

# On the CO<sub>2</sub> Emissions of the Global Electricity Supply Sector and the Influence of Renewable Power-Modeling and Optimization

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## Abstract

This study investigates influences of different factors on the CO<sub>2</sub> emissions of the global electricity generation system. The analysis has been performed through applying an electricity system investment and production optimization model based on linear programming. This model has been calibrated according to the real electricity generation data.

The results show that the introduction of a global CO<sub>2</sub>-certificate price of 18 €/t would lead to a total abatement of several hundreds of million tons in 2006, i.e. 5% reduction of emissions compared to the baseline scenario without any carbon price.

Through a sensitivity study, we show that in addition to the CO<sub>2</sub>-certificate price, relation between natural gas and coal price is crucial for the abatement achieved through fuel switching.

On a long-term horizon, integration of wind is determined as the most economic option to respond to ambitious emissions reduction targets. A wind power capacity of 4913 GW in 2020 and 15729 GW by 2040 allows reducing the emissions by 35% and 78%, respectively, as compared to the emissions of year 2000 while the CO<sub>2</sub>-price rises from 18 to 44 €/ton. This can only be achieved if the capacities of cross-border power transmission interconnections are extended far beyond the existing levels.

**Keywords:** Electricity supply sector; CO<sub>2</sub> emissions abatement; Fluctuating renewable energy sources

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# 1 Introduction

The world is facing global challenging issues of climate change. CO<sub>2</sub> is one of the main contributors in the global warming phenomenon; its concentration has risen from a pre-industrial level of about 280 ppmv to more than 380 ppmv (Nakicenovic, 2007). Although, industrialized world regions have initiated climate policies, scenario studies indicate that green house gas emissions (GHG) are likely to increase in most world regions (IPCC, 2000). To ensure that CO<sub>2</sub> concentrations stabilize at target levels (IPCC, 2007; Nakicenovic, 2007), a significant reduction of the global emissions is required. This can only be achieved if efficient economical and political incentives are set up. It has been shown that without a near-term introduction of supportive and effective policy actions by governments, annual global GHG emissions are projected to rise from 9.7 Gt CO<sub>2</sub>-eq in 2000 to 36.7 Gt CO<sub>2</sub>-eq in 2030 (IPCC, 2007). The energy-related CO<sub>2</sub> emissions, mainly from fossil fuel combustion, are projected to grow 40-110% between 2000 and 2030 (IPCC, 2007).

The electricity sector can play an important role in the reduction of anthropogenic GHG emissions. Around 40% of global GHG emissions fall on the electricity sector (Wheeler and Ummel, 2008; Manne and Richels, 1997). Today, the electricity system is mainly fossil-fuel based and centralized while power transmission and energy storage play a minor role. Regarding the considerable contribution of the power sector, substantial changes must be made in its present structure. Promotion of low emitting or emission-free technologies is of high priority to meet the proposed emissions reduction targets and to deal with the scarcity of fossil fuel resources. Projections of the global energy mix in integrated assessment models show that within the coming

1 century a significant share of renewable energies is required to achieve  
2 stabilization targets of 450 and 400 ppm CO<sub>2</sub>-eq; there, mostly solar and wind  
3 energy are proposed as well as biomass as promising energy resources (van  
4 Vuuren et al., 2009).  
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10 The potential for reducing CO<sub>2</sub> emissions in the long term has been evaluated  
11 in various studies, by focusing on national electricity generation systems  
12 (Heitman and Hamacher, 2009; Mathur et al., 2003). In Heitman and Hamacher  
13 (2009), the maximum feasible abatement in the German electricity generation  
14 system of 2030 has been determined, applying the German electricity system  
15 model. Influence of the carbon price and its uncertainty has been studied with  
16 stochastic parameterization of the specified planning tool based on stochastic  
17 linear programming. A study has been performed by Mathur et al. (2003) with  
18 applying the energy planning tool MARKAL to simulate the Indian power sector  
19 over a time horizon from 2000 to 2025. The results show that besides hydro  
20 power, wind energy is an alternative solution, which becomes more and more  
21 attractive with the introduction of carbon taxes, while photovoltaic systems with  
22 the considered characteristics do not have any chance for large-scale  
23 penetration.  
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45 While the issue of long-term technological change has a high priority, short-term  
46 effects, caused by the internalization of emissions costs in an existing fleet of  
47 generation plants, may not be ignored. This concerns the influences on CO<sub>2</sub>  
48 emissions before an optimal mix of low emitting power generation technologies  
49 could be brought online. In the short run, the demand for electricity would be  
50 met at the lowest cost by re-dispatching the existing generation units according  
51 to their marginal costs, which has risen by the CO<sub>2</sub>-price. Short-term effects of  
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1 imposing prices on CO<sub>2</sub>-emissions of the U.S electric generators have been  
2 studied in Newcomer et al. (2008). A comprehensive study of the short-term  
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4 abatement in the European power sector has been conducted in (Delarue,  
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7 2009).

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10 In this paper, the focus is laid on both of the specified time horizons, which are  
11 relevant for studying systematic influences on CO<sub>2</sub> emissions of the power  
12 system. Regarding the concern about the contribution of all parts of the world in  
13 an international movement towards an emission free electricity supply system, it  
14 is relevant to study this issue on the world-wide scale. Possible influences on  
15 the CO<sub>2</sub> emissions abatement and the CO<sub>2</sub>-price are studied by applying a  
16 linear investment and production optimization model of the global electricity  
17 generation system. While the potential for reducing CO<sub>2</sub> emissions in the short  
18 term is evaluated, long-term abatement in the power sector and required  
19 structural adaptations are studied. A special focus is laid on the influences  
20 caused by the integration of Fluctuating Renewable Energy Sources (FRES),  
21 i.e. solar and wind energy, and the role of an ideal global grid.  
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40 The paper proceeds as follows. In section two, the model used to optimize the  
41 global electricity generation system is described. Section three elaborates the  
42 calibration of this optimization model according to the actual power generation  
43 and emissions data of the year 2000, before a carbon price existed in any part  
44 of the world. The CO<sub>2</sub> emissions abatement that would be achieved if there was  
45 an internalization of emissions costs in all countries in 2006 is estimated in  
46 section 4.1. In section 4.2, interactions of different factors, influencing CO<sub>2</sub>  
47 emissions of the power system, are studied. Section 4.3 focuses on the new  
48 investments, required to satisfy long-term emissions reduction targets; influence  
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1 of the possibility for extension of solar and wind power and the role of  
2 international electricity exchange are investigated. In the last part conclusions  
3 are drawn.  
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## 8 **2 Model Description**

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10 In this paper, a global, multi-regional electricity system investment planning  
11 model is applied (Aboumahboub et al., 2010); it has been developed based on  
12 the linear programming optimization method applying the General Algebraic  
13 Modeling System (GAMS) software package (Rosenthal, 2008). The model is  
14 an extension of the German electricity system model (Heitman and Hamacher,  
15 2009).  
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26 Optimization can be performed over a one-year period with an hourly temporal  
27 resolution. The simulation methodology is adequate to properly mimic  
28 geographical dependencies of energy supply and demand as well as short-term  
29 and seasonal variations of the electricity produced from FRES and of the  
30 electricity load. The model is able to mimic complex interactions of system  
31 components within a multi-regional, interconnected electricity supply system by  
32 representing technical restrictions of power plants on a technology level,  
33 temporal fluctuations and geographical dependencies of renewable energy  
34 sources, and exogenously imposed boundary conditions.  
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48 New investments in power generation, storage and inter-regional power  
49 transmission are optimized by considering the development of electricity  
50 demand, variability of FRES, and influences of framework conditions. The  
51 power produced by each of the power plant technologies, inter-zonal energy  
52 flows, CO<sub>2</sub> emissions, and marginal price of electricity in perfect competitive  
53 markets are determined for each region at every hour of the simulation period.  
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1 The cost of avoiding one ton of CO<sub>2</sub> - i.e. marginal price of CO<sub>2</sub> emissions - is  
2 also concluded from the optimization model.  
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5 The model covers a worldwide scale. The spatial resolution of the model is at  
6 first limited according to the geographical detail of the used meteorological data.  
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8 Additionally, the temporal resolution and geographical accuracy are limited  
9 according to the accessible computation power and due to the long calculation  
10 time. The global model, which is applied in this paper, comprises 50 regions.  
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12 The model regions are determined not only based on the political borders but  
13 also according to the geographic distribution of electricity demand and  
14 renewable supply. The zonal configuration of the model is represented in  
15 Table A.1.  
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27 In the following, formulation of the model is described. Table B.1 gives an  
28 overview of the used symbols.  
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## 32 33 34 **2.1 Model Formulation** 35 36

37 Total system costs serve as objective function and are given in (1). It is  
38 composed of total investment, fixed and variable operation costs of all power  
39 plants, inter-regional power transmission lines, and energy storage facilities.  
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41 The last sum represents the emissions costs. From a macro-economic  
42 perspective, minimization of overall costs, which corresponds to maximization of  
43 producers' and consumers' surplus, defines an ideal operation of the energy  
44 system through a central planner.  
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$$\begin{aligned}
z = & \sum_x \left\{ \sum_{i \in \text{Pr PG}} [k_i^{\text{Inv}} \cdot \text{CN}_i(x) + k_i^{\text{Fix}} \cdot \text{C}_i(x) + \sum_t k_i^{\text{Var}} \cdot \text{E}_i^{\text{in}}(x, t) \cdot w(t)] \right. \\
& + \sum_y \sum_{i \in \text{Pr Tr}} \left[ \frac{1}{2} r(x, y) \cdot (k_i^{\text{Inv}} \cdot \text{CNT}_i(x, y) + k_i^{\text{Fix}} \cdot \text{CT}_i(x, y)) + \sum_t k_i^{\text{Var}} \cdot \text{ET}_i^{\text{in}}(x, y, t) \cdot w(t) \right] \\
& + \sum_{i \in \text{Pr Sto}} [k_i^{\text{Inv}} \cdot \text{CNSt}_i(x) + k_i^{\text{Fix}} \cdot \text{CSt}_i(x) + \sum_t k_i^{\text{Var}} \cdot \text{ES}_i^{\text{in}}(x, t) \cdot w(t)] \\
& + \sum_{i \in \text{Pr Sto}} [k_i^{\text{Inv}} \cdot \text{CNStout}_i(x) + k_i^{\text{Fix}} \cdot \text{CStout}_i(x) + \sum_t k_i^{\text{Var}} \cdot \text{ES}_i^{\text{out}}(x, t) \cdot w(t)] \\
& + \sum_{i \in \text{Pr Sto}} [k_i^{\text{Inv}} \cdot \text{CNSt}_i(x) + k_i^{\text{Fix}} \cdot \text{CSt}_i(x) + \sum_t k_i^{\text{Var}} \cdot \text{ES}_i^{\text{Tot}}(x, t)] \\
& \left. + \sum_{i \in \text{Pr PG}} \sum_t [E_i^{\text{in}}(x, t) \cdot \text{kemf}_i \cdot \text{kCO}_2e \cdot w(t)] \right\} \quad (1)
\end{aligned}$$

Minimization of overall system costs is subject to restrictive equations, describing the energy system. The demand satisfaction constraint, given in (2), certifies that at each hour, the total power produced by all power plants available at each region plus the import-export balance and storage output minus the power that hydro pumped-storage units need for pumping is equal to the electricity demand of that region at the corresponding hour. Overproduction is allowed when there is excess production from FRES.

$$\begin{aligned}
& \sum_{i \in \text{Pr PG}} E_i^{\text{out}}(x, t) + \sum_y \sum_{i \in \text{Pr Tr}} [\text{ET}_i^{\text{out}}(x, y, t) - \text{ET}_i^{\text{in}}(x, y, t)] \\
& + \sum_{i \in \text{Pr Sto}} [\text{ES}_i^{\text{out}}(x, t) \cdot \eta_i^{\text{out}} - \text{ES}_i^{\text{in}}(x, t) \cdot \eta_i^{\text{in}}] \geq \text{dem}(x, t) \quad (2)
\end{aligned}$$

According to (3), the total capacity of each power plant technology is equal to the previously installed capacity, given as a parameter, plus the newly installed capacity, which is optimized.

$$C_i(x) = \text{C0}_i(x) + \text{CN}_i(x) \quad (3)$$

The capacity constraint, given in (4), certifies that the total installed capacity of each generation technology at each region is lower than the associated upper limit. The total capacity of each renewable technology is restricted according to

the corresponding technical potential (see section 2.2). Eq. (5) represents the losses, occurring through energy conversion processes.

$$C_i(x) \leq cUp_i(x) \quad (4)$$

$$E_i^{out}(x,t) = E_i^{in}(x,t) \cdot \eta_i \quad (5)$$

The energy-capacity balance for dispatchable power plants and non-dispatchable renewable power plants is given in (6) and (7), respectively. It is assumed that a conventional power plant has a maximal output at each hour, which is equal to its rated output multiplied by the standard availability factor. The availability factor (*AVF*) is a technology-specific parameter to downscale the capacity of a power plant due to periodic maintenance and forced outages. However, for non-controllable energy sources, additionally, a time- and region-specific capacity factor (*Supim*) is used to determine the available energy from weather dependent renewable sources such as solar, wind, and hydro at every hour of the simulation period.

$$E_i^{out}(x,t) \leq C_i(x) \cdot AVF_i \quad (6)$$

$$E_i^{out}(x,t) = C_i(x) \cdot AVF_i \cdot Supim_i(x,t) \quad (7)$$

Technical constraints of dispatchable power plants are respected at a technology-aggregated level. Technology ramping constraints are represented in (8).

$$\left| E_i^{out}(x,t) - E_i^{out}(x,t-1) \right| \leq ramp_i \cdot C_i(x) \quad (8)$$

The following constraints limit the maximum input, output, and stored energy according to the total available capacity.



$$EST_i^{in}(x,t) \leq CStin_i(x) \quad (9)$$

$$EST_i^{out}(x,t) \leq CStout_i(x) \quad (10)$$

$$EST_{Tot}_i(x,t) \leq CSt_i(x) \quad (11)$$

The balance equation, given in (12), defines the energy content of the reservoir at each time step by taking into account the output power and energy inflow for the pump processes.

$$EST_i(x,t) = EST_i(x,t-1) + EST_i^{in}(x,t) \cdot \eta_i^{in} - \frac{EST_i^{out}(x,t)}{\eta_i^{out}} \quad (12)$$

The inter-zonal energy transport lines are modeled as trade-based interconnections. Eq. (13) limits the transport capacity between model regions according to the given upper limit. The next restriction limits the inter-zonal energy flow according to the total available capacity. Eq. (15) represents the energy balance by taking into account the transport losses.

$$CTr_i(x,y) \leq cUpTr_i(x,y) \quad (13)$$

$$ETr_i^{out}(x,y,t) \leq CTr_i(x,y) \quad (14)$$

$$..ETr_i^{out}(x,y,t) = ETr_i^{in}(x,y,t) \cdot (1 - Trl_{i,r}(x,y)) \quad (15)$$

The CO<sub>2</sub> emissions constraint is given in (16). Total CO<sub>2</sub> emitted from all power plants must be lower than the given CO<sub>2</sub>-limit. According to the property of primal/dual systems in linear programming (Dantzig, 1997), the dual variable of Eq. (16) represents how much the system costs would increase if CO<sub>2</sub> emissions would be mitigated by another one unit. This determines the CO<sub>2</sub>-price for the given level of abatement.

$$\sum_x \sum_{i \in PrPG} \sum_t E_i^{in}(x,t) \cdot kemf_i \cdot w(t) \leq co2Up \quad (16)$$

## 2.2 Model Database

The satellite data of Surface Solar Irradiation Data Set (SSIDS) have been used here to determine the geographic distribution of hourly variations of available solar energy (Bishop, 2000). To evaluate the variable output power from wind turbines in on- and off- shore sites on an hourly basis, the modeled wind speeds of World Wind Atlas (WWA, 2009) have been applied. The transformation from wind velocity to active power output has been made applying the multi-turbine power curve approach (Norgaard and Holttinen, 2004; VESTAS, 2009).

