On the role of electric vehicles towards low-carbon energy systems: Italy and Germany in comparison

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ABSTRACT

Electric vehicles can play a major role in the transition towards low-carbon energy systems, but the related increase in electricity demand inevitably affects the strategic planning of the overall energy system as well as the definition of the optimal power generation mix. With this respect, the impact of electric vehicles may vary significantly depending on the composition of both total primary energy supply and electricity generation sector. In this study Italy and Germany are compared to highlight how a similarity in their renewable shares not necessarily leads to similar results in CO_2 emissions reduction. Different energy scenarios are simulated with the help of EnergyPLAN software assuming a progressive increase in renewable energy sources capacity and electric vehicles penetration. Results show that, for the German case, the additional electricity required leads to a reduction in CO_2 emissions only if renewable capacity increases significantly, whereas the Italian energy system benefits from transport electrification even at low renewable capacity. With a sixfold increase in renewables capacity and assuming a complete electrification of private transportation where EV charging strategy is regulated to enhance renewable integration, CO_2 emissions can be reduced by 22 % and 39 % for Italy and Germany respectively. However, this comes along with a remarkable renewable surplus, respectively equal to 15 % and 28 % of the total national production unless large-scale energy storage systems are deployed.

KEYWORDS

RES integration; electric vehicles; smart charging; EnergyPLAN; cross-country comparison; CO₂ emissions reduction.

NOMENCLATURE

The following abbreviations have been used in the manuscript:

RES iRES iRES2016 6xiRES EV	Renewable Energy Sources Intermittent Renewable Energy Sources Scenarios in which iRES installed capacity is equal to 2016 level Scenarios in which iRES installed capacity is increased sixfold 2016 level Electric Vehicles
BEV	Battery Electric Vehicles
PHEV	Plug-in Hybrid Electric Vehicles
RES surplus	Potential excess of electricity generation from renewable sources, evaluated with respect to the total national electricity generation
RES share	Electricity generation from RES, evaluated with respect to the total national electricity generation
iRES capacity growth factor TPES	The ratio between iRES capacity in a given scenario and iRES2016 Total Primary Energy Supply

PP	Power Plants (conventional back-up power stations)
СНР	Combined Heat and Power (cogeneration power plants)

1 INTRODUCTION

In response to the Paris Agreement on climate change [1] energy strategies in different countries have put their focus on electricity generation [2] and transportation [3], that at present rely on fossil fuels respectively for 73 % [4] and 96 % [5] of their total energy consumption at a global scale. In this context, national policies agree upon the strategic role of renewable energy sources (RES) and electric vehicles (EV) in curbing CO_2 emissions [6]. Indeed, both RES capacity and EV sales are forecasted to grow significantly in the coming years [7].

Transport sector electrification is expected to play a key role in the progressive decarbonisation of energy systems in several ways. First, electrical motors can function as substitutes of fossil-fuelled engines to avoid tailpipe emissions. Second, the coupling of transport and electricity sectors allows excess electricity from RES to be utilised to charge electric vehicles. In this regard, previous studies have mainly focused on the general sense of purpose of RES integration and relating EV diffusion and quantified the reduction in CO₂ emissions and RES surplus both at a national [6] or local scale [7], deduced techno-economic optimal future scenarios with different shares of EV and RES penetration [8] and designed mechanisms for the incentivisation of those [9].

Further, the aggregated battery capacity of EV is not only expected to provide negative balancing power in times of excess electricity, but also to provide positive balancing power in periods of high electricity demand and relatively low production through vehicle-to-grid strategies (V2G) [10]. Generally speaking, EV can worse or lessen peak load depending on the charging strategy [11]; having regard to drivers' behaviour and given sufficient quality and quantity of data exchange between the infrastructural components of EV charging infrastructure and electricity network operation, grid operators can charge and discharge batteries of parked EV according to system requirements. However, the uncertain nature of RES combined with the variability of driving patterns of EV require the charging process to be scheduled through a direct control approach and an optimisation problem needs to be solved when RES integration is to be maximised [12]. The better the EV charging processes are harmonized with systemic requirements through an intelligent scheduling, the less necessary is conventional electricity generation, the less electricity from RES needs to be curtailed or stored, less renewable power capacity is required and high renewable utilization targets can be met [13].

Although the mix of energy generation technologies obviously affects the benefits of EV penetration [14], energy system configuration, concerning the levels of RES integration and EV diffusion is mostly derived as an outcome variable. However, the benefits of electrification strongly depend on prior choices concerning the generation technology mix that underlies particular energy systems. In this context, this study aims to advance knowledge on the interaction between RES integration and transport sector electrification through the comparison of alternative energy system configurations and applies a bottom-up simulation approach that allows to assess the consequences of upfront modelled Smart Energy System design alternatives that, based on a holistic approach, favour possible synergies among sectors.

