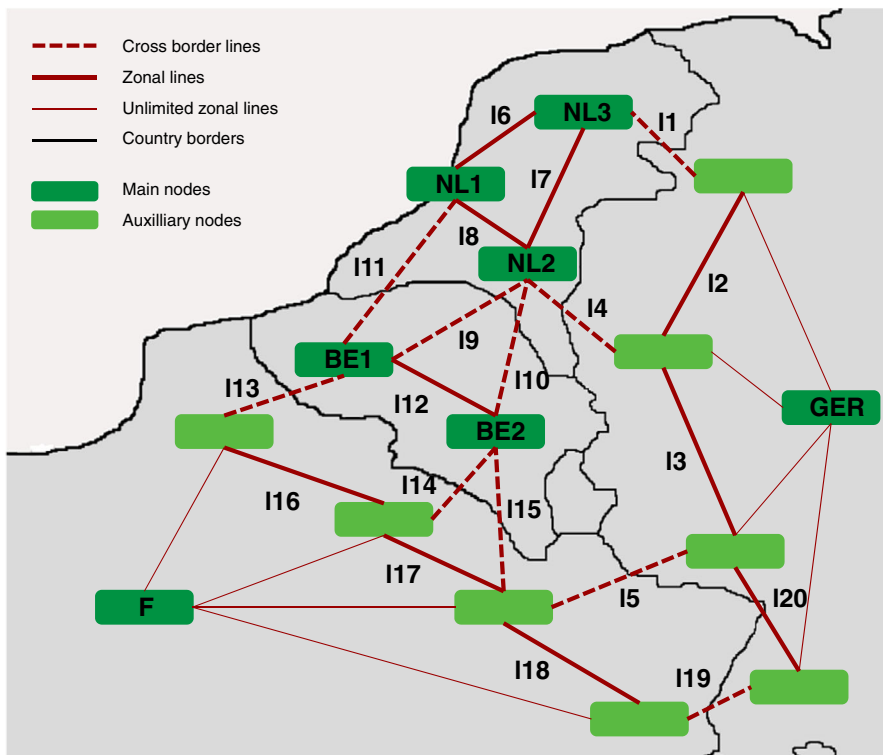
$$P_{l,t+1} = P_{l,t} + ext_{l,t} \quad (14)$$

$$X_{l,t} = \frac{P_l^0}{P_{l,t+1}} X_l^0 \quad (15)$$

$$B_{nn,n,t+1} = \sum_l \frac{I_{l,n} I_{l,nn}}{X_{l,t+1}} \quad (16)$$

#### 4 Model application

The five MPEC problems are implemented in the General Algebraic Modeling System (GAMS). They are numerically solved on a 64bit Linux System with the commercial solver CONOPT3. As the feasible region of the MPEC is non-convex, the solver returns local instead of global optima. We develop a routine of finding good local optima as described in Appendix 7.2. We apply the model to a stylized transmission network of Western Europe, which includes seven country nodes in Germany, France, Belgium



**Fig. 1** The stylized Western European transmission network

**Table 2** Variable generation costs and available capacity

Technology	Variable generation costs in €/MWh	Overall available capacity in MW
Nuclear	9	64,858
Lignite	29	15,120
Hard coal	35	35,064
CCGT	43	16,358
Gas turbine	65	16,286
Oil	72	12,584
Hydro	0	9,841
Wind	0	29,790

**Table 3** Generation capacity at different nodes in MW

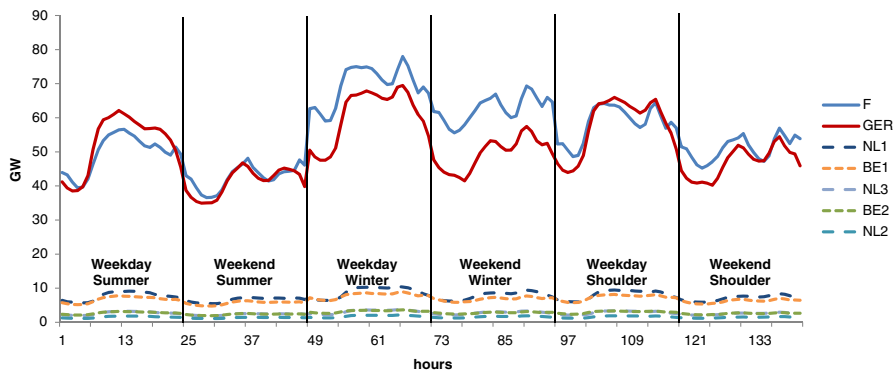
	Nuclear	Lignite	Hard coal	CCGT	Gas turbine	Oil	Hydro	Wind	Overall
GER	14,750	15,120	19,800	8,024	7,480	5,576	1,403	23,895	96,048
F	45,547	0	10,440	748	4,522	2,312	8,394	3,422	75,385
BE1	2,976	0	1,226	1,667	482	1,040	32	162	7,586
BE2	1,218	0	502	683	198	426	13	162	3,201
NL1	236	0	1,994	3,372	2,321	2,080	0	716	10,720
NL2	47	0	400	677	466	418	0	716	2,724
NL3	83	0	702	1,187	817	732	0	716	4,238
Overall	64,858	15,120	35,064	16,358	16,286	12,584	9,841	29,790	199,902

and the Netherlands, eight auxiliary cross-border nodes, twenty stylized transmission lines (11–120), and eight auxiliary lines (Fig. 1). In addition, there are eight auxiliary lines in France and Germany, which we assume are not congested. Network data is derived from [Neuhoff et al. \(2005\)](#), who used this network for a model comparison analysis.