Total capacity of renewable power plants that can be installed at each model region is limited according to the geographical potential. This has been determined based on the detailed analyses of global technical potential of wind energy and solar thermal electricity production (Aboumahboub et al., 2010; Brückl, 2005; Tzscheutschler, 2005).

Geographically aggregated projections of the global electricity demand over the time period from 2010 to 2100 based on the B2 scenario of Intergovernmental Panel on Climate Change (IPCC) has been rescaled according to the spatial distribution of population (IIASA GGI, 2009). The hourly electrical load profile of each region has been determined using the linear combination of normalized load curves of comprising countries (Elerging OÜ, 2009; ENTSOE, 2009; UK National Grid, 2009; Zickermann, 2005).

The Capacity of operating power plants has been determined using the UDI World Electric Power Plants Data Base (UDI WEPP, 2010). To reduce the complexity, power plants have been aggregated according to the main fuel and

1 technology type. The decommissioned capacity of power plants over future time  
2 periods has been evaluated assuming a technology-specific lifetime (Roth and  
3 Kuhn, 2008).  
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7 The global energy production database, Carbon Monitoring for Action (CARMA)  
8 (Wheeler and Ummel, 2008), is a massive database, containing information  
9 about the carbon emissions of over 50000 power plants and 4000 power  
10 companies worldwide. Ultimately, through the linkage of the UDI WEPP to the  
11 CARMA database on a power plant basis, localization and mapping of existing  
12 power plants to model regions is realized.  
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### 25 **3 Model Validation**

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27 In its standard form, the model is based on a number of assumptions that may  
28 be regarded as unrealistic according to the real power generation systems. For  
29 instance, it is assumed that the prices paid for fossil fuels and used for dispatch  
30 decisions are equal through all regions. These are annual average prices in  
31 international markets. However, in reality, they vary considerably through the  
32 year and different countries. Furthermore, techno-economic parameters of each  
33 power plant technology are assumed to be uniform through all regions. The  
34 maximum production from conventional power plants is restricted by the  
35 standard availability factor (see Eq. (6)) while contract considerations are not  
36 taken into account in dispatch decisions. Moreover, it is assumed that  
37 wholesale markets are completely liberalized.  
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54 While these deviations from real conditions are typical for modeling purposes,  
55 the question, whether the model can properly mimic the behavior of an actual  
56 electricity generation system, must be addressed. Question remains also  
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1 concerning the consequent effect of the deviation from an actual condition on  
2 the estimation of CO<sub>2</sub> emissions abatement in response to a CO<sub>2</sub>-price.  
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5 The aim of this part is thus to examine if the applied methodology and the used  
6 database are capable of representing an actual mix of produced power. The  
7 year 2000 has been chosen for calibration as it is the latest period, for which all  
8 the required datasets were available at the time of writing. It also represents the  
9 time point, when the CO<sub>2</sub>-price did not exist in any part of the world.  
10

11  
12 At first, the non-calibrated model is run using the power plant stock as it existed  
13 in year 2000 along with the electricity demand, given in (EIA, 2010); standard  
14 availabilities of power plants have been taken from (VGB POWER TECH,  
15 2008); annual average fuel prices in international markets are obtained from  
16 (IEA, 2002).  
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19 Net transfer capacities (NTC) from (ENTSOE, 2009) are applied to represent  
20 the existing power transmission interconnections between the regions in  
21 Europe. Due to the lack of accurate and sufficient information about the  
22 capacity of power transmission lines between model regions outside Europe,  
23 inter-zonal electricity exchange is not included in the calibration or restricted by  
24 implementing a low upper capacity boundary. Thirteen weeks are simulated to  
25 represent the whole year. Techno-economic parameters of power plants and  
26 fuel prices are represented in Table C.1.  
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29 The non-calibrated model's output is compared with the real power production  
30 mix of year 2000 in Fig. 1. Comparison of the aggregated power production in  
31 Fig. 1.a shows that the simulation results are very close to real estimates.  
32 However, total power production from the optimization model is 2% lower than  
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1 the real produced power. The deviation is nearly zero for Europe; however, it  
2 reaches to -4% for Asia.  
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5 In the used historical data, total net electricity consumption is lower than the  
6 total net electricity generation. The explanation arises from the fact that energy  
7 losses, occurring due to reserve power production, and power transmission and  
8 distribution losses are not included in the net electricity consumption. The cost  
9 minimization model, thus, matches the total produced power to the net  
10 electricity demand while it only considers inter-regional power transmission  
11 losses. Therefore, in addition to energy losses, resulting from reserve power  
12 production, the energy losses, occurring through intra-regional power  
13 transmission and distribution, are not taken into account due to the coarse  
14 geographical resolution of the model. Furthermore, the deviation is higher in  
15 regions outside Europe due to the lack of accurate historical data for bilateral  
16 electricity exchange and the power transmission capacities between those  
17 regions.  
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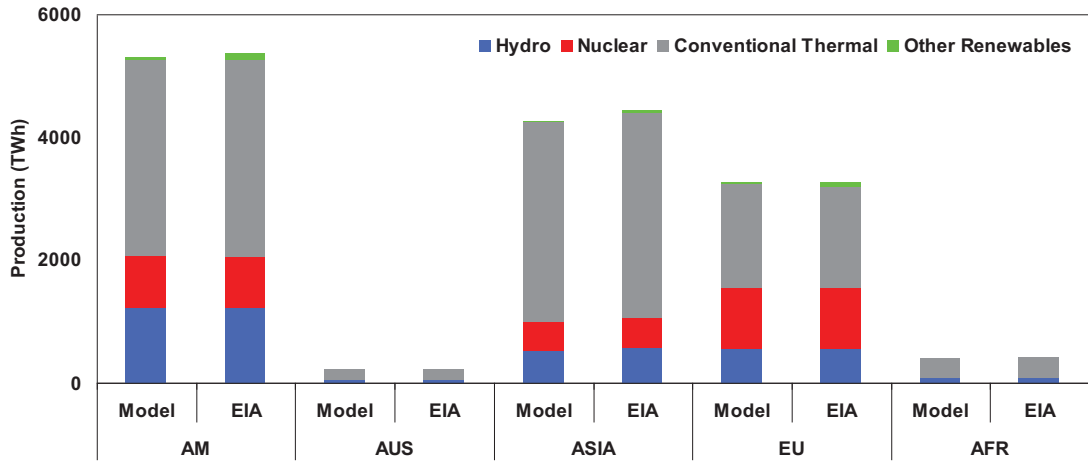
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22 By comparing the power production from the optimization model, which is  
23 categorized into power plant technologies, with the actual power generation  
24 mix, higher deviations can be noticed (see Fig. 1.b). Finally, it is concluded that  
25 there exists a general tendency: the model decides to use more coal and lignite  
26 than was actually utilized while it underestimates the usage of natural gas and  
27 oil. This tendency exists for all continents; however, the deviation is very low in  
28 Europe followed by America.  
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32 One influential factor is the ratio of the domestic price of natural gas and coal to  
33 the international market price of crude oil. The domestic prices that differ from  
34 international market values, used in the simulation, may lead to such deviations.  
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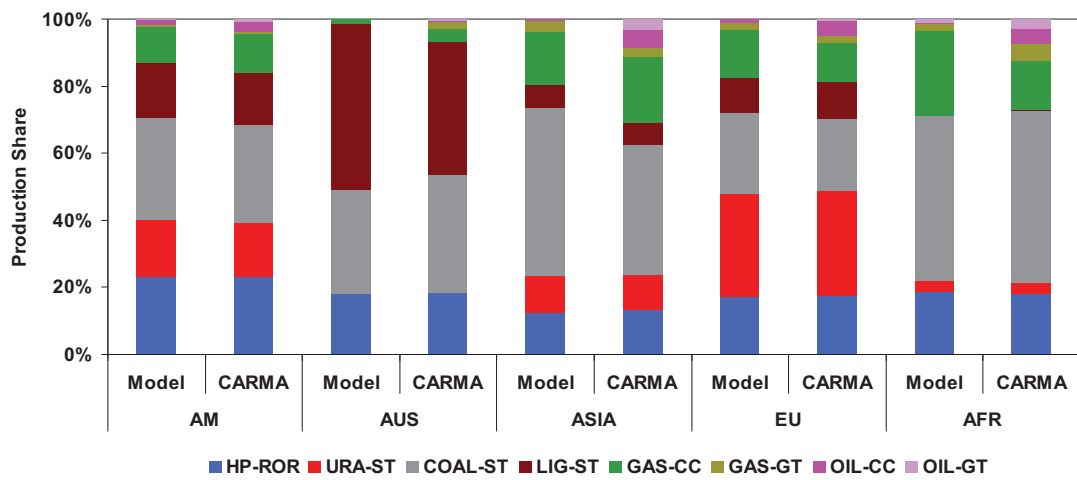
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Another influencing factor is the actual lower availability of coal- and lignite-fired plants than the assumed availability factors. Lower availability can be caused by technical restrictions and/or lack of fuel supply.

Furthermore, according to the applied deterministic approach, forecasting errors of electricity load and unforeseen fluctuations of wind power plants are not taken into account. Moreover, the model respects ramp rates of power plants at a technology level as detailed technical restrictions of power generation units can not be directly formulated within a non-mixed integer problem (Delarue, 2009). Thus, base- and mid- load technologies are considered to be more flexible than real generation plants. As a result, the model uses the cheapest available technology in dispatch decisions, and the contribution of flexible, peak and high peak generators is underestimated.



(a)



(b)

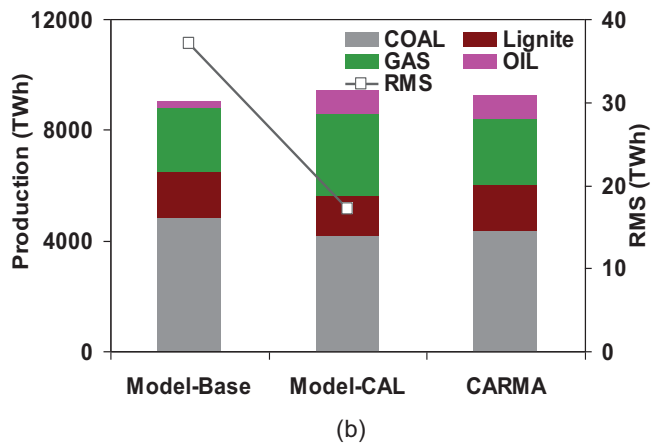
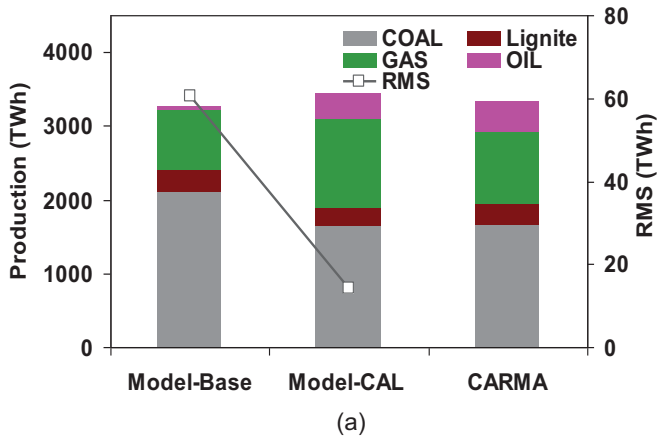
**Fig.1:** Model results vs. real net electricity generation of year 2000 (a) Comparison with EIA; (b) Comparison with CARMA

To minimize the deviation of the results, obtained from the optimization model, from the real power production mix of the year 2000, a sensitivity study is performed by varying the availabilities of power plants and fuel prices. In order to focus on the generation from fossil fuels, which are the sources of emissions, the power produced from biomass, hydro, solar, and wind are matched to real values as closely as possible. A calibrated model is then developed, which yields the least deviation from the real estimates. One main correction in developing a calibrated model is to introduce region-specific availability factors for nuclear power plants to match the power production to the real produced

1 electricity by nuclear power plants based on data from (EIA, 2010). Moreover,  
2 availability factors of coal- and lignite- fired power plants are reduced, and  
3  
4 factors are introduced to change fuel price ratios in specific regions.  
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6 Furthermore, in specific regions, the total annual electricity demand is scaled to  
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8 compensate for power transmission and distribution losses and match the total  
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10 power production to the actual net electricity generation, as it is given in (EIA,  
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12 2010).  
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17 As a measure of overall improvement, the Root Mean Square (RMS) of  
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19 absolute differences between the results of the optimization model and the real  
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21 values in terms of power generation per fuel per zone is minimized. Lower  
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23 availability of coal- and lignite- fired power plants in the calibrated model  
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25 compared to the base model leads to their replacement with gas combine-cycle  
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27 and oil-fired plants. Reduction of RMS clarifies improvement of the results  
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29 through the calibration; this factor is finally reduced by 54% at global scale (see  
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31 Fig. 2).  
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**Fig.2:** Power generation per fuel type in non-calibrated model (Model-Base) and calibrated model (Model-CAL) vs. real net generation of year 2000 (a) Asia (b) World

Total CO<sub>2</sub> emissions, obtained from the optimization model, are in good accordance with real estimates. According to an approximation provided in (Wheeler and Ummel, 2008), CO<sub>2</sub> emissions from the power sector were 9395 million tons through the year 2000. Applying the calibrated model, total CO<sub>2</sub> emissions of year 2000 reach to 9750 million tons, which is only 4% higher than the estimation given in (Wheeler and Ummel, 2008). The non-calibrated model approximates the emissions at 5% above the referenced value.