Positive interactions between a high penetration of PV and EV, using a smart strategy to foster the deployment of EV day charging to conveniently exploit the surplus of PV generation, have been demonstrated for the Portuguese energy system: at a given PV penetration, as EV share grows, CO₂ emission, along with excess of PV generation, is progressively reduced confirming the ability of EV to assist intermittent RES integration leading to an almost decarbonised energy system [15]. The impact of EV on the Croatian energy system analysed in [16] showed that the electrification of 50% of road transport could potentially reduce fuel consumption by 12.3% and CO₂ emissions by 14.6% as compared to 2011 level. Synergies between RES and EV for the Croatian energy system are also confirmed in [17]. Prina et al. [8] developed an optimization tool coupled with EnergyPLAN tool to select the best techno-economic transition pathway between 2015 baseline and a possible 2050 scenario, acting only on the electricity sector. Lund and Kempton [18] analysed the role of EV in integrating RES into the Danish energy system including also the effect of the charging strategy adopted providing a comparison between night charging and smart charging. The impact of EV, that are assumed to fully replace the conventional vehicle fleet, is evaluated for a range of wind power growing from 0 to approximately 100% of the electricity demand.

For the present study, the energy sytems of Italy and Germany were both chosen as starting point for further modelling because, on the one hand, they present features that are shared by several other

developed European countries with high renewable potential and large oil products consumption in the transportation sector, while, on the other hand, they significantly vary with regard to electricity supply mix. Specifically, Italy differs from Germany, and Nordic countries in general, in the availability of wind and solar energy, with this latter taking the lion's share among intermittent RES, as well as in the reliance on natural gas, rather than coal, for conventional electricity generation. Such differences become particularly important when electricity generation from RES is not available or not enough, depending on the installed capacity or the time of the year, and the additional electricity demand has to be provided by conventional power plants, thus limiting or nullifying the environmental benefits of EV especially when such plants are powered by carbon-intensive fuels [14] and making CO₂ savings potential greater where renewable contribution to the electricity mix is higher [19].

In this framework, the present work aims at extending the available literature focusing on key measures towards the achievement of sustainable and decarbonised energy systems with a particular attention to the decarbonisation of private transport sector. Starting from a base-case scenario for Italy and Germany in 2016, possible future projections with progressively increasing shares of RES and EV have been defined, analysed and compared with the help of EnergyPLAN software in order to evaluate the energy system response to an ever-growing renewable installed capacity and electrification of transport sector. Broadening the existing literature, this study provides detailed insights on how the characterisation of particular energy systems, in terms of different electricity generation mix, affects the effectiveness of EV to function as an electricity storage system under different charging strategies. This study deals with the issues related to modelling and forecasting future energy scenarios including also the environmental and economic impact of the rise of technologies (RES and EV) that are regarded as a key measure towards the decarbonisation of a particular energy system. Results are discussed in terms of crucial environmental and economic indicators such as CO₂ emissions, RES penetration, curtailments and system costs considering current political topics such as the nuclear and coal phase-out, ultimately providing possible recommendations and a variety of technical solutions that policy makers can rely on to define the optimal path towards a sustainable and effective national energy strategy.

2 METHODS

This section describes the main logic of EnergyPLAN tool and lists input values for the definition of a base case and future scenarios for Italy and Germany, along with the related sources that have been used.

EnergyPLAN is an energy modelling tool that performs energy balances of a given energy system by simulating its operation throughout the year on an hourly basis [20].

To perform an energy balance for a given country, a variety of input parameters are required. From demand side, they are represented by annual electricity, heating and cooling demand along with their hourly power distributions as well as yearly direct fuel consumption for transport, industry, residential and commercial sectors.

From supply side, power plants capacities, efficiencies and fuel shares for power generation must be provided, as well as hourly distributions of RES generation. Conventional power plants are classified as CHP (Combined Heat and Power) and PP (Power Plants) units. Heat supply is modelled through boilers for individual heating and CHP units for district heating and industrial processes.

Hourly distributions, which are required, as mentioned above, for energy demands and non-dispatchable RES generation supply, must be expressed as the ratio between the hourly-averaged power required at a particular hour and the yearly maximum value.

Details on all these input data are given in the following paragraphs.

2.1 Base case scenario definition

A base case scenario has been defined for both countries, represented respectively by the Italian and German energy systems in 2016, modelled in terms of their energy supply and demand with reference to the most updated data from reliable sources (electric grid operators, International Energy Agency and EU-funded research projects). Input data for base case scenarios, resulting from the analysis presented in the followings, are available at an online open access repository [21].

2.1.1 Demand

From demand side, the Italian and German energy system have been described in terms of electricity, heating and cooling loads as well as direct fuel consumption for transport and industry sectors.

2.1.1.1 Electricity

Table 1 shows gross electricity loads for both countries in 2016, along with the sources where these data were taken from. The software allows electricity for heating, cooling and transportation to be set directly by the user: as a result, the remaining non-mentioned electrical loads are implicitly contained in the overall electricity demand (which also includes energy for auxiliary systems and losses). Annual net import/export electricity has been also inserted as an input parameter.

An hourly distribution must be associated with yearly electricity load and net import/export to ultimately let the software work out power plants generation on an hourly basis, thus performing the energy balance between electricity demand and supply throughout the year.

Hourly power distributions used to characterise electricity demand and import/export are shown in Figures A.1 and A.2 in the Appendix of this paper for the Italian and German case respectively.