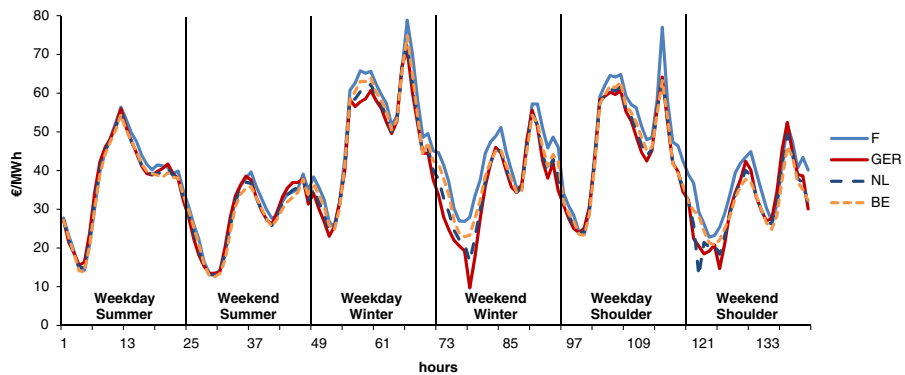
We include eight power generation technologies. Table 2 lists variable generation costs and overall available capacity in the stylized network. Data sources include [BP \(2010\)](#), [EEX \(2010\)](#), [ENTSO-E \(2010a\)](#), [Eurostat \(2010\)](#), and [IEA \(2010\)](#). The values on available capacity also reflect our estimations on a part of the installed capacity not being available any given hour due to outages, seasonal maintenance, and other technical restrictions. Table 3 shows nodal generation capacity in detail.<sup>14</sup>

Demand is modeled on an hourly basis for six representative days of the year. We include both a weekday and a weekend day for each of three distinctive demand periods: summer (April to September), winter (November to February) and a shoulder period (March and October). We extrapolate to the whole year by weighting the six days with suitable factors. Nodal reference demand levels are derived from hourly data

<sup>14</sup> The distribution of the total capacity among the different nodes on Belgium and the Netherlands is in line with original COMPETES data used in [Neuhoff et al. \(2005\)](#).



**Fig. 2** Hourly nodal reference demand



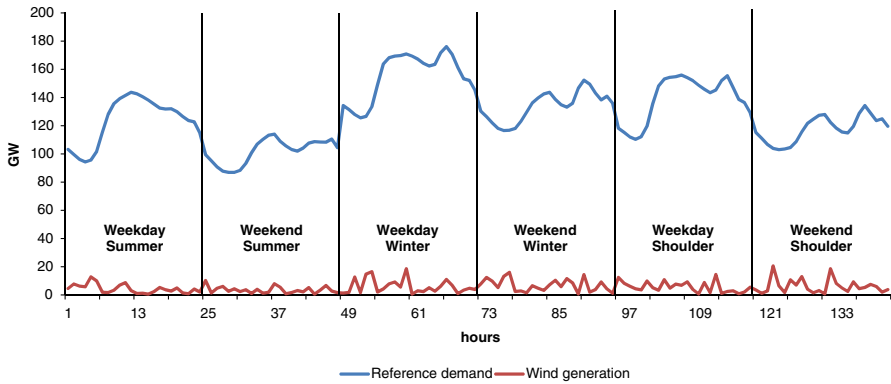
**Fig. 3** Hourly nodal reference prices

for 2009 (ENTSO-E 2010b). We group hourly ENTSO-E demand data for the whole year 2009 in six different categories (weekdays and weekend days during summer, winter, and the shoulder period) and calculate average values for each hour of these six representative days. As shown in Fig. 2, this results in 144 representative hours that adequately represent a whole year. Likewise, nodal reference prices are calculated based on hourly spot market data for 2009 provided by EEX, EPEX and Belpex (day ahead hourly auctions). Figure 3 shows the resulting reference price pattern. We assume a price elasticity of demand  $\varepsilon$  of  $-0.25$  at the reference point for all nodes and all hours.

Regarding hourly wind feed-in, we draw on 2009 German data as provided by the four German TSOs.<sup>15</sup> We group hourly feed-in data of the whole year in six representative days. For each group, we sort the hourly wind values in ascending order and take 24 quantiles. These quantiles are randomly assigned to the 24 h of each

<sup>15</sup> Because of a lack of data, we use the German wind feed-in pattern for the other countries, as well.





**Fig. 4** Wind generation and overall reference demand

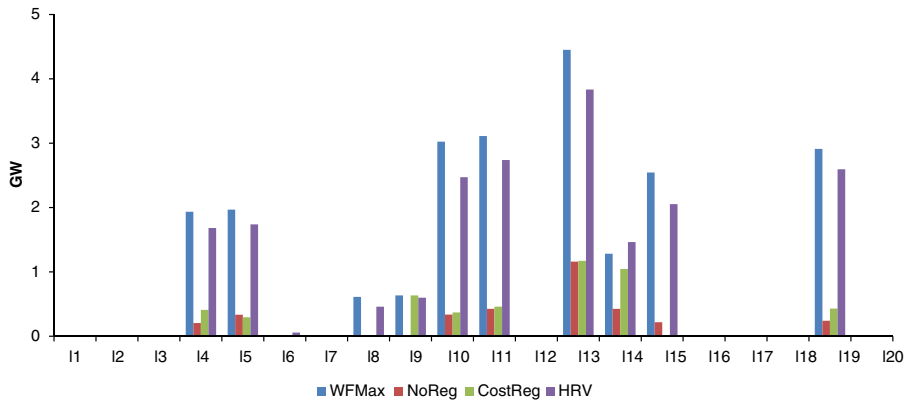
representative day.<sup>16</sup> Figure 4 shows the resulting wind pattern in the context of overall reference demand. The wind feed-in pattern is completely unrelated to daily demand fluctuations. In contrast, there is a small seasonal correlation: during winter days, both demand and wind feed-in is higher than during summer days. Note that demand fluctuates by more than 80 GW, whereas wind fluctuation is only around 20 GW. It should be noted that the wind pattern shown in Fig. 4 is not intended to resemble real-world wind feed-in during specific hours. Rather, it represents the characteristics of fluctuating wind generation during each of the representative six days. Over the 144 h modeled, many combinations of demand and wind generation occur, such as high wind / low demand or low wind / high demand. Overall, this approach captures the essentials of real-world wind power variability very well. Yet taking quantiles necessarily leads to an under-representation of hours with extremely high wind feed-in.

We solve the model for six regulatory periods ( $t_0$ – $t_5$ ), i.e., six years. Network expansion decisions can be made in the first period, but will become effective only in the second period. The social planner in the *WFM* case applies a social discount rate  $\delta^s$  of 4 % for intertemporal optimization over the regulatory periods. In the following, we use the same discount rate for all comparisons of welfare outcomes. In the *NoReg*, *CostReg* and *HRV* cases, the Transco uses a private discount rate  $\delta^p$  of 8 % for intertemporal profit maximization. We further assume a return on costs  $r$  in the *CostReg* case of 8 %.<sup>17</sup>

We carry out complementary sensitivity analyses with respect to network extension costs, wind feed-in and discount rates. In the baseline, we use extension costs of 500 € per MW and km. This number reflects an average value for upgrading existing lines

<sup>16</sup> Sensitivity tests have shown that other random assignments of hourly wind feed-in values lead to very similar results.