## 4 Results

### 4.1 Potential for Short-term CO<sub>2</sub> Emissions Abatement

Possible influences on CO<sub>2</sub> emissions of the global electricity sector in a short-term perspective and the influence of model calibration are studied in this subsection. The model is applied to estimate the total abatement that would be achieved if a CO<sub>2</sub>-price existed in all countries in year 2006. This year has been chosen as it is the most recent year after internalization of emissions costs in European countries, for which all the required data were available at global scale at the time of writing.

The model based on standard assumptions and the calibrated version are run using the power generation capacity of year 2006, as it is given in (UDI WEPP, 2009), along with the electricity demand and fuel prices based on data from (EIA, 2010; IEA, 2006). For this purpose, in the calibrated version, only the adjusted availability factors are taken into account while the fuel costs are assumed at annual average prices in international markets and are uniform through all regions. This can be explained as the deviations of domestic fuel prices from international market prices, which have been estimated for the year 2000, can not be assumed to remain valid in year 2006.

At first, the CO<sub>2</sub>-price is assumed at zero in all regions to estimate the emissions that would occur without its existence. This is used as a basis to approximate the possible reduction of emissions in response to a global CO<sub>2</sub>-price. In other simulation runs, the average CO<sub>2</sub>-price of the European power sector in year 2006 (18 €/ton) is used as a uniform price in all regions. The abatement is determined by taking the difference between the runs that incorporate the carbon price and the base case with a zero CO<sub>2</sub>-price.

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If a zero CO<sub>2</sub>-price existed in all countries, total CO<sub>2</sub> emissions of the year 2006 would reach to 12445 million tons according to the results of the calibrated model. Based on the results of the non-calibrated model and the potential for emissions reduction, estimated by the calibrated version, an upper and a lower bound of 1165 and 625 million tons can be proposed for the abatement that would be achieved through fuel switching in response to a global carbon price of 18 €/ton in year 2006. The non-calibrated model overestimates the emissions and achievable abatement due to the higher utilization of existing coal- and lignite- fired power plants than in reality (see section 3). However, the calibrated model approximates a minimum level for the abatement potential. Downward adjustment of the availability of coal- and lignite- fired plants in the calibrated version leads to the reduction of emissions and achievable abatement.

## 4.2 Topology of Abatement – Complex Interaction of Influential Factors

Here, interaction of different influential factors of CO<sub>2</sub> emissions is studied in detail. These include the system load, fuel prices, and the share of renewable energies in addition to the CO<sub>2</sub>-price.

### 4.2.1 Scenario Setup

An optimization is performed for a medium-term horizon, the year 2025. Thirteen weeks are simulated to represent the total year. Hourly variations of wind power capacity factor and solar irradiation are determined based on the meteorological data of the year 1993, given in (Bishop, 2000; WWA, 2009). The approach applied to estimate these parameters is described in (Aboumahboub et al., 2010).

1 While in baseline scenario extension of renewable technologies is not allowed,  
2 in scenarios “WND-OPT” and “WND-OPT-CFH”, extension of wind power at  
3 each region up to the technical potential is possible. The model chooses the  
4 most promising sites according to the wind power’s investment costs, annual full  
5 load hours, temporal fluctuations and correlation with regional electrical load  
6 profiles as well as proximity to densely populated areas. The “WND-” scenarios  
7 differ in the applied time series of wind power capacity factor. The average wind  
8 power capacity factor is 20% and 25% in scenarios “WND-OPT” and “WND-  
9 OPT-CFH”, respectively. This is due to the lower assumed cut-in wind speed for  
10 the transformation of wind velocity to active power output in preparation of the  
11 time series of wind power capacity factor for scenario “WND-OPT-CFH”.  
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27 It is assumed that the nuclear power’s operation time is restricted to 34 years  
28 for all regions; new investments are not allowed. Moreover, it is assumed that  
29 operating hydro power plants are not expandable. The new capacities of  
30 geothermal power plants are restricted according to the planned capacities,  
31 given in (UDI WEPP, 2010). Already installed capacities for power transmission  
32 and storage up to the year 2009 are set as upper capacity boundaries. A rather  
33 low CO<sub>2</sub>-price of 24 €/ton is used. Assumed techno-economic parameters of  
34 power plants and fuel prices are represented in Table D.1 and Table D.2. The  
35 investment costs are annualized using the economic lifetimes, given in  
36 Table D.1, and by assuming a discount rate of 5%/a.  
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51 Fig. 3 shows the total generation capacity mix. The base case represents a  
52 coal-based system with nearly zero share of wind energy while this share  
53 reaches to 17% and 34% of the global electricity demand in scenarios  
54 “WND-OPT” and “WND-OPT-CFH”, respectively.  
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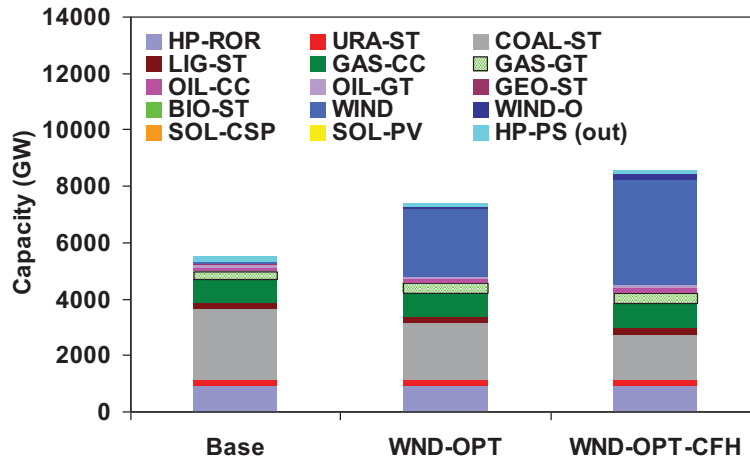


Fig.3 Optimal power generation capacity mix in scenarios “Base”, “WND-OPT”, and “WND-OPT-CFH”

Fig. 4 compares the total installed capacity for wind power production in scenarios “WND-OPT” and “WND-OPT-CFH” with scenarios of the Global Wind Energy Council (GWEC, 2006). The scenario “Advanced 2030” with 20% penetration share of wind power is the closest to the optimization results, obtained from the scenario “WND-OPT”.

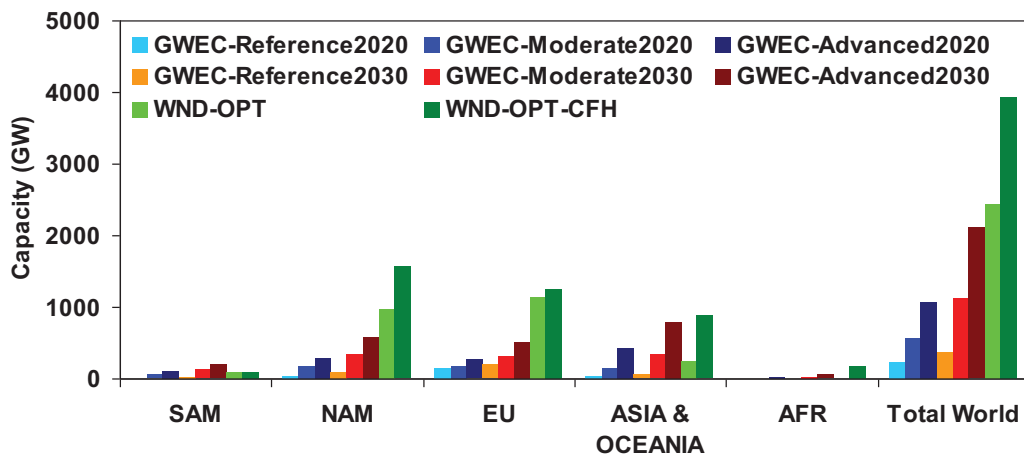


Fig.4 Total wind power capacity in scenarios “WND-OPT” and “WND-OPT-CFH” vs. Global Wind Energy Council scenarios

The optimal capacity of power plants obtained from the scenarios “Base” and “WND-OPT” is now used as a basis to represent two possible configurations of a medium-term global electricity system, differing in the integrated share of FRES.

#### 4.2.2 Influence of Load and CO<sub>2</sub>-certificate price

The capacity of power plants are now fixed at the optimal levels, obtained from the scenarios “Base” and “WND-OPT”; a sensitivity study is then performed, using the variation of CO<sub>2</sub>-price and fuel prices. In all cases, the CO<sub>2</sub>-price is increased from zero to 100 €/ton at intervals of 20 €/ton. Another influential factor is the ratio of the natural gas price or the oil price to the price of hard coal. However, at first, the focus is laid on the influence of hourly electricity load and the CO<sub>2</sub>-price; thus, constant fuel prices are used.

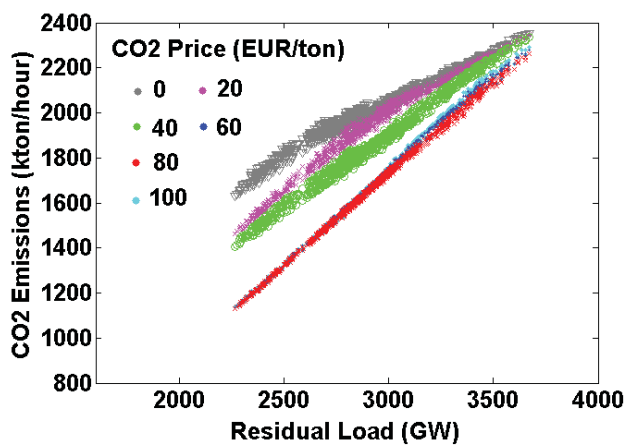
The residual load is identified as a main influencing factor of CO<sub>2</sub> emissions. Higher load implies more energy production. The residual load – a part of load, not being covered by wind energy – must be satisfied with fossil energy, and, thus, correlates with hourly emissions. Fig. 5.a and Fig. 6.a show the dependency of hourly global emissions on hourly load at different CO<sub>2</sub> prices.

The achieved abatement is determined by subtracting the CO<sub>2</sub> emissions at each hour at a positive CO<sub>2</sub>-price from the CO<sub>2</sub> emissions, occurring at the corresponding hour at the zero CO<sub>2</sub>-price. According to Fig. 5.b and Fig. 6.b, hourly abatement decreases with the residual load regardless of the CO<sub>2</sub>-price and the share of wind energy. In response to a CO<sub>2</sub>-price fuel switching occurs; the possibility for fuel switching with constant fossil fuel prices depends on the available capacity of low emitting generation plants. At lower levels of load, in the coal-based system of baseline scenario and in an electricity generation system with a moderate share of wind energy, obtained from the “WND-OPT”, coal-fired plants operate at base load; gas-fired plants are available for substitution at higher CO<sub>2</sub> prices. However, at peak load, power plants mostly operate at their full installed capacity; thus, the potential for fuel switching

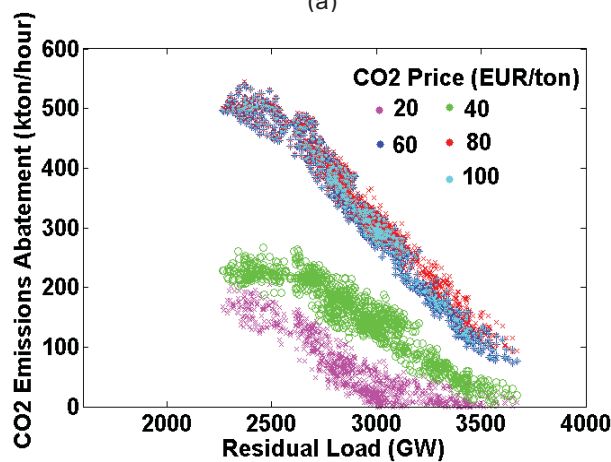
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diminishes. Due to the lower utilization of coal-fired plants in scenario “WND-OPT” as compared to the base case, the potential for fuel switching is reduced at any given CO<sub>2</sub>-price. This effect is more evident at lower levels of load.

Furthermore, it is concluded that a CO<sub>2</sub>-price of 20-40 €/ton is not adequately high to encourage a significant abatement in the considered power systems. Limited fuel switching occurs only at lower levels of load. At a higher CO<sub>2</sub>-price of 60 €/ton, a significant level of abatement is achieved. However, saturation effects occur afterwards, and further changes at higher CO<sub>2</sub> prices (80-100 €/ton) are insignificant.