<sup>17</sup> Additional model runs with returns on costs higher than 8 % show that results hardly differ. There are two reasons for this finding: (i) we do not allow the Transco to increase line capacities beyond the levels of the welfare-maximizing benchmark; (ii) additional profits related to cost-regulation are small compared to related losses in congestion rents.



**Fig. 5** Line extension results (final period)

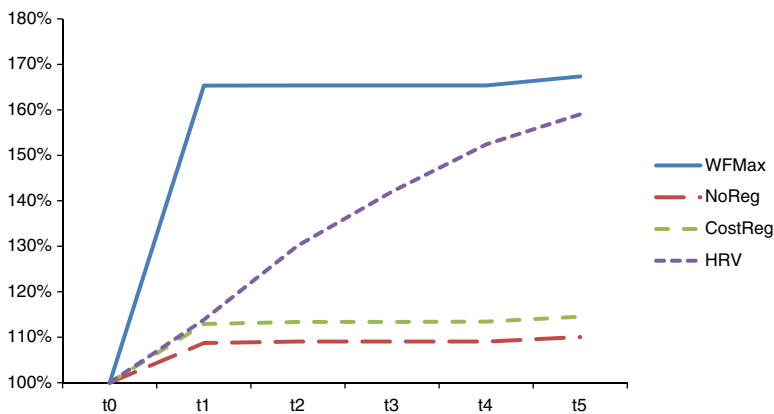
and building new lines from scratch.<sup>18</sup> In sensitivity analyses, we test the effect of different cost estimates of 250 and 1,000 € per MW and km. Regarding wind feed-in, wind fluctuations are small compared to demand fluctuations in the baseline. We test the implications of much-increased wind fluctuations, assuming that the available wind capacity in all nodes quadruples. In this case, wind fluctuations have roughly the same magnitude as demand fluctuations. We also carry out a sensitivity analysis with respect to discount rates, such that  $\delta^S = \delta^P = r = 4\%$ . This allows separating the effects of different social and private discount rates when comparing the outcomes incentive regulation and the welfare optimal benchmark. In Sect. 5.5, we also present the model outcomes for a simplified static case, in which we assume average yearly demand levels, prices and wind generation instead of hourly values. This case connects to previous literature on impacts of simplification and resulting welfare losses (e.g., Birge 1982; Munoz et al. 2013). We show that the relative performance of incentive regulation is distorted in case of model simplifications.

## 5 Results

### 5.1 Baseline assumptions

Figure 5 shows the locations and the levels of overall line extensions in the final period (t5) for all regulatory approaches. In the welfare-maximizing benchmark, there are major extensions at the border between France and Belgium (lines 13–15) as well as between the Netherlands and Belgium (lines 10 and 11). Moreover, there are noticeable line investments between Germany and France (lines 5 and 19), as well as between Germany and the Netherlands (line 4). These transmission investments are a consequence of the assumed initial levels of congestion. We illustrate this with a

<sup>18</sup> For actual extension cost assumptions approved by the German regulator, see Hertz et al. (2012), Appendix 9.3.



**Fig. 6** Time path of overall network extension

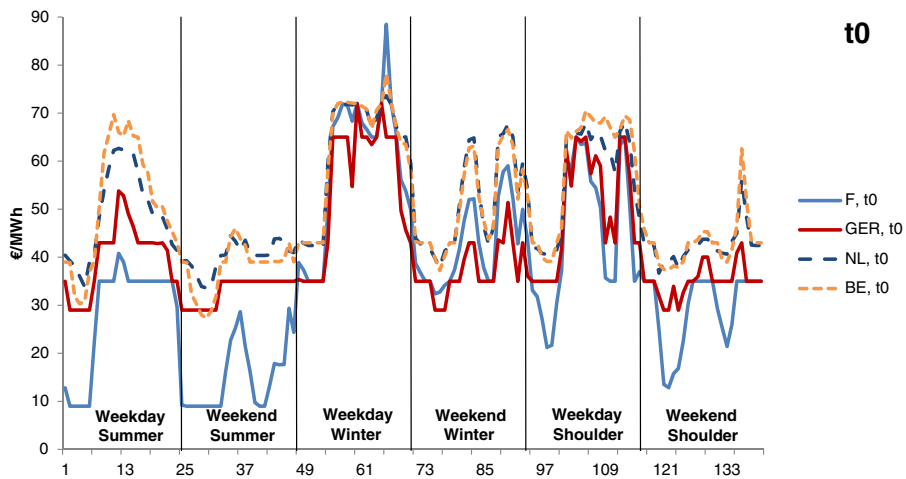
simple calculation, drawing on average values. The average hourly price difference between France and Belgium in the initial regulatory period is nearly €16 per MWh, corresponding to yearly arbitrage revenues of around €137,000 per MW of line capacity. This very large value is largely explained by substantial price differences during summer days (see below).<sup>19</sup> Assuming line extension costs of €500 per MW and km, average annualized extension costs for the lines between France and Belgium are only around €5000 per MW, resulting in a very large marginal benefit of network expansion of around €132,000 per MW. This explains the substantial investments in lines 13–15.<sup>20</sup>

*HRV* regulation also incentivizes investments into these lines, although expansion levels are generally a little lower compared to *WfMax* because of the dynamics in the two-part tariff scheme. Under both *NoReg* and *CostReg*, investments are much lower as the Transco tries to preserve as much congestion rent as possible. Under *NoReg*, the Transco increases the capacity of some lines to a small extent, such that increasing power flows generate additional congestion rents; however, it has an incentive not to expand further, as this would smooth nodal price differences too much. Cost-based regulation also leads to low expansion levels, because higher investments would result in congestion rent losses that outweighed the return on investment costs paid to the Transco. Under *CostReg*, the Transco accordingly invests primarily in such lines that lead to relatively small congestion rent losses, such as lines 9 and 14.

Figure 6 shows the time path of extension for the different cases. In the welfare-maximizing benchmark, all line extensions take place during the first period, as delay-

<sup>19</sup> We use appropriate weights for winter, summer and shoulder days, distinguishing weekdays and weekends.

<sup>20</sup> We accordingly calculate network expansion benefits of around €77,000 per MW between Germany and France, €72,000 per MW between Germany and the Netherlands, and €17,000 per MW between the Netherlands and Belgium. Note that these are indicative values that do not reflect loop flows in the system. Moreover, the marginal benefit of line extension substantially decreases with increasing investments because nodal price differences are levelled.



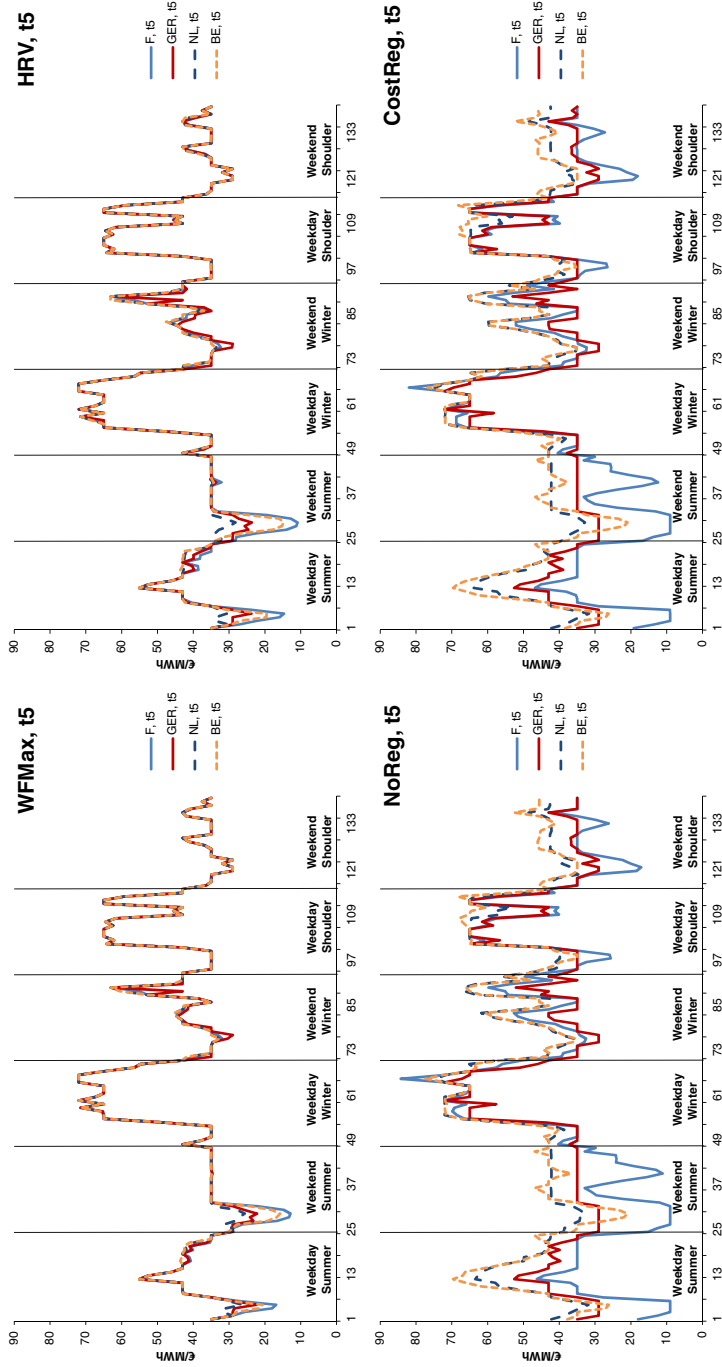
**Fig. 7** Hourly nodal prices before network extension

ing investments would diminish the benefits of extension measures. In the *NoReg* and *CostReg* cases, this is also the case, although overall investments are much lower. In contrast, *HRV* regulation leads to incremental upgrades in each regulatory period.<sup>21</sup> This result is driven by the yearly rebalancing of the variable and fixed parts of the two-part tariff according to Eq. (12). Accordingly, the welfare benefits of *HRV* regulation largely materialize towards the end of the considered period.

Figure 7 indicates hourly nodal prices before network extension for the six representative days.<sup>22</sup> Prices are generally highest in Belgium and the Netherlands, but lowest in France due to the low marginal costs of the French nuclear power fleet. Price differences, which indicate network congestion, are particularly large during summer, when demand is low. Fig. 8 indicates how prices converge after network expansion in the welfare-optimal benchmark and in the regulatory cases. Price differences vanish almost completely in *WFM* due to optimal network investments. Only during summer off-peak hours with relatively low demand, price convergence is not perfect, as the costs of additional line expansion would outweigh the benefits of remaining congestion relief for these periods. Drivers for price convergence are both changing power flows due to additional network capacities and changing power generation at all nodes. In particular, French exports of cheap base load power increase after network extension, whereas Belgium and the Netherlands replace domestic power generation with imports. Germany's power imports increase during summer off-peak periods, while it exports more power in the winter. Overall, German power generation and

<sup>21</sup> Note that we allow for continuous line extension. In the real world, line investments are lumpy. Accounting for indivisibilities may lead to different *HRV* results. Finding optimal solutions of discretely constrained MPECs, however, would be extremely challenging. Notwithstanding, Rosellón et al. (2012) suggest that lumpiness should not stand in the way of applying price-cap incentive mechanisms to real-world transmission expansion.

<sup>22</sup> For Belgium and the Netherlands, average values are provided.



**Fig. 8** Price convergence after extension (final period)

**Table 4** Welfare results (baseline): differences to case without extension in bn €

	Social welfare	Producer rent	Consumer rent	Congestion rent	Extension costs	Transco profit	Fixed tariff parts
WfMax	+2.43	+10.55	-5.96	-1.76	-0.41	-1.95	-
NoReg	+0.96	+1.79	-1.20	+0.43	-0.06	+0.33	-
CostReg	+1.06	+2.21	-1.51	+0.45	-0.09	+0.41	+0.08
HRV	+2.00	+6.35	-3.54	-0.56	-0.24	+1.39	+2.07

**Table 5** Consumer rent (baseline): relative differences to case without extension

	Germany (%)	France (%)	Belgium (%)	Netherlands (%)
WfMax	-1	-5	+10	+8
NoReg	+0	-1	+3	+1
CostReg	+0	-1	+3	+2
HRV	-1	-3	+8	+6

exports increase slightly. *HRV* regulation also results in strong price convergence in the final period; due to somewhat lower investments, price convergence is slightly less perfect than in the social welfare optimum. In contrast, the low investment levels of both *NoReg* and *CostReg* lead to much lower price convergence particularly during off-peak periods.