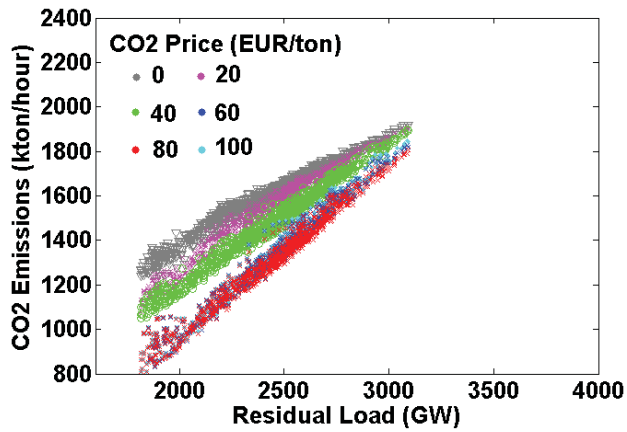


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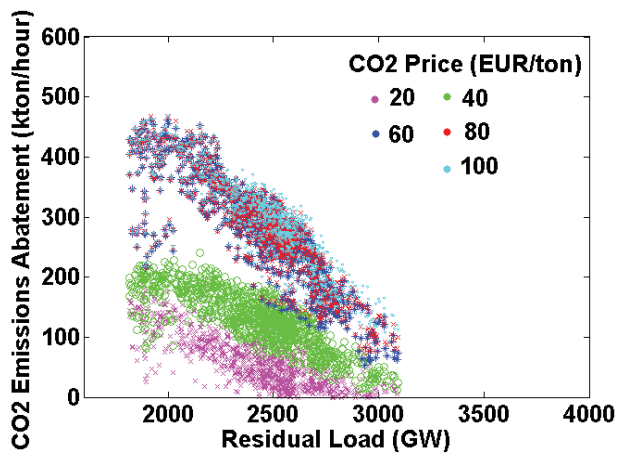


(b)

Fig.5: Influence of load and CO<sub>2</sub>-price on CO<sub>2</sub> emissions in scenario “Base” (a) Sorted hourly CO<sub>2</sub> emissions summed over all regions; (b) Corresponding abatement



(a)



(b)

Fig.6: Influence of load and CO<sub>2</sub>-price on CO<sub>2</sub> emissions in scenario “WND-OPT” (a) Sorted hourly CO<sub>2</sub> emissions summed over all regions; (b) Corresponding abatement

#### 4.2.3 Fuel Price Effects

In order to clarify the absolute impact of fuel prices, variation of load through the year is initially excluded from the results.

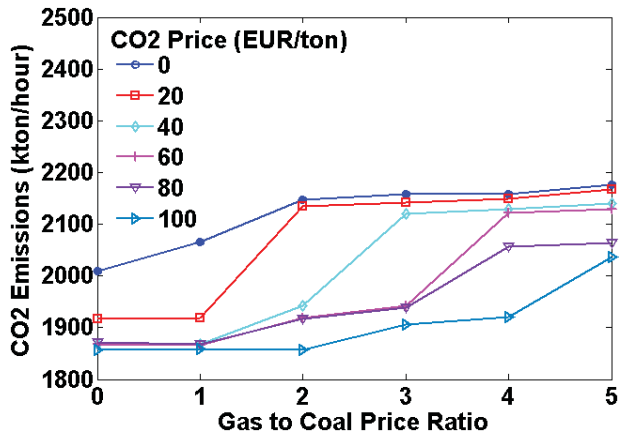
Fig. 7 and Fig. 8 show the CO<sub>2</sub> emissions and the corresponding abatement at a typical winter peak hour over a range of gas to coal price ratios. At a zero CO<sub>2</sub>-price, when the gas price is reduced to zero, hourly CO<sub>2</sub> emissions reach to around 2000 and 1500 ktons in scenarios “Base” and “WND-OPT”, respectively (see Fig. 7.a and Fig. 8.a). If the gas price rises, the power produced from coal substitutes the power generation from natural gas. Correspondingly, CO<sub>2</sub> emissions rise and at a gas to coal price ratio of 2 reach



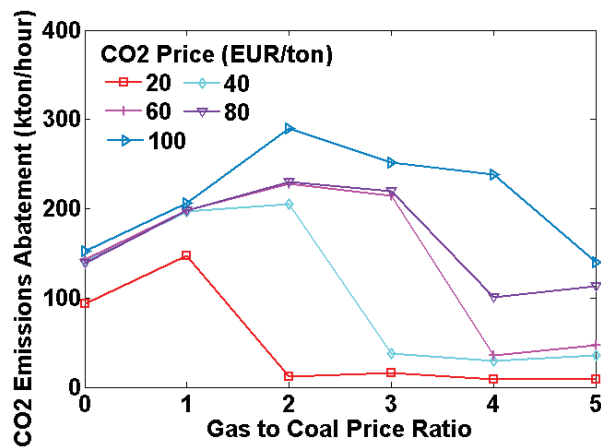
1 to a peak of around 2150 and 1600 ktons in scenarios “Base” and “WND-OPT”,  
2 respectively. According to Fig. 7.a and Fig. 8.a, when increasing the CO<sub>2</sub>-price,  
3 lines are pushed down, and the peak of abatement is shifted to the right. At any  
4 given CO<sub>2</sub>-price, when increasing the gas price, less efficient gas-fired units are  
5 initially replaced by the most efficient coal-fired power plants. At higher gas  
6 prices, it is economic to replace even the most efficient combined-cycle plants  
7 with lignite-fired units. At higher CO<sub>2</sub> prices, the capacity utilization of coal-fired  
8 units is reduced due to the higher emissions costs, and gas combined-cycle  
9 plants mainly operate at base load. Hence, switching opportunities are  
10 exhausted at higher gas prices.

11 The abatement, achieved in response to a CO<sub>2</sub>-price, is calculated by taking the  
12 difference between the emissions at the corresponding CO<sub>2</sub>-price and the  
13 emissions, occurring at a zero CO<sub>2</sub>-price. Fig. 7.b and Fig. 8.b show the  
14 corresponding abatement in scenarios “Base” and “WND-OPT”, respectively. At  
15 a low gas price, there are very few switching opportunities because gas-fired  
16 plants have been already committed as base load generators. Thus, all the  
17 abatement lines reach their minimum at a gas price of zero. While increasing  
18 the gas price, more coal-fired capacity is committed at the expense of natural  
19 gas until the technical limits are reached. This creates opportunities for fuel  
20 switching, which can be utilized with increasing the CO<sub>2</sub>-price. Hence, the  
21 abatement rises when increasing the gas price. However, at any given CO<sub>2</sub>-  
22 price, there is a gas to coal price ratio, which is adequately high to make further  
23 switching in favor of gas economically unattractive. From this point onward,  
24 more switching opportunities are continuously created by increasing the gas  
25 price until the technical limits are reached. However, at the given CO<sub>2</sub>-price,  
26 further commissioning of lower emitting gas-fired units at the expense of coal-

fired plants is economically unattractive. Therefore, all the abatement lines reach a peak and fall afterwards. At higher CO<sub>2</sub> prices, the peak of abatement is higher and occurs mainly at a gas to coal price ratio of 2.

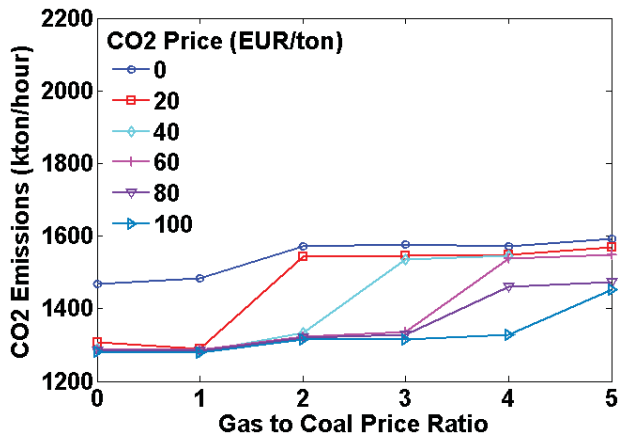


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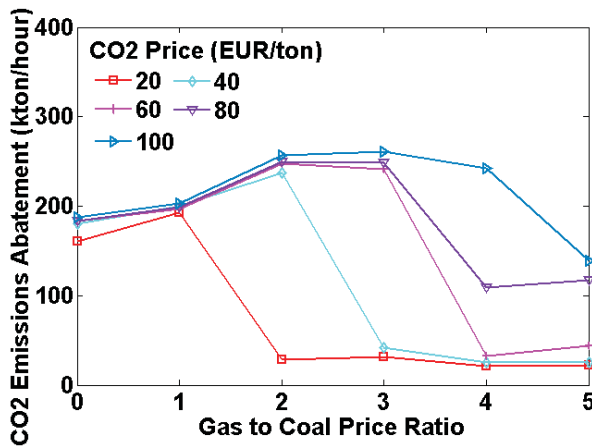


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Fig.7 Influence of CO<sub>2</sub>-price and fuel price on CO<sub>2</sub> emissions at a typical winter peak hour in scenario "Base" (a) CO<sub>2</sub> emissions summed over all regions; (b) Corresponding abatement



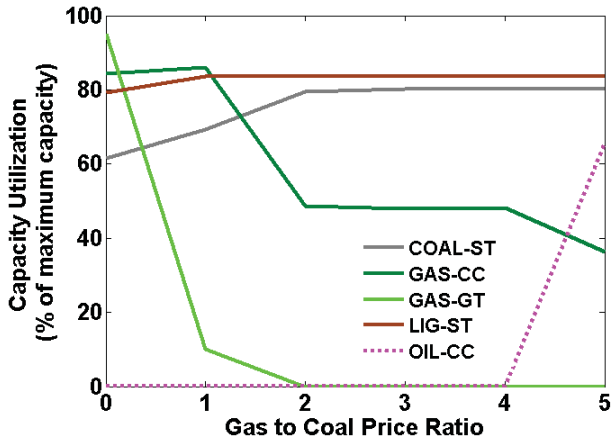
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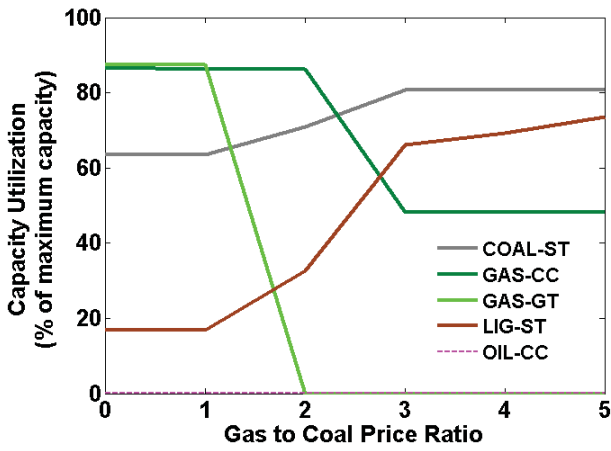
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Fig.8: Influence of CO<sub>2</sub>-price and fuel price on CO<sub>2</sub> emissions at a typical winter peak hour in scenario “WND-OPT” (a) CO<sub>2</sub> emissions summed over all regions; (b) Corresponding abatement

The CO<sub>2</sub> emissions are changed due to the variation of the capacity utilization of fossil-fired power plants. This is caused by variation of the CO<sub>2</sub>-price and fuel costs. In order to clarify underlying effects, imposed by price variations, and making a comparison between the base case and the “WND-OPT” scenario, capacity utilization of fossil-fired plants is illustrated in Fig. 9 and Fig. 10 for a typical winter peak hour as in Fig. 7 and Fig. 8.

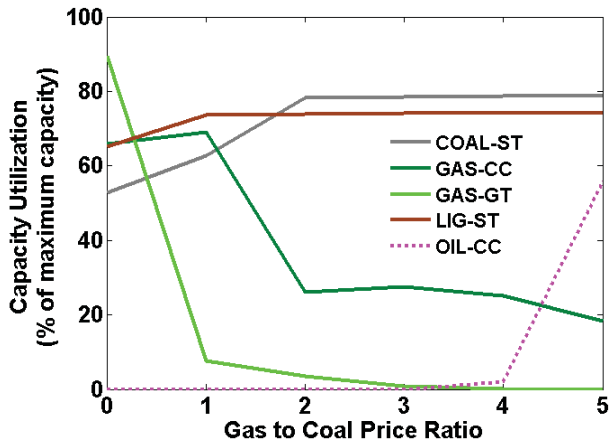


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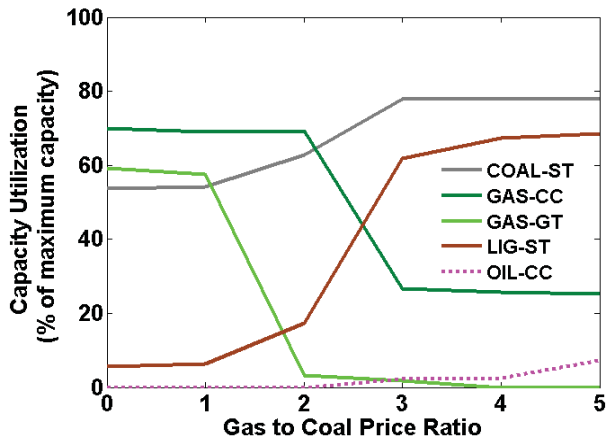


(b)

Fig.9: Capacity utilization of thermal power plants at a typical winter peak hour in scenario "Base"  
 (a) CO<sub>2</sub>-price is 0 €/ton; (b) CO<sub>2</sub>-price is 40 €/ton



(a)



(b)

**Fig.10:** Capacity utilization of thermal power plants at a typical winter peak hour in scenario “WND-OPT”  
(a) CO<sub>2</sub>-price is 0 €/ton; (b) CO<sub>2</sub>-price is 40 €/ton

According to Fig. 9 or Fig. 10, when increasing the CO<sub>2</sub>-price, the point, where the capacity utilization of gas combined-cycle plants starts to decrease, moves towards a higher gas price. At a positive CO<sub>2</sub>-price, the capacity utilization of gas turbine significantly reduces at a gas to coal price ratio of 2. By comparing the capacity utilization of gas turbine between Fig. 10.a and Fig. 10.b, a significant reduction is noticed at a gas price of zero when increasing the CO<sub>2</sub>-price. However, according to Fig. 9, this effect is negligible in baseline scenario. Additional reduction of the power produced by fossil-fired plants in scenario “WND-OPT” is balanced through a higher usage of energy storage to reduce the discarded wind energy.

According to Fig. 11.b, at a zero gas price, the storage output significantly increases in response to an additional increase in the CO<sub>2</sub>-price. This occurs because the system has the potential to reduce the discarded wind energy through an increased application of energy storage. As a result, discarded wind energy reduces at maximum by 5% (240 TWh) when the CO<sub>2</sub>-price is increased from 0 to 60 €/ton. This effect additionally contributes in the reduction of CO<sub>2</sub> emissions, achieved through fuel switching. Thus, total abatement, achieved at

a zero gas price, is higher in the “WND-OPT” scenario as compared to the base case (see Fig. 7.b and Fig. 8.b).