Naturally, these extension-related changes in power generation, line flows, and nodal prices also have welfare implications. Table 4 summarizes cumulative welfare outcomes over all six modelled periods (t0–t5). It indicates cumulative differences to the case without extension (*NoExtension*) for the welfare-optimal benchmark and the different regulatory approaches, i.e., the welfare gains of network extension. Social welfare is the sum of power producer, consumer, and congestion rents minus network extension costs, which are provided with a negative sign. These values are calculated with the social discount rate. In contrast, Transco profits and the cumulative fixed tariff parts are calculated using the private discount rate.<sup>23</sup> In all modeled cases, network expansion increases social welfare compared to the case without expansion. In the welfare-maximizing benchmark (*WfMax*), social welfare increases by around €2.4 billion over the five regulatory periods due to network expansion. However, there is a much larger distributional effect: power producer rents are greatly increased, while consumer rents decrease. Congestion rents (and Transco profits) also decrease due to network investments. The distributional effect can be explained by the fact that larger transmission capacities increase French and—to a lower extent also German—exports, such that average prices increase in these countries.<sup>24</sup> Accordingly, consumer rents in Germany and France decrease while consumers in Belgium and the Netherlands benefit from network expansion (Table 5). As electricity consumption is much larger

<sup>23</sup> Strictly speaking, Transco profits are not defined in *NoExtension* and *WfMax*, as welfare is maximized in these cases. However, we interpret congestion rents as Transco profits in these cases.

<sup>24</sup> In *WfMax*, unweighted average prices increase by around 2 % in Germany and 16 % in France, whereas prices in Belgium and the Netherlands decrease by 16 and 14 %, respectively.



in Germany and France than in Belgium and the Netherlands, overall consumer rent decreases.

Comparing social welfare among the different regulatory cases, we find that *HRV* regulation is closest to the welfare-maximizing benchmark with an extension-related gain of €2 billion. In contrast, both *NoReg* and *CostReg* lead to much lower welfare gains of extension of only around €1 billion. Accordingly, the distributive effects on power producers and consumers are also large under *HRV* regulation compared to the other alternatives.

As a consequence of optimal network investments, congestion rents are lowest in *WFM*. Congestion relief is smaller under *HRV*, mainly because nearly-optimal line investments are only achieved in later periods. In contrast, congestion rents increase under both *NoReg* and *CostReg*. This is because the moderate line investments carried out by the Transco in these cases increase trade, which outweighs decreasing price differences between two congested nodes. In contrast, the *HRV* mechanism does not give the Transco an incentive to expand the network such that congestion is increased, but promotes higher investments through the fixed part of the tariff. Accordingly, *HRV* regulation better aligns the Transco's incentives with social welfare objectives compared to *NoReg* and *CostReg*.

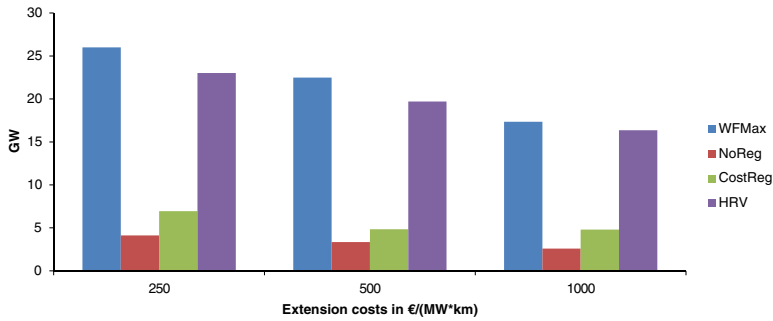
It can be observed that the rebalancing of the two tariff parts favors the fixed tariff part as determined by Eq. (12), such that Transco profits are highest in the *HRV* case. The fixed part is very large compared to both extension costs and the Transco's congestion rent losses. Although we do not focus on distributive issues in this context, our results indicate that the fixed part should be paid for by power generators, not by consumers.

## 5.2 Different extension costs

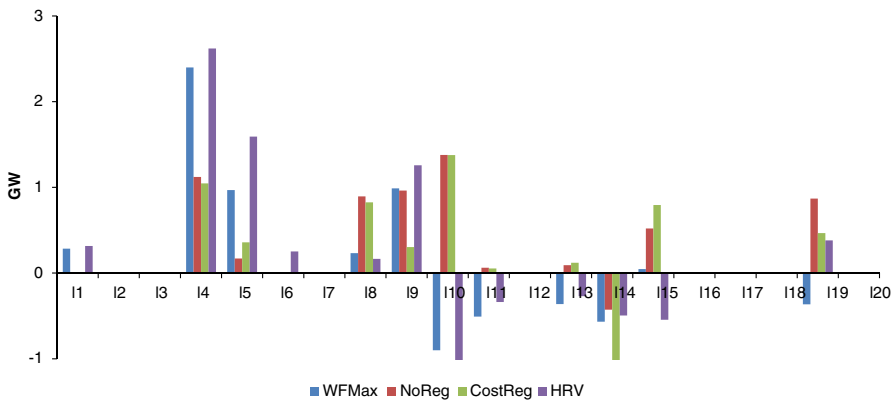
All results in Sect. 5.1 have been calculated with extension costs of 500 €/ (MW\*km). This number reflects an intermediate value for upgrading existing lines and building new lines from scratch. We determine the robustness of results in case of different cost numbers of 250 and 1,000 €/ (MW\*km). The first number may be associated with low-costs upgrades of existing lines, while the latter reflects building mostly new lines from scratch. Figure 9 shows that overall extension levels generally decrease with increasing costs. Yet the relative performance of the three regulatory approaches does not change. Likewise, relative social welfare outcomes prove to be very robust (compare Fig. 11). With increasing extension costs, *HRV* results improve slightly relative to the other modeled alternatives. Interestingly, the fixed tariff part under *HRV* regulation does not increase with increasing extension costs, but slightly decreases. Nonetheless, the fixed part is still substantially larger than extension costs even in the case with 1,000 €/ (MW\*km). Accordingly, our conclusions on the relative performance of *HRV* regulation are not sensitive to extension cost assumptions.

## 5.3 Increased wind capacity

In the baseline run, wind power reflects the capacity levels of the year 2009. Accordingly, wind variability is small compared to demand fluctuations. We now test the



**Fig. 9** Overall network extension for different cost assumptions



**Fig. 10** Line extension differences between baseline and the case with increased wind capacity (final period)

implications of much higher wind capacity, assuming that the available wind capacity in all nodes quadruples. In this case, wind fluctuations in the system have roughly the same magnitude as demand fluctuations. By multiplying all wind feed-in with the factor 4, we implicitly assume that wind capacity is still unevenly distributed as in the baseline between the countries, with the largest part being located in Germany. This gives rise to increasing network congestion. We find that *HRV* regulation is able to promote additional grid extension required for wind integration. At the same time, the welfare results discussed above are robust.

Figure 10 indicates the differences in line extension between the baseline and the case with increased wind power. It shows that increasing wind capacity generally increases the optimal amount of overall network investments because of higher (temporary) congestion. In particular, the cross-border lines between Germany and the Netherlands (lines 1 and 4) and—to a smaller extent—between Germany and France (lines 5 and 19) are expanded in the welfare-maximizing benchmark. This is because increasing German wind capacity substantially reduces prices, resulting in additional exports from Germany.

**Table 6** Welfare results (increased wind capacity): differences to case without extension in bn €

	Social welfare	Producer rent	Consumer rent	Congestion rent	Extension costs	Transco profit	Fixed tariff parts
WfMax	+3.19	+6.47	−0.87	−1.95	−0.47	−2.17	–
NoReg	+1.65	+1.75	−0.51	+0.57	−0.16	+0.37	–
CostReg	+1.68	+1.85	−0.58	+0.57	−0.16	+0.53	+0.16
HRV	+2.47	+4.10	−0.93	−0.34	−0.36	+1.74	+2.33

Regarding welfare outcomes, we find that additional capacities of unevenly dispersed wind power increase the social welfare gain of network extension in *WfMax* compared to the baseline, as there is more congestion to be relieved. The relative performance of the regulatory alternatives, however, hardly changes (Table 6). We thus conclude that *HRV* regulation may lead to desirable network extension even in case of fundamental changes in the generation mix.

In the context of German renewable expansion, the question of how net transfers of power from Germany to other countries change with network upgrades arises. Under baseline assumptions, yearly German exports increase by around 6 TWh due to transmission extension. In contrast, network upgrades allow Germany to scale up yearly exports by around 35 TWh in the case with increased wind capacity. This value relates to overall wind generation in Germany of 153 TWh in the same scenario. Accordingly, additional wind power mainly substitutes for thermal generation in Germany, which is here assumed to be perfectly flexible. Considering actual flexibility restrictions of real-world power plants, it is conceivable that Germany passes challenges related to the variability of wind generation on to neighboring countries to some extent.

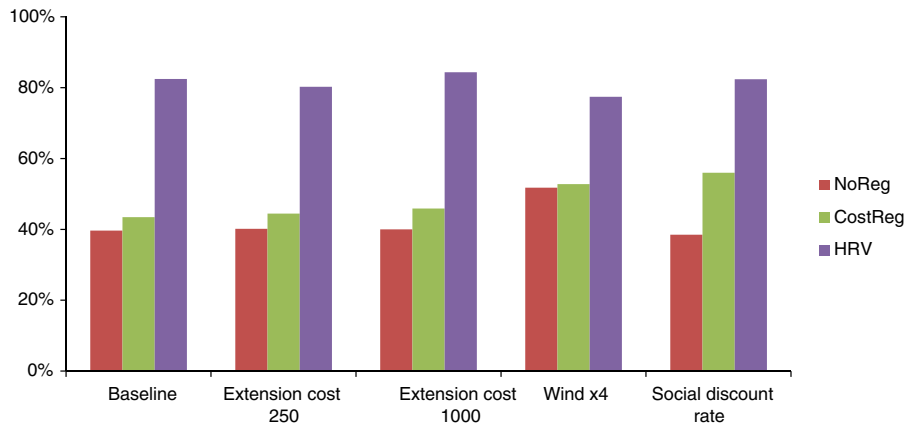
#### 5.4 Equal social and private discount rates

Finally, we test the effects of different social and private discount rates on model outcomes. In the baseline, we assume a social discount rate of 4 % for the social planner in *WfMax*, and a private discount rate for the Transco of 8 % in the regulatory cases. While such parameters appear to be realistic, the difference of social and private discount rates may distort the comparison of *WfMax* and the regulatory cases. We thus carry out a sensitivity analysis with  $\delta^s = \delta^p = 4\%$ . The return on costs in the *CostReg* case also takes on the value  $r = 4\%$ . Table 7 shows that relative welfare results are robust.

Figure 11 provides a summary of extension-related social welfare gains in all modeled cases relative to the respective welfare-maximizing benchmark (*WfMax* = 100 %). We find that relative welfare outcomes are robust over all model runs. *HRV* regulation is always closest to the welfare optimum. In particular, *HRV* always achieves at least 80 % of the socially optimal welfare gains. In contrast, both *NoReg* and *CostReg* lead to much lower welfare gains. We expect the benefits of *HRV* regulation to be even larger if more regulatory periods were included, as the TSO's rebalancing

**Table 7** Welfare results (equal discount rates): differences to case without extension in bn €

	Social welfare	Producer rent	Consumer rent	Congestion rent	Extension costs	Transco profit	Fixed tariff parts
WfMax	+2.43	+10.55	−5.96	−1.76	−0.41	−2.17	–
NoReg	+0.94	+1.66	−1.10	+0.43	−0.05	+0.37	–
CostReg	+1.36	+3.16	−2.00	+0.35	−0.15	+0.35	+0.16
HRV	+2.00	+6.37	−3.58	−0.55	−0.24	+1.56	+2.36