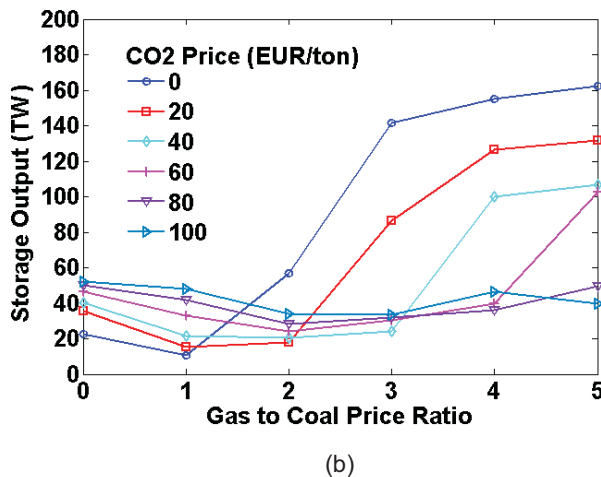
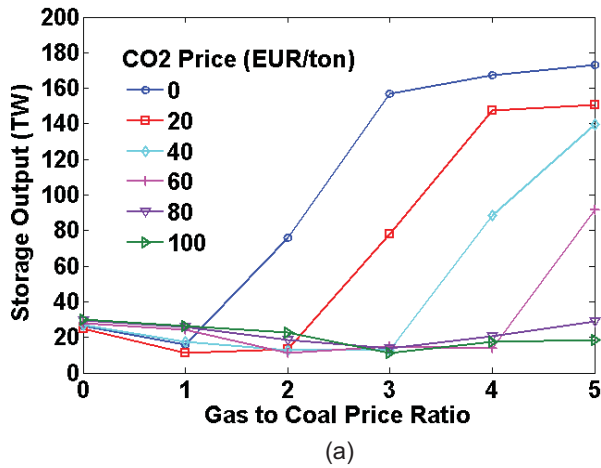
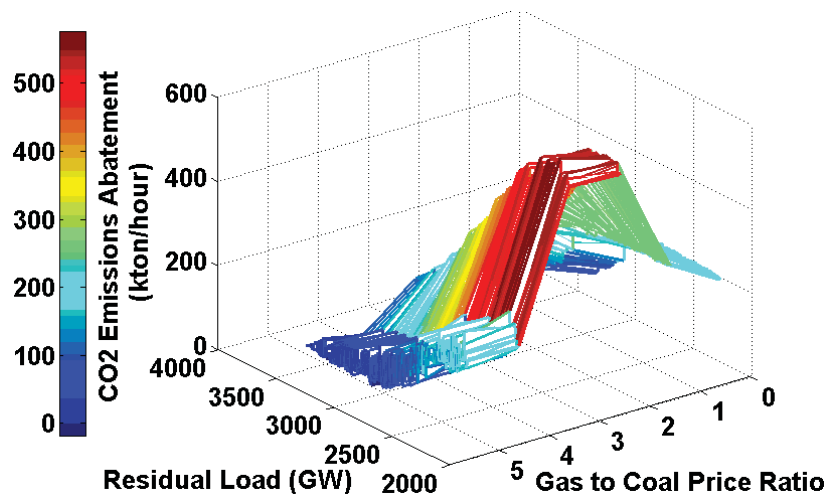


Fig.11: Storage output power at a typical winter peak hour (a) Scenario “Base”; (b) Scenario “WND-OPT”

According to Fig. 11, in both scenarios, when increasing the gas price, the storage output reduces until it reaches a minimum, where gas and coal are economically balanced at the given CO<sub>2</sub>-price. It starts to rise when the gas price is adequately high to make the application of coal-fired plants as base load generators economically attractive at the given CO<sub>2</sub>-price. As the gas price is further increased, application of energy storage becomes more and more economic to store the power produced by coal-fired plants for peak shaving purposes. It follows a similar trend in both scenarios. Therefore, the difference

between the achieved abatement in scenario “WND-OPT” and the “Base” scenario is the highest at a gas price of zero and decreases afterwards (see Fig. 7.b and Fig. 8.b).

For instance, Fig. 12 shows a combined effect of load and fuel price on the abatement. At higher ranges of load and extreme levels of the gas price, CO<sub>2</sub> emissions are not influenced by the CO<sub>2</sub>-price. The maximum abatement occurs at lower levels of electricity load and at a gas to coal price ratio of 2.

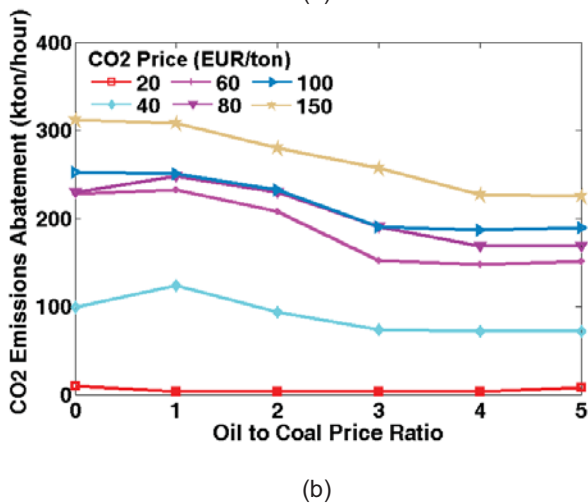
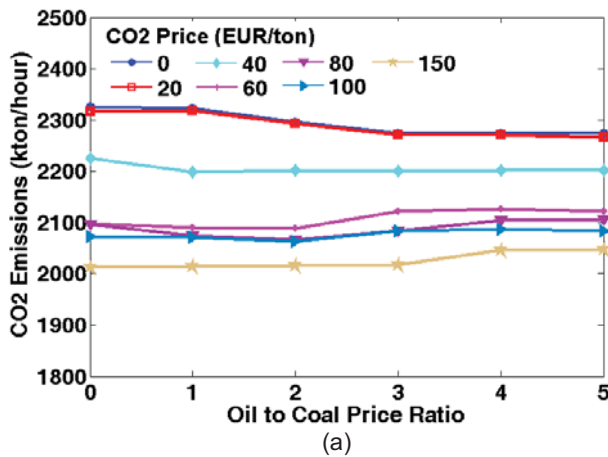


**Fig.12:** 3-dimensional representation of a combined influence of load and fuel price on CO<sub>2</sub> emissions abatement in scenario “Base” at a CO<sub>2</sub>-price of 60 €/ton

Finally, a sensitivity study is performed on the influence of the oil price. The gas to coal price ratio is fixed at 3 (see Table D.1); the ratio of the oil price to the coal price is varied from zero to 5. Fig. 13 shows the resulting CO<sub>2</sub> emissions and the corresponding abatement at a typical winter peak hour over a range of oil to coal price ratios. At a zero CO<sub>2</sub>-price, when the oil price is reduced to zero, total CO<sub>2</sub> emissions at this hour reach to around 2300 ktons (see Fig. 13.a). While the oil price is lower than the coal price including the additional emissions costs, oil-fired plants substitute the coal-fired plants, and total CO<sub>2</sub>

emissions reduces. When the oil to coal price ratio exceeds a certain limit, which varies by the CO<sub>2</sub>-price, power production from coal and the resulting emissions rise.

While increasing the oil price, the capacity utilization of coal-fired plants increases at the expense of oil. This creates opportunities for fuel switching, which can be utilized with increasing the CO<sub>2</sub>-price. Hence, the abatement rises when increasing the oil price. However, at any given CO<sub>2</sub>-price, there is a price ratio, which is adequately high to make further switching in favor of lower emitting source economically unattractive. Therefore, all the abatement lines reach a peak and fall afterwards. The peak of abatement mainly occurs at a fuel price ratio of 1.



**Fig.13** Influence of CO<sub>2</sub>-price and fuel price on CO<sub>2</sub> emissions at a typical winter peak hour in scenario "Base" (a) CO<sub>2</sub> emissions summed over all regions; (b) Corresponding abatement



#### 4.2.4 Cumulative CO<sub>2</sub> emissions

In a short-term perspective, when the available capacity of power plants remains unchanged, a higher CO<sub>2</sub>-price changes the merit-order of power plants and leads to the reduction of emissions. The minimum specific abatement cost, which leads to switching between two technologies, is defined in (17);  $u_{Em}$  is the minimum specific abatement costs in [€/ton];  $k_{Opr}$  represents the specific variable operation costs including fuel costs in [€/MWh<sub>el</sub>];  $e$  is the emission factor in [ton/MWh<sub>el</sub>].

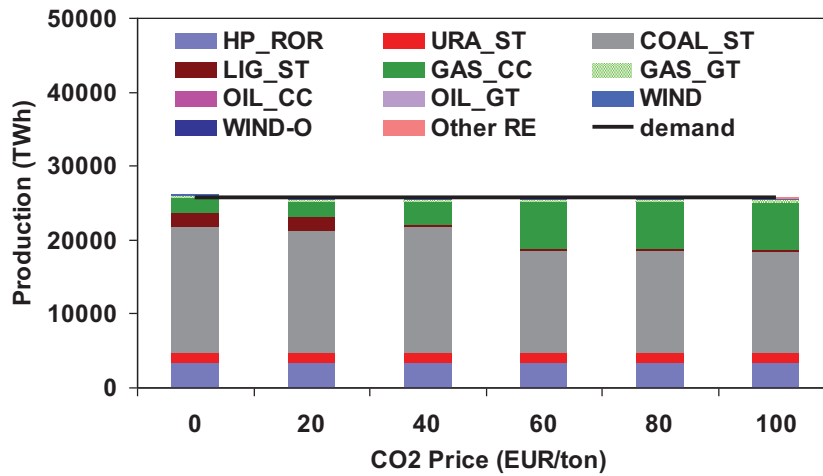
$$u_{Em} = \frac{k_{Opr,1} - k_{Opr,2}}{e_2 - e_1} \quad (17)$$

Using the parameters, given in Table D.1 and Table D.2, the minimum specific abatement costs are calculated and are given in Table 1.

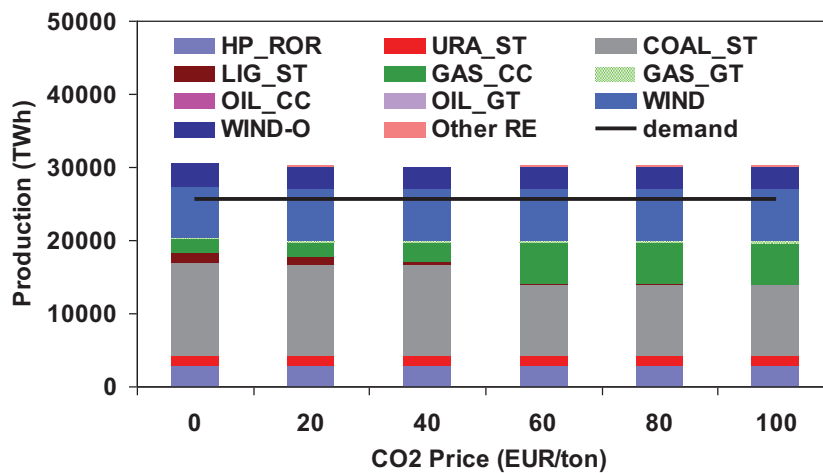
**Table1:** Minimum specific abatement costs

Technology	Minimum specific abatement costs (€/ton)
LIG-ST – COAL-ST	26
LIG-ST – GAS-CC	38
COAL-ST – GAS-CC	46
LIG-ST – GAS-GT	88
COAL-ST – GAS-GT	151

Thus, fuel switching occurs step-wise: when the CO<sub>2</sub>-price reaches the minimum abatement costs, fuel substitution starts and lasts till the technical limits are reached. Fig. 14 clarifies fuel switching effects in response to a given CO<sub>2</sub>-price. For instance, at a CO<sub>2</sub>-price of 60 €/ton, coal-fired units are replaced with gas combined-cycle plants.



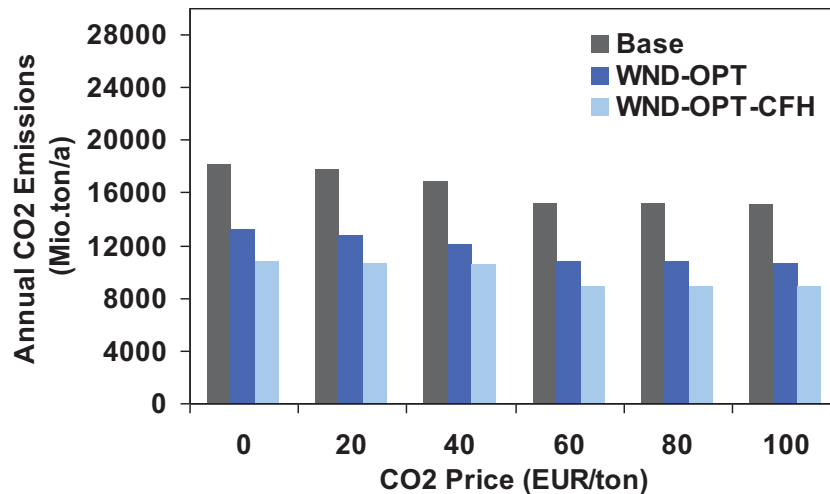
(a)



(b)

**Fig.14:** Total power production mix as a function of CO<sub>2</sub>-price (a) Scenario "Base"; (b) Scenario "WND-OPT" (constant fuel prices are used as it is given in Table D.1.)

Total annual CO<sub>2</sub> emissions are visualized in Fig. 15 for different scenarios. It is concluded that no linear relationship exists between the CO<sub>2</sub>-price and the total abatement. This is significantly influenced by the structure of the power system and the available capacity of low emitting generation plants.



**Fig.15:** Total annual CO<sub>2</sub> emissions as a function of CO<sub>2</sub>-price (constant fuel prices are used as it is given in Table D.1.)

### 4.3 Long-term CO<sub>2</sub> Emissions Abatement

So far, it has been demonstrated that the CO<sub>2</sub> emissions can be reduced by switching from high carbon fuels such as coal to low carbon fuels such as natural gas. However, for many world regions, this option has consequences on the security of supply, as they would then become dependent on the imported natural gas. Moreover, the potential is relatively limited. Ambitious emissions reduction targets can not be achieved without deployment of zero carbon energy sources such as wind and solar.

Thus, in this part, the focus is laid on the new investments in the world electricity sector, required to achieve long-term emissions reduction targets. Assuming that a global cap-and-trade system for emissions certificate trading is put into place, optimal configuration of a prospective global electricity system is investigated when global emissions caps are binding. Thus, in the following scenarios, production is constrained by regulated CO<sub>2</sub> emissions. The CO<sub>2</sub>-limit is implemented as a global system constraint, i.e. through the optimization

process it is assumed that reductions take place where it is cheapest to do so regardless of the geographical position.