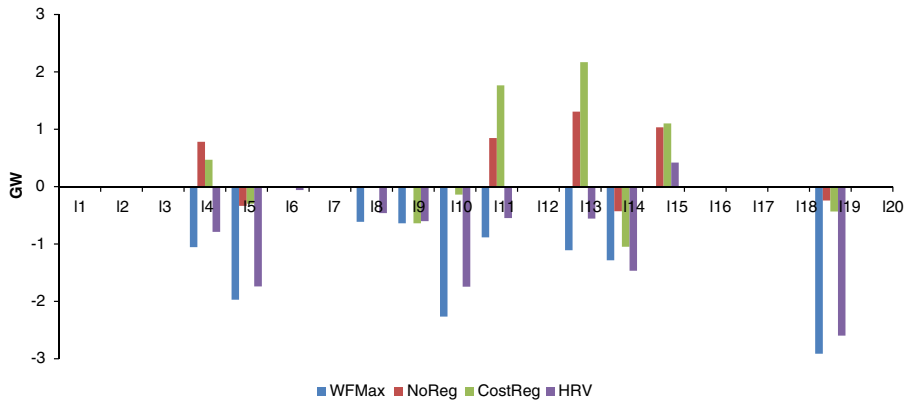
**Fig. 11** Social welfare gain of extension compared to *WfMax* for different model runs

of fixed and variable tariff parts over time leads to incremental line upgrades, such that more congestion is relieved in later periods.

### 5.5 The drawback of using a simplified model

In contrast to previous numerical analyses, our model includes an hourly time resolution as well as varying levels of demand and wind-power feed-in. For example, [Hogan et al. \(2010\)](#), [Rosellón et al. \(2011, 2012\)](#), and [Ruíz and Rosellón \(2012\)](#) use static models, assuming constant demand for the whole regulatory period. We connect to this literature by analyzing a static case. We calculate the error from using such a simplified model compared to the model discussed in Sect. 5, which is assumed to perfectly represent the real world. We find that simplifying model assumptions substantially distort results.

To do so, we calculate weighted average nodal reference demand and prices from the hourly values provided in Figs. 2 and 3. Likewise, we use a weighted average wind utilization factor of 0.172, based on quarter-hourly feed-in data provided by German TSOs for 2009. Accordingly, yearly reference demand and wind feed-in is exactly the same in the baseline and in the simplified model. To evaluate the difference between the simplified and the correct model, we first solve the simplified model. Afterwards, we



**Fig. 12** Line extension differences between the simplified model and the baseline (final period)

run the baseline model again, fixing the optimal solutions of the transmission decision variables at their values from the simplified model.<sup>25</sup> Technically, only the lower level problem has to be solved again, as the extension variables of the upper level are fixed.

In the welfare-maximizing benchmark, major line extensions only take place at the borders between France and Belgium (lines 13 and 15) as well as between the Netherlands and Belgium (lines 10 and 11). Additionally, there are some minor investments between Germany and the Netherlands (line 4). Most of these investments are, however, much lower than the respective ones in the baseline. This is indicated by Fig. 12, which shows how locations and levels of line extensions in the simplified model differ from the baseline case. Moreover, extensions between France and Germany, which are substantial in the baseline, are missing completely. The reason for this finding is that the simplified case neglects congestion both in (summer) off-peak periods, in which prices in France are lowest, and in (winter) peak periods, in which German generators supply some of the French peak demand. Interestingly, some line investments are higher compared to the baseline under both *NoReg* and *CostReg*. This is because the price-smoothing effect of such network extensions during hours with the highest congestion rents is under-estimated when only one representative average hour is considered. Simplifying assumptions accordingly lead to a distorted picture of network congestion and expansion requirements.

Welfare results also differ substantially from the baseline if the extension results of the simplified model are used (Table 8). Underestimated peak and off-peak congestion levels lead to sub-optimal network expansion, such that the welfare gain of network extension in *WFMMax* is lower than in the baseline (compare Table 4). At the same time, the distributive impacts of line extensions on power producers and consumers are underestimated. The main reason for this finding is that French consumers lose less from network expansion due to lower export opportunities. Regarding welfare outcomes, the simplified case draws a distorted picture of the relative performance of different regulatory approaches. Importantly, *HRV* regulation is no longer closest

<sup>25</sup> This approach is comparable to Birge's determination of the value of a stochastic solution (Birge 1982).

**Table 8** Welfare results (simplified case): differences to case without extension in bn €

	Social welfare	Producer rent	Consumer rent	Congestion rent	Extension costs	Transco profit	Fixed tariff parts
WfMax	+1.90	+6.29	-3.61	-1.01	-0.21	-1.10	-
NoReg	+1.65	+4.12	-2.11	-0.23	-0.13	-0.33	-
CostReg	+1.67	+4.42	-2.31	-0.28	-0.17	-0.24	+0.16
HRV	+1.48	+4.42	-2.26	-0.53	-0.15	+0.73	+1.13

to *WfMax* because of under-estimated network extension. The social welfare gains under both *NoReg* and *CostReg*, in contrast, are higher compared to the one under *HRV* regulation because of over-estimated investments. The differences between the baseline model and the simplified model are of the same order of magnitude as the differences between different regulatory approaches in the correctly specified (baseline) model.

Given these findings, we conclude that using realistic representations of demand and wind power fluctuations has important implications for modeling transmission network expansion requirements and for assessing the relative performance of different regulatory approaches. Looking at our numerical example, simplifying model assumptions may cause regulators to under-estimate the benefits of incentive regulation and favor sub-optimal regulatory regimes.

## 6 Conclusions

We study the performance of different regulatory regimes for transmission network expansion in the light of realistic demand patterns and variable wind generation by applying them to a power flow model of the Western European transmission network. In contrast to earlier research, we explicitly include an hourly time resolution, fluctuating demand, and variable wind power. All of this substantially increases the real-world applicability of the model. In doing so, we also adapt the *HRV* model so as to incorporate the peculiarities of systems with large shares of renewable energy sources, especially regarding wind power. Mathematically, the problem is formulated as an MPEC model (mathematical problem with equilibrium constraints) and solved using an elaborate routine with numerous starting points.