#### 4.3.1 Influence of FRES on Marginal Price of CO<sub>2</sub> Emissions

At first, the effect of an ambitious global emissions reduction target of 38% below the level of emissions in year 2000 is studied. Different optimal structures of a global electricity system in year 2025 are taken into account; these differ in the share of produced electricity from FRES. In the baseline scenario, existing capacities of solar and wind power are set as upper capacity boundaries. In scenario “REOPT”, penetration share of solar and wind energy is determined by the optimization model. In “RE50-” scenarios, solar and wind power production are constrained to satisfy 50% of the global electricity demand. The share of wind energy is increased from zero to 50% and 100% of the total solar and wind power production in scenarios “RE50-WP0”, “RE50-WP50”, and “RE50-WP100”, respectively. Other assumptions are described in section 4.2.1. Scenarios are summarized in Table 2.

**Table 2:** Scenarios and underlying assumptions

Scenario	Underlying assumptions
Base	<ul style="list-style-type: none"> <li>- Total CO<sub>2</sub> emissions are limited to 5745 million tons.</li> <li>- Extension of solar and wind power beyond today is not allowed.</li> </ul>
REOPT	<ul style="list-style-type: none"> <li>- Total CO<sub>2</sub> emissions are limited to 5745 million tons.</li> <li>- Upper capacity boundary of solar and wind power at each region is the technical potential.</li> </ul>
RE50WP0	<ul style="list-style-type: none"> <li>- Total CO<sub>2</sub> emissions are limited to 5745 million tons.</li> <li>- Upper capacity boundary of solar and wind power at each region is the technical potential.</li> <li>- Solar and wind power are forced to satisfy 50% of global electricity demand.</li> <li>- Wind share is 0% of total solar and wind power production.</li> </ul>

RE50WP50	<ul style="list-style-type: none"> <li>- Total CO<sub>2</sub> emissions are limited to 5745 million tons.</li> <li>- Upper capacity boundary of solar and wind power at each region is the technical potential.</li> <li>- Solar and wind power are forced to satisfy 50% of global electricity demand.</li> <li>- Wind share is 50% of total solar and wind power production.</li> </ul>
RE50WP100	<ul style="list-style-type: none"> <li>- Total CO<sub>2</sub> emissions are limited to 5745 million tons.</li> <li>- Upper capacity boundary of solar and wind power at each region is the technical potential.</li> <li>- Solar and wind power are forced to satisfy 50% of global electricity demand.</li> <li>- Wind share is 100% of total solar and wind power production.</li> </ul>

Total power production mix is shown in Fig. 16. When implementing a CO<sub>2</sub>-limit while no possibility exists for extension of solar and wind power in baseline scenario, the production is characterized with an extensive application of gas combined-cycle and biomass power plants. As a result, the CO<sub>2</sub>-price is the highest.

Application of solar energy in scenario “RE50-WP0” allows increasing the utilization of coal-fired plants while the power production from gas is lower than the base case. Contribution of biomass is insignificant, and less power is produced from hydro and nuclear power plants in comparison with the base case. Increasing the share of wind energy in scenarios “RE50-WP50” and “RE50-WP100” allows even a higher application of coal-fired plants while the power production from gas is further reduced as compared to “RE50-WP0”. However, the operation time of hydro and nuclear power plants is higher as compared to the solar-only case.

The explanation arises from the fact that the daily pattern of solar energy positively correlates with the diurnal behavior of electricity load. Thus, in scenario “RE50-WP0”, during hours with a high gain of irradiation, there is a full integration of solar energy at specific sites. This leads to the reduction of the

operation time of hydro and nuclear power plants as compared to other scenarios. However, in winter period and during hours with no gain of irradiation, the electricity demand is mainly satisfied with gas-fired units as well as hydro and nuclear power plants. Wind power production has a timely pattern, which is more evenly distributed between the hours of day and night and through different seasons. Thus, when increasing the share of wind energy, total power production from emission-free hydro and nuclear power plants is increased from its level in the solar-only case. This allows a higher utilization of coal-fired plants, and the power production from gas-fired plants can be reduced while the same level of abatement is achieved as in the solar-only case.

According to Fig. 16, marginal price of CO<sub>2</sub> emissions decreases when increasing the share of wind energy; it reaches to its lowest level in scenario “REOPT”. In this case, the share of wind energy reaches to 52% of the global electricity demand.

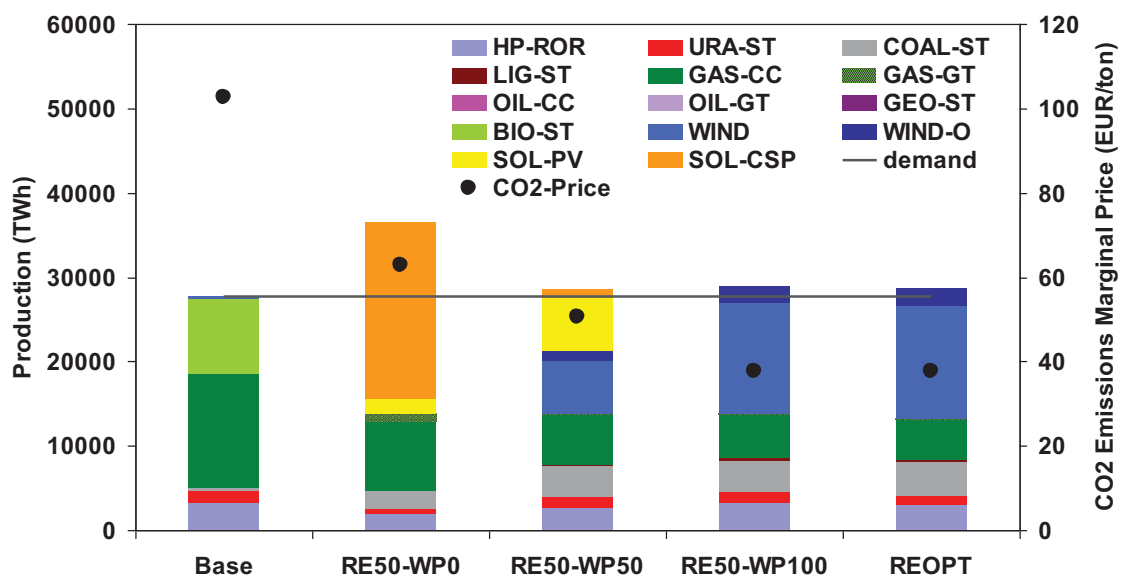


Fig.16: Total power production mix and marginal price of CO<sub>2</sub> emissions

#### 4.3.2 Influence of International Electricity Exchange in a Prospective Low-carbon Electricity Generation System

Challenges arise when integrating a high share of solar and wind energy into an electricity system mainly due to their short-term fluctuations. Smoothing effects, captured in a dispersed generation structure, can alleviate the problem. Not only statistical smoothing effects of geographical aggregation but also inter-continental, seasonal anti-correlations may provide a competitive framework for the deployment of solar and wind energy. Therefore, the focus of this subsection is laid on the influence of international electricity exchange in an ideal, globally-interconnected electricity supply structure.

Here, a long-term horizon from 2020 to 2040 in 5-year time steps is taken into account; the focus is laid on the role of a global grid as a solution option for large-scale integration of FRES. In scenario “GOPT”, the new capacity of inter-regional power transmission interconnections is optimized. To evaluate the absolute impact of a global grid, the scenario “No-GE” is also considered, having no possibility for extension of the power transmission network while other underlying assumptions are similar to scenario “GOPT”. As before, it is assumed that nuclear and hydro power plants are not expandable beyond the installed capacities. New installations of geothermal power plants are restricted according to the planned capacities, given in (UDI WEPP, 2010). The capacity of energy storage is fixed at the total capacity of year 2009. Techno-economic parameters of each power plant technology are assumed to be uniform through all regions. For the new vintages, the conversion efficiency increases while the investment costs reduce over the future time horizons. Techno-economic parameters of new power plants and projected fuel prices are given in

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Table D.3, Table D.4, and Table D.5. For inter-regional transmission of electricity, the costs of to the 500kV HVDC technology, given in (ABB, 2009), are used. Scenarios are described in Table 3.

The IPCC Working Group one proposed an early action scenario for 550 ppmv concentration level (IPCC, 2000; Manne and Richels, 1997). This is used here to limit the total CO<sub>2</sub> emissions from the power sector in scenarios with the postfix of “-CO2H”. In a more stringent scenario, represented with a postfix of “-CO2L”, CO<sub>2</sub> emissions limits are tightened according to the first category of stabilization scenarios in IPCC fourth Assessment Report (Nakicenovic, 2007; IPCC, 2007). The CO<sub>2</sub> emissions path is set to the minimum path, proposed in (Nakicenovic, 2007), which leads to the stabilization of CO<sub>2</sub> only concentrations at the level of 350 ppmv by 2100. The contribution share of the power sector in total abatement is estimated from the historical data (Wheeler and Ummel, 2008; Manne and Richels, 1997). The implemented CO<sub>2</sub> limits are represented in Table 4.

**Table 3:** Scenarios and underlying assumptions

Scenario	Underlying assumptions
GOPT-CO2L	- CO <sub>2</sub> -limit is based on 350 ppmv concentration level. - Inter-regional power transmission capacities are optimized.
GOPT-CO2H	- CO <sub>2</sub> -limit is based on 550 ppmv concentration level. - Inter-regional power transmission capacities are optimized.
NoGE-CO2L	- CO <sub>2</sub> -limit is based on 350 ppmv concentration level. - Inter-regional power transmission capacities are fixed as today.
NoGE-CO2H	- CO <sub>2</sub> -limit is based on 550 ppmv concentration level. - Inter-regional power transmission capacities are fixed as today.



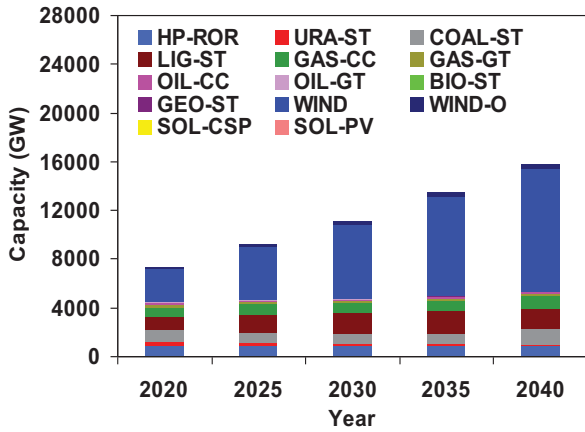
GOPT-CO2L-NoBio	<ul style="list-style-type: none"> <li>- CO<sub>2</sub>-limit is based on 350 ppmv concentration level.</li> <li>- Inter-regional power transmission capacities are optimized.</li> <li>- Extension of biomass beyond today is not allowed.</li> </ul>
NoGE-CO2L-NoBio	<ul style="list-style-type: none"> <li>- CO<sub>2</sub>-limit is based on 350 ppmv concentration level.</li> <li>- Inter-regional power transmission capacities are fixed as today.</li> <li>- Extension of biomass beyond today is not allowed.</li> </ul>
GOPT-CO2L-NoBio-SOL	<ul style="list-style-type: none"> <li>- CO<sub>2</sub>-limit is based on 350 ppmv concentration level.</li> <li>- Inter-regional power transmission capacities are optimized.</li> <li>- Extension of biomass beyond today is not allowed.</li> <li>- Costs of solar power plants are reduced by 50%.</li> </ul>
NoGE-CO2L-NoBio-SOL	<ul style="list-style-type: none"> <li>- CO<sub>2</sub>-limit is based on 350 ppmv concentration level.</li> <li>- Inter-regional power transmission capacities are fixed as today.</li> <li>- Extension of biomass beyond today is not allowed.</li> <li>- Costs of solar power plants are reduced by 50%.</li> </ul>

**Table 4:** Implemented CO<sub>2</sub> Limits in million metric tons

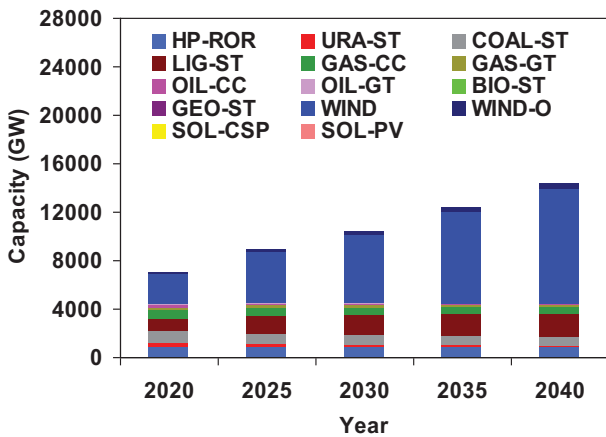
Scenario	Year 2020	Year 2025	Year 2030	Year 2035	Year 2040
CO2H	10059	10335	10611	10777	10943
CO2L	6107	4698	3758	2819	2067

The optimal power generation capacity mix, summed over all regions, obtained from the first four scenarios is illustrated in Fig. 17. In scenario “GOPT-CO2H”, the total wind power capacity is 2637 GW in 2020 and rises to 9933 GW by 2040. The average wind power capacity factor is 27%, and its penetration share reaches to 55% of the global electricity demand by 2040. In the more stringent scenario, named “GOPT-CO2L”, the installed capacity for wind power production rises from 4913 to 15729 GW through the time horizon. Implementing a tighter CO<sub>2</sub>-limit, the coal-fired capacity is reduced while the capacity of gas-fired plants is higher as compared to the “GOPT-CO2H”

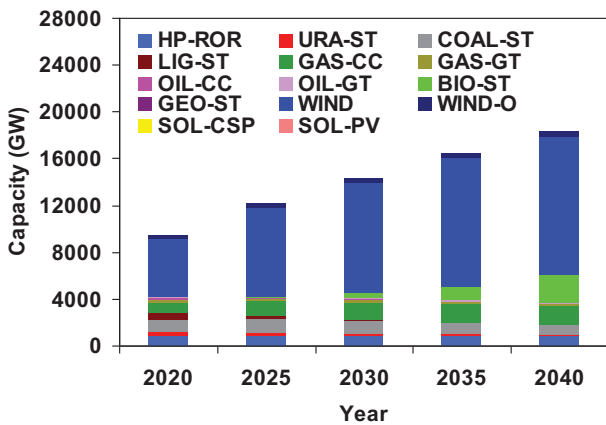
scenario. With the assumed costs and conversion efficiency, solar power plants are not selected for large-scale penetration.



(a)



(b)



(c)

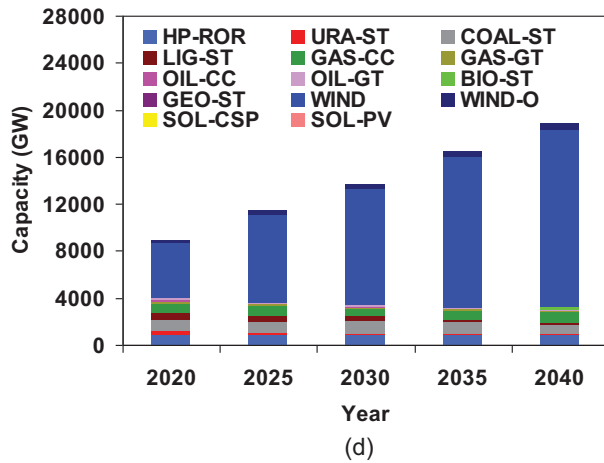


Fig.17: Global power generation capacity mix over the time horizon 2020-2040 (a) Scenario “NoGE-CO2H”; (b) Scenario “GOPT-CO2H”; (c) Scenario “NoGE-CO2L”; (d) Scenario “GOPT-CO2L”

Furthermore, it is concluded that if the extension of biomass is restricted in scenario “NoGE-CO2L-NoBio”, total installed capacity for solar electricity generation significantly increases in the final period; it rises from 3 GW in 2035 to 379 GW by 2040 (see Fig. 18).

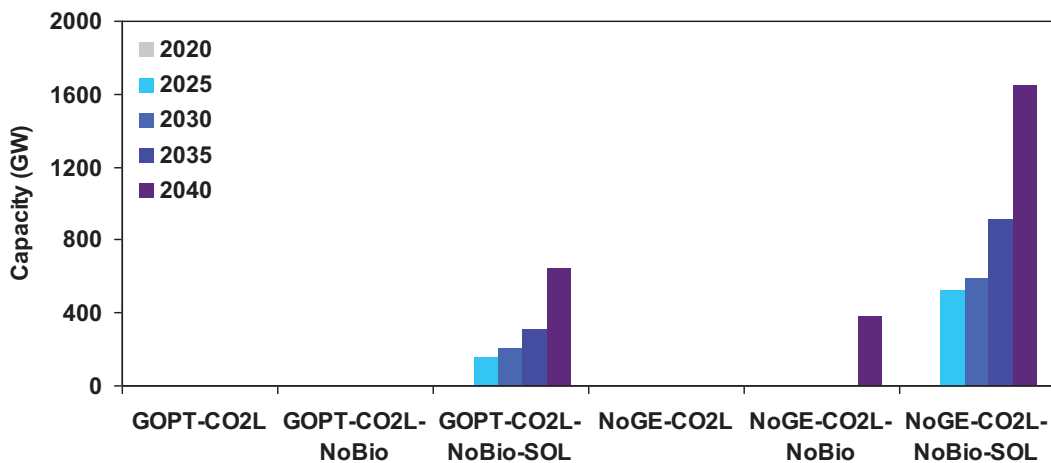
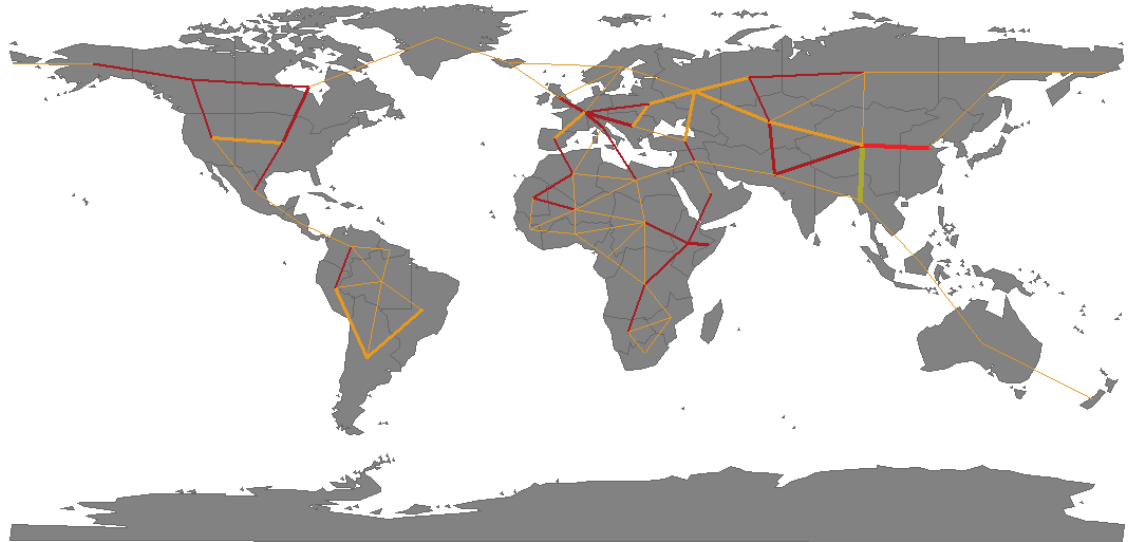


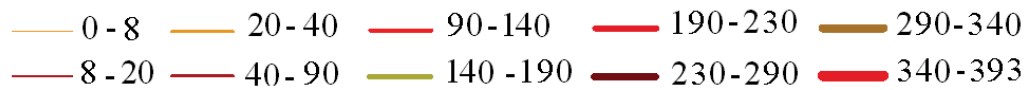
Fig.18: Total capacity of SOL-PV and SOL-CSP over the time horizon 2020-2040

An ideal globally-interconnected structure allows making an optimal usage of spatial de-correlations of wind power production and increases the capacity credit of wind power. An optimal structure of the global power transmission grid is shown in Fig. 19. Inter-regional power transmission lines with a maximum capacity of 157 GW and 392 GW are installed in scenarios “GOPT-CO2H” and

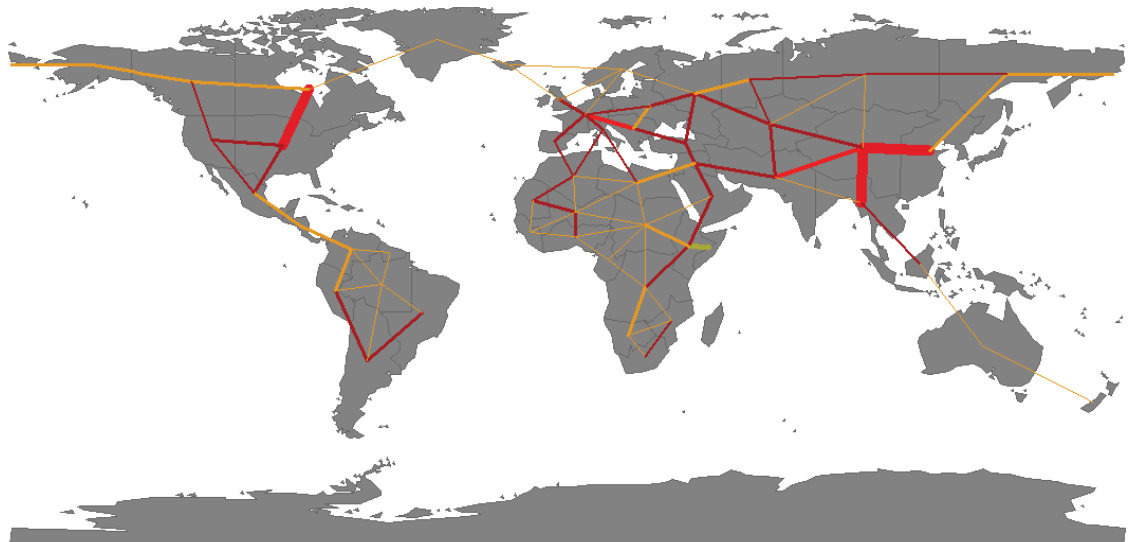
“GOPT-CO2L”, respectively to transmit wind electricity from regions, having a highly concentrated potential, to the distant consuming regions.



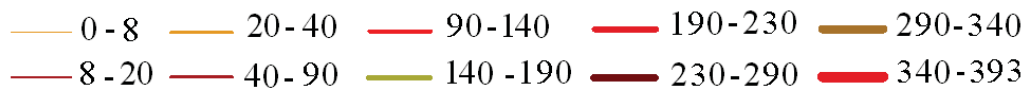
**Capacity (GW)**



(a)



**Capacity (GW)**



(b)

**Fig.19:** Optimal power transmission grid structure in year 2040 (a) Scenario “GOPT-CO2H”; (b) Scenario “GOPT-CO2L”

The influence of a global grid can be realized by comparing “NoGE-” scenarios with “GOPT-” scenarios. Fig. 17 clarifies the overinstallation of power generation capacities, occurring in scenarios “NoGE-CO2L” and “NoGE-CO2H”; higher capacities for gas-fired generation, biomass and wind power production are required to achieve the same level of abatement as it is achieved in scenarios “GOPT-CO2L” and “GOPT-CO2H”, respectively.

In scenario “GOPT-CO2H”, the CO<sub>2</sub>-price does not significantly increase through the considered time horizon and remains near 17 €/ton (see Fig. 20). However, in scenario “NoGE-CO2H”, it rises to 33 €/ton by 2040. This effect becomes even more evident when tightening the CO<sub>2</sub>-limit while the utilization of biomass is restricted. For instance, in scenario “NoGE-CO2L-NoBio-SOL”, the CO<sub>2</sub>-price significantly rises to 167 €/ton by 2040.

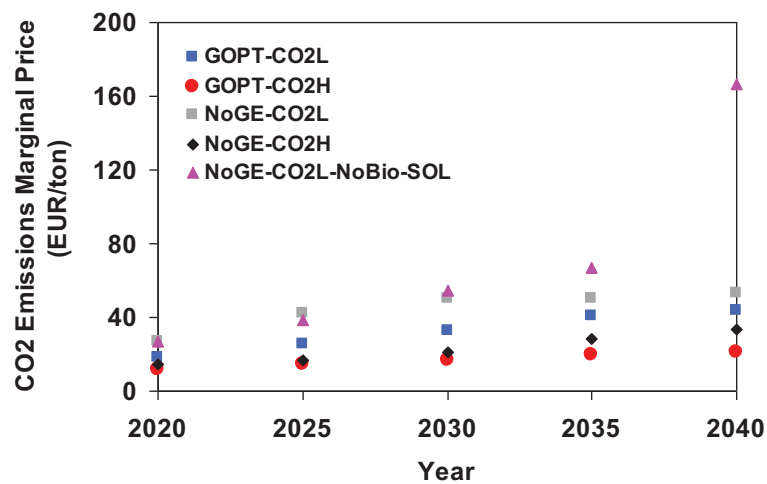


Fig.20: Development of CO<sub>2</sub>-certificate price over the time horizon 2020-2040

## 5 Conclusions and Outlook

In this paper, a multi-regional electricity system investment planning model has been applied to study complex interactions of different factors, influencing CO<sub>2</sub> emissions of the global electricity generation system.

1 At first, the global model was examined versus a real power production mix to  
2 validate its appropriateness for modeling electricity generation systems. Mainly  
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4 by adjusting the availabilities of coal- and lignite- fired plants, simulation results  
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6 correspond to the actual generation. The calibrated model was then applied to  
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8 quantify the potential for reducing emissions in response to a global carbon  
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10 price with an existing fleet of generation plants, i.e. by means of fuel switching.  
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12 It has been concluded that the total emissions would be reduced by 5% (several  
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14 hundreds of million tons) if a CO<sub>2</sub>-price of 18 €/ton existed in all countries  
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16 through the year 2006.  
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22 Through sensitivity study, it was shown that the achievable abatement in  
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24 response to a CO<sub>2</sub>-price is significantly influenced by the structure of the  
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26 electricity system as well as load and fuel price relationships. It is concluded  
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28 that a complex relationship exists between the abatement and the influencing  
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30 factors such as CO<sub>2</sub>-price, fuel prices, and electricity load. Indeed, all these  
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32 factors must lie within a specific range at the same time that fuel switching can  
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40 When a time horizon from 2020 to 2040 is taken into account, optimization  
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42 results show that wind energy is extensively employed to meet ambitious  
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44 emissions reduction targets. It was demonstrated that an ideal global grid has a  
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46 great influence to mitigate negative consequences caused by the integration of  
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48 FRES due to their short-term variability and seasonal dependencies.  
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52 It is worth mentioning that in the applied optimization model, technical  
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54 restrictions of power plants are respected at a technology level rather than on a  
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56 power plant basis as in a unit commitment problem. Thus, required investments  
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58 in flexible generation plants and the marginal price of CO<sub>2</sub> emissions are  
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1 underpredicted while the share of FRES that can feasibly be integrated into the  
2 power system is overestimated. However, regarding the scale of the problem,  
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4 addressed here, these influences are very low in proportional terms.  
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7 Furthermore, the main considered policy instrument in this analysis is the  
8 implemented certificate price or the CO<sub>2</sub> emissions limit. The subsidies aspects  
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10 in the energy sector are not explicitly included in this paper. However, the  
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12 influence of financial incentives for further application of renewable energies in  
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14 different world regions as well as the influence of financial constraints in  
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16 developing countries must be investigated in detail.  
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22 Finally, the focus of this paper has been laid on the influences of power system  
23 integration of FRES while international electricity exchange is taken into  
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25 account as a main solution option to relieve the problem of intermittency of the  
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27 primary energy source. However, the influence of different energy storage  
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29 technologies to provide the required balancing needs for large-scale integration  
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31 of solar energy must be studied in further investigations.  
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# Appendix

## A. Model Geographical Structure

The global, multi-regional electricity system optimization model, developed and applied in this study, comprises 50 regions. Model regions are described in Table A.1.