Drawing on realistic demand levels, reference prices, and generation capacities, we show that network extension in Western Europe relieves existing congestion and thus increases social welfare. Comparing different regulatory approaches, we find that *HRV* regulation leads to extension and welfare outcomes close to the social optimum. *HRV*'s welfare outcomes are far superior to the modelled alternatives of cost-based regulation (*CostReg*) and an approach without additional investment incentives (*NoReg*). This result is robust over all modelled cases. *NoReg* leads to inferior welfare results because the Transco finds only small line extensions profitable. Under cost-based regulation, some of the less congested lines are thoroughly expanded, but there are substantial under-investments for the most congested ones. In contrast, the *HRV*-mechanism



provides the Transco with incentives to expand the network such that congestion is largely relieved in the final period. Thus, the Transco's incentives are aligned with social welfare objectives.

First, we suggest some methodological conclusions. Comparing our analysis with previous research, we infer that including realistic assumptions increases the real-world applicability of modeling results. Evaluating the extension plans from a simplified model with average levels of load and wind power under actual fluctuations of load and wind, we find that simplifications severely distort the relative performance of different regulatory regimes. Accordingly, the benefits of incentive regulation can only be assessed properly when fluctuations in demand and wind power are considered.

We also suggest some policy-related conclusions. Given our numerical results, we cannot expect a Transco in Western Europe to invest properly in transmission lines without being provided additional incentives. Accordingly, the modeled *NoReg* approach is not a preferable option for policy makers. Likewise, cost-based regulation following our *CostReg* approach is not promising, as it does not provide sufficient incentives for the Transco to invest in the most congested lines. In addition, cost-based regulation requires the regulator to obtain substantial knowledge on network congestion, in order to determine which lines may be extended up to what levels. In contrast, *HRV* regulation leaves extension decisions completely to the profit-maximizing Transco, while at the same time leading to nearly optimal welfare outcomes. Moreover, we show that its beneficial welfare properties are extremely robust against fluctuations of demand and wind feed-in, as well as against changes of important model parameters. In the light of future network expansion requirements in the context of large-scale renewable integration, these properties of *HRV* may become particularly attractive.

It should be noted that the welfare properties of *HRV* regulation come along with a relatively large fixed tariff part. The fixed part constitutes a transfer from the Transco's variable income (congestion rents) to its fixed income. Our analysis shows that the required fixed part may become substantially larger than congestion rent losses, such that overall Transco profit increases. Accordingly, a Transco may receive a major part of extension-related welfare gains. This constitutes a redistribution of extensions-related gains in producer and consumer rents toward the Transco. Other Pareto-optimal distributions may be achieved through a distributive-justice criterion, and implemented, for instance, through a proper choice of the weight of profits in the welfare criterion. Likewise, weights would have to be adjusted to compensate for changes in Transco rents related to an exogenous transformation of the power plant fleet (Egerer et al. 2015). These topics are subject to future research. Last, but not least, *HRV* regulation would have to be reconciled with the political reality of both centralized network extension planning and incentive regulation for network operation, as currently carried out in the countries that are included in our model analysis. For the time being, policy makers in Europe may resort to theoretically less efficient, but practically enforceable approaches, at least regarding those transmission projects that are most urgently required for the integration of renewable energy. Our analyses still provide benchmarks for efficient price signals for investment.

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## 7 Appendix

### 7.1 ISO's constrained welfare maximization problem

$$\begin{aligned}
 \max_{q, g, \Delta, \lambda_1, \lambda_2, p, \lambda_4, \lambda_5} \quad & \sum_{t \in T} \left( \sum_{\tau \in T} \sum_{n \in N} \left( \int_0^{q_{n,t,\tau}^*} p_{n,t,\tau}(q_{n,t,\tau}) dq_{n,t,\tau} - \sum_{s \in S} c_s g_{n,s,t,\tau} \right) \frac{1}{(1 + \delta_s)^{t-1}} \right) \\
 s.t. \quad & \sum_n \frac{I_{l,n}}{X_{l,t}} \Delta_{n,t,\tau} - P_{l,t} \leq 0 \quad (\lambda_{1,l,t,\tau}) \quad \forall l, t, \tau \\
 & - \sum_n \frac{I_{l,n}}{X_{l,t}} \Delta_{n,t,\tau} - P_{l,t} \leq 0 \quad (\lambda_{2,l,t,\tau}) \quad \forall l, t, \tau \\
 & \sum_s g_{n,s,t,\tau} - \sum_{nn} B_{n,nn} \Delta_{nn,t,\tau} - q_{n,t,\tau} = 0 \quad (p_{n,t,\tau}) \quad \forall n, t, \tau \\
 & g_{n,s,t,\tau} - \bar{g}_{n,s} \leq 0 \quad (\lambda_{4,n,s,t,\tau}) \quad \forall n, s, t, \tau \\
 & slack_n \Delta_{n,t,\tau} = 0 \quad (\lambda_{5,n,t,\tau}) \quad \forall n, t, \tau
 \end{aligned} \tag{17}$$

### 7.2 Solution routine

Due to the non-convex nature of our MPEC problem, the NLPEC solver only generates local optima instead of unique global optima. We aim to get as closely as possible to global optima by using numerous different starting points. This could in principle be implemented by using randomized starting points. This, however, is not an option as the solver fails to find feasible solutions—let alone optimal ones—from most random starting points we have tried. Instead, we develop a routine of (i) finding feasible starting points, and (ii) searching for optima starting from these feasible points. First, we solve all regulatory cases—as well as the welfare-maximizing benchmark—with the extension variable fixed to zero. This leads to feasible solutions in all cases; afterwards, we release the extension variable and solve again. Second, we solve all regulatory cases using the welfare-optimal solution as a starting point. Third, we iteratively solve all regulatory cases one after another several times, each starting from the solution of the previous one. In all cases, we solve the same problem three times in a row, as we have found the CONOPT solver to find slightly better solutions if the solve is repeated in some instances. The solution point file is updated every time a better solution is found. After several iterations, we find convergence to some characteristic local optima, which are then considered to be global optima.

For the *HRV* case, the first option (starting with fixed extension and relaxing the extension variable afterwards) always leads to the best results. In contrast, the *NoReg* and *CostReg* cases often improve substantially during the second and third steps of our search routine. Due to the size of the numerical problem and the extensive search

process, finding good solutions for all regulatory cases requires more than 600 h of computation time even on a high-performance computer. Some sensitivities take even longer.

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