**Table A.1:** Description of model regions

Model region	Region name	Comprising countries (ISO 2-digit)
R1	SAM-S	AR, CL, UY, BO, PY
R2	BR-E	BR-East & South
R3	BR-W	BR-North & West
R4	SAM-N1	PE, EC
R5	SAM-N2	CO, VE, AG, AN, AW, BB, DM, DG, GP, KN, LC, MQ, MS, TT, VC, GD, VG
R6	SAM-N3	GF, GY, SR
R7	CAM	GT, BZ, SV, HN, NI, CR, PA, BS, CU, DO, HT, JM, PR, VI, KY, TC
R8	MEX	MX
R9	USA-W	US-West
R10	USA-E	US-East
R11	AK	Alaska
R12	CAN-W	CA-West
R13	CAN-E	CA-East
R14	GL	GL
R15	NAF-NE	EG, LY
R16	NAF-NW	DZ, MA, TN
R17	AF-NM	SD, TD, CF
R18	AF-W1	ML, NE
R19	AF-W2	EH, CV, MR
R20	AF-W3	BJ, BF, CI, GH, NG, TG
R21	AF-W4	LR, SL, GN, GW, SN, GM

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R22	AF-M	CM, GQ, GA, CG, ST
R23	AF-S1	CD, TZ, UG, RW, BI, ZM, AO
R24	AF-E1	ER, ET, DJ, KE
R25	AF-E2	SO
R26	AF-S2	MW, MZ, ZW, KM, YT, MG
R27	AF-S3	NA, BW
R28	ZA	ZA,LS, SZ
R29	AS-W1	AM, GE, AZ, TR
R30	AS-W2	SY, IQ, IL, LB, JO, KW, CY, PS
R31	AS-W3	SA, AE, YE, OM, QA, BH
R32	CAS	KG, KZ, TJ, TM, UZ
R33	AS-S	IN, LK, MV, AF, PK, IR
R34	AS-E1	MN, CN-West
R35	AS-E2	CN-East, JP,KP, KR, HK, TW
R36	AS-SE1	MM, KH, LA, TH, VN, BO, BT, NP
R37	AS-SE2	BN, TL, ID, MY, PH, SG, PG
R38	RU-W	Russia-West
R39	RU-M	Russia-Central
R40	RU-E	Russia-East
R41	RU-FE	Russia-Far East
R42	AUS	Australia
R43	NZ	New Zealand
R44	EU-1	EE, LV, LT, BY, UA, MD, PL,CZ
R45	EU-2	SK, AT, HU, SI, HR, RS, BG, BA, ME, MK, AL, GR, RO
R46	EU-3	DE, NL, BE, LU, FR, DK
R47	EU-4	CH, LI, MC, SM, IT, MT
R48	EU-5	AD, ES, PT, GI
R49	EU-6	NO, SE, FI
R50	EU-7	IE, GB, IS

## B. Main Symbols

The main symbols used in the model formulation are defined in Table B.1.

**Table B.1:** Definition of main symbols

Symbol	Description	Type	Unit
I	Index of technologies	Indice	[-]
PrPG	Power generation technology	Indice	[-]
PrSto	Energy storage Technology	Indice	[-]
PrTr	Energy transport technology	Indice	[-]
T	Index of time steps	Indice	[h]
X	Index of model regions	Indice	[-]
Y	Index of model regions	Indice	[-]
AVF	Availability factor	Parameter	[-]
C0	Previously installed capacity	Parameter	[MW <sub>el</sub> ]
co2Up	CO <sub>2</sub> emissions upper limit	Parameter	[ton]
cUp	Capacity upper limit of power plant technology	Parameter	[MW <sub>el</sub> ]
cUpTr	Capacity upper limit of transport interconnection	Parameter	[MW <sub>el</sub> ]
Dem	Hourly electricity load	Parameter	[MW <sub>el</sub> ]
k <sup>Fix</sup>	Specific fixed O&M costs	Parameter	[\$/(MW <sub>el</sub> .a)]
k <sup>Inv</sup>	Specific annual investment costs	Parameter	[\$/MWh <sub>el</sub> ]
k <sup>Var</sup>	Specific variable O&M costs	Parameter	[\$/MWh <sub>th</sub> ]
kCO2e	CO <sub>2</sub> -certificate price	Parameter	[\$/ton]
kemf	Emission factor of power plant	Parameter	[ton/MWh <sub>th</sub> ]
r(x,y)	Distance between regions x and y	Parameter	[km]
ramp	Ramp rate of committed or non-committed capacity	Parameter	[% of maximum capacity/h]
Supim	Wind power capacity factor; Hydropower capacity factor; Solar irradiation	Parameter	[-]; [-]; [W/m <sup>2</sup> ]
Trl	Transport losses	Parameter	[% of transported energy /km]

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W	Weighting factor of simulated time steps	Parameter	[-]
H	Conversion Efficiency	Parameter	[-]
C	Total generation capacity	Variable	[MW <sub>el</sub> ]
CN	Newly installed generation capacity	Variable	[MW <sub>el</sub> ]
CNSt	Newly installed storage reservoir capacity	Variable	[MWh <sub>el</sub> ]
CNStin	Newly installed storage input capacity	Variable	[MW <sub>el</sub> ]
CNStout	Newly installed storage output capacity	Variable	[MW <sub>el</sub> ]
CNTr	Newly installed transport capacity	Variable	[MW <sub>el</sub> ]
CSt	Total storage reservoir capacity	Variable	[MWh <sub>el</sub> ]
CStin	Total storage input capacity	Variable	[MW <sub>el</sub> ]
CStout	Total storage output capacity	Variable	[MW <sub>el</sub> ]
CTr	Total transport capacity	Variable	[MW <sub>el</sub> ]
E <sup>in</sup>	Hourly input energy (inflow)	Variable	[MW <sub>th</sub> ]
E <sup>out</sup>	Hourly output energy (outflow)	Variable	[MW <sub>el</sub> ]
ES <sub>T</sub> Tot	Total stored energy	Variable	[MWh <sub>el</sub> ]
ES <sub>T</sub> <sup>in</sup>	Hourly input energy (inflow) to storage system	Variable	[MW <sub>el</sub> ]
ES <sub>T</sub> <sup>out</sup>	Hourly output energy (outflow) from storage system	Variable	[MW <sub>el</sub> ]
ET <sub>r</sub> <sup>in</sup>	Hourly input energy (inflow) to transport interconnection	Variable	[MW <sub>el</sub> ]
ET <sub>r</sub> <sup>out</sup>	Hourly output energy (outflow) from transport interconnection	Variable	[MW <sub>el</sub> ]
z	Total system investment, fixed, and operation costs (objective function)	Variable	[\$]

## C. Model Calibration

Assumed techno-economic parameters used in the model validation are represented in Table C.1. These are based on data from (Hoogwijk, 2004; Han and Ward, 2007; Roth and Kuhn, 2008; EEA, 2009; IEA, 2010; IEA, 2002; WADE, 2005; IEA and NEA, 2005; IEA, 2006).

**Table C.1:** Techno-economic parameters of power plants

Technology	Efficiency (%)	Fuel price (\$/MWh <sub>th</sub> )	Variable O&M (\$/kWh <sub>el</sub> )	Availability (% of maximum capacity)	Emission factor (ton/MWh <sub>th</sub> )
BIO-ST	35	11.4	0.0058	50	0
COAL-ST	38-40	6.6	0.0058	84	0.440
GAS-GT	38	14.9	0.0030	95	0.308
GAS-CC	52	14.9	0.0030	90	0.308
GEO-ST	20	0	0.0058	70	0
HP-ROR	80	0	0.0001	95	0
HP-PS	80	0	0.0001	95	0
LIG-ST	36-38	3.3	0.0058	85	0.520
OIL-CC	46	18.5	0.0030	90	0.473
OIL-GT	30	18.5	0.0028	95	0.473
SOL-CSP	15	0	0	99	0
SOL-PV	12	0	0	99	0
URA-ST	34	1.9	0.0008	70-85	0
WIND	96	0	0	95	0
WIND-O	93	0	0	90	0

## D. Techno-economic parameters of power plants

Techno-economic parameters of power plants used in section 4.2 are determined based on data from (Han and Ward, 2007; IEA, 2010; IfE 2010; IEA, 2007; Roth and Kuhn 2008; VGB POWER TECH, 2008); these parameters are represented in Table D.1 and Table D.2.

**Table D.1:** Economical parameters of power plants (All costs are in EUR (2005))

Technology	Lifetime (a)	Investment (€/kW <sub>el</sub> )	Fixed O&M (€/kW <sub>el</sub> /a)	Variable O&M (€/kWh <sub>el</sub> )	Fuel price (€/MWh <sub>th</sub> )	Emission factor (ton/MWh <sub>th</sub> )
BIO-ST	25	2176	50	0.0105	15	0
COAL-ST	40	1014	24	0.0037	7	0.335
GAS-GT	30	350	7	0.0019	21	0.202
GAS-CC	30	400	18	0.0018	21	0.202
GEO-ST	25	2570	100	0.0001	0	0
HP-ROR	80	1700	10	0.0001	0	0
HP-PS	80	950	18	0.001	0	0
LIG-ST	40	1161	30	0.0037	4	0.396
OIL-CC	25	400	18	0.0018	32	0.310
OIL-GT	25	360	12	0.008	32	0.310
SOL-CSP	25	2283	23	0	0	0
SOL-PV	25	3424	21	0	0	0
URA-ST	60	1450	47	0.0005	3	0
WIND	25	844	20	0	0	0
WIND-O	25	1439	40	0	0	0

**Table D.2:** Technical parameters of power plants

<b>Technology</b>	<b>Efficiency (%)</b>	<b>Ramp (% of max. capacity / hour)</b>	<b>Availability (% of max. capacity)</b>
BIO-ST	38	25	50*
COAL-ST	40	22	84
GAS-GT	35	100	95
GAS-CC	52	35	90
GEO-ST	20	25	70
HP-ROR	80	-	95
HP-PS	86	-	95
LIG-ST	36	14	85
OIL-CC	46	35	90
OIL-GT	30	100	95
SOL-CSP	25	-	99
SOL-PV	20	-	99
URA-ST	34	8	70-85
WIND	100	-	95
WIND-O	100	-	90

Notes:

\*This low availability results from limited fuel availability

Development of the techno-economic parameters of power plants over the time horizon 2020-2040, which are used in section 4.3, are determined based on data from (Han and Ward, 2007; IfE 2010); these parameters are represented in Table D.3, Table D.4, and Table D.5.

**Table D.3:** Investment costs of new power plants (All costs are in EUR (2005))



<b>Technology</b>	<b>Investment 2020 (€/kW<sub>el</sub>)</b>	<b>Investment 2025 (€/kW<sub>el</sub>)</b>	<b>Investment 2030 (€/kW<sub>el</sub>)</b>	<b>Investment 2035 (€/kW<sub>el</sub>)</b>	<b>Investment 2040 (€/kW<sub>el</sub>)</b>
BIO-ST	2183	1921	1690	1486	1307
COAL-ST	1241	1216	1191	1166	1141
GAS-GT	608	586	564	543	521
GAS-CC	695	670	645	620	595
GEO-ST	2580	2580	1921	1921	1921
LIG-ST	1421	1406	1392	1378	1364
OIL-CC	715	690	665	640	615
OIL-GT	625	604	582	560	538
SOL-CSP	2761	2522	2283	2066	1871
SOL-PV	4080	3529	2977	2779	2580
URA-ST	1489	1389	1290	1191	1092
WIND	844	827	811	794	777
WIND-O	1439	1422	1365	1327	1290

**Table D.4:** Efficiency of new power plants

<b>Technology</b>	<b>Efficiency 2020 (%)</b>	<b>Efficiency 2025 (%)</b>	<b>Efficiency 2030 (%)</b>	<b>Efficiency 2035 (%)</b>	<b>Efficiency 2040 (%)</b>
BIO-ST	38	39	40	41	42
COAL-ST	48	50	52	54	55
GAS-GT	41	42	43	44	45
GAS-CC	61	63	64	66	67
GEO-ST	10	20	20	20	20
LIG-ST	43	45	47	48	50
OIL-CC	54	55	57	58	59
OIL-GT	36	37	38	39	40

SOL-CSP	25	25	25	25	25
SOL-PV	20	20	20	20	20
URA-ST	34	34	34	34	34
WIND	100	100	100	100	100
WIND-O	100	100	100	100	100

**Table D.5:** Development of fuel prices (All costs are in EUR (2005))

Technology	2020 (€/MWh <sub>th</sub> )	2025 (€/MWh <sub>th</sub> )	2030 (€/MWh <sub>th</sub> )	2035 (€/MWh <sub>th</sub> )	2040 (€/MWh <sub>th</sub> )
Crude oil	49.80	53.92	58.05	60.11	60.11
Hard coal	10.29	10.62	10.89	11.11	11.11
Lignite	3.31	3.31	3.31	3.31	3.31
Natural gas	33.13	35.15	37.67	38.93	38.93
Uranium	3.08	3.08	3.08	3.08	3.08

## E. Abbreviations

### Abbreviations

AFR Africa

AM America

AUS Australia

BIO All types of bio-fuels (bagasse, biogas, sewage digester gas, syngas from gasified wood or biomass, and bio-liquid fuels) or any waste (landfill gas, syngas from gasified refuse, waste gas from refinery or other industrial processes, waste heat, paper mill waste or sludges, and municipal solid waste) are aggregated to Biomass ("BIO").

CARMA Carbon Monitoring for Action

CC Combined Cycle

CSP Concentrating Solar Power

el Electrical

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ENTSO-E	European Network of Transmission System Operators for Electricity
EU	Europe
Fix	Fixed cost
FRES	Fluctuating Renewable Energy Sources
GAMS	General Algebraic Modeling System
GGI	Greenhouse Gas Initiative
GHG	Greenhouse Gas
GIS	Geographic Information System
GT	Gas Turbine
HVDC	High Voltage Direct Current
Inv	Investment cost
LP	Linear Programming
NAM	North America
NTC	Net Transfer Capacity
O&M	Operation and Maintenance
PS	Pumped Storage
PV	Photovoltaic
R	Region
RMS	Root Mean Square
RUS	Russia
SAM	South America
SeaWiFS	Sea-viewing Wide Field-of-view Sensor
SRES	Special Report on Emission Scenarios
SSIDS	Surface Solar Irradiation Data Set
ST	Steam Turbine
th	Thermal
URA	Uranium

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Var	Variable Cost
WWA	World Wind Atlas