	Consumption (TWh/year)		So	urce
	Italy	Germany	Italy	Germany
Total national electricity demand	326.80	598.59	[22]	[23]
of which:				
Electricity for cooling	6.42	0.96	[24–26]	[25,27]
Electricity for heating (electric boilers)	8.37	43.04	[28]	[27]
Electricity for heating (heat pumps)	18.63	5.82	[29]	[30,31]
Electricity for transport	11.16	11.73	[24]	[32]
Import	43.18	28.34	[22]	[23]
Export	-6.15	-78.86	[22]	[23]
Net Import/Export	37.03	-50.52		

Table 1. Electricity loads in 2016

2.1.1.2 Heating and cooling

Fuel consumption for space heating and sanitary hot water for residential and commercial sectors is shown in Table 2 along with the average boiler efficiency; such parameters define what EnergyPLAN refers to as "individual heating".

Table 2.	Fuel consumption	and efficiencies f	or individual	heating in 2016
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	Consumption (T	Wh/year)	Efficier	юу
	Italy (Source:[24,26])	Germany (Source:[32])	Italy (Source:[33])	Germany (Source[33])
Coal boiler	-	6.36	-	-
Oil boiler	29.19	214.61	0.90	0.90
Natural gas boiler	262.73	377.10	0.92	0.92
Solar thermal	1.73	8.74	0.90	0.90
Biomass boiler	79.44	95.04	0.85	0.85

With particular reference to the Italian case, a study carried out by "Gestore dei Servizi Energetici" (GSE), the company identified by the State to pursue and achieve environmental sustainability, provides a breakdown of residential and services overall energy consumption among end uses (as in space heating, space cooling, sanitary hot water, cooking etc.) and energy sources in 2015 [26]. From such

subdivision, the consumption allocated specifically to space heating has been derived as a percentage of the total for each of the energy sources involved and the values have been rescaled to 2016.

As concerns the German case, in the absence of a detailed breakdown among end uses for residential and commercial sectors, the overall energy consumption has been entirely allocated to individual heating with the exception of electricity consumption, whose usage for heating and cooling purposes has been estimated from two external sources: the German energy models available at Heat Roadmap Europe database, a EU-funded project for the development of a low carbon and cooling strategy for 14 EU countries [27] and from the latest report concerning the development of Renewable Energy Sources in Germany provided by Federal Ministry for Economic Affairs and Energy [30].

The overall thermal demand for individual heating can thus be evaluated, and it is equal to 394.23 and 643.46 TWh for Italy and Germany respectively. Heat pumps and electric boilers, whose electricity consumption has been previously set in Table 1, provide together for a thermal demand of 57.37 TWh for the Italian case and 60.29 TWh for the German case. The value used for Seasonal Performance Factor (SPF, indicating the seasonally-averaged COP over the heating season) is based on actual measurement and reliable available data for both countries, resulting in 2.63 and 2.95 for Italy [29] and Germany [30,31] respectively.

Once the annual fuel consumption is provided, annual CO₂ emissions related to individual heating can also be derived using fuel emission factors as reported in the following of this section.

As shown in Table 1, electricity consumption for cooling is respectively equal to 0.96 and 6.42 TWh for Germany and Italy; assuming a Seasonal Energy Efficiency Ratio (SEER, a commonly used measure of the average efficiency of cooling equipment that takes into account changes in operating conditions throughout the cooling season) of 5.5 for both countries [25] space cooling demand is equal to 5.27 and 35.33 TWh for the German and the Italian case.

Hourly distributions of individual heating and cooling demand are also required and used by the software to simulate on an hourly basis electricity generation needed to fulfil demand for heat pumps and electric boilers. Individual heating demand distribution takes also into account demand for sanitary hot water. Such distributions are shown in Figures A.3 and A.4 in the Appendix of this paper for Italy and Germany respectively.

With respect to Italy, heating distribution has been derived considering the overall national gas consumption considering that almost 70% of individual heating demand is fulfilled through natural gas. Its hourly distribution is provided by SNAM, the national society for natural gas transportation and storage, for the year 2016 [34]. Gas consumption for heating purposes only has been determined by subtracting industry, power plants and transportation usage.

As concerns the German case, heating and cooling distributions have been taken from Heat Roadmap Europe database [27]. Since the latest available models refer to the year 2015, it has been assumed that heating and cooling demand distributions stay the same in 2016.

District heating and heat demand for industrial processes have been also included, and values are listed in Table 3 for both countries.

	Italy (Source: [24])	Germany (Source:[32])
Energy industry own use	16.24	3.48
Residential and services	13.86	64.06
Industry	31.82	49.69
Total	61.92	117.23

Table 3. District heating and heat demand (TWh/year) at 2016

CHP and DH plants cater for such demand, as described in detail in the following (see section 2.1.2).

2.1.1.3 Industry and other fuel consumption

Fuel consumption in the industry and other sectors (agriculture, fishing, forestry, energy industry own use and various non-specified areas) have been included as well to account for CO₂ emissions also in these areas of the energy system. Data are shown in Table 4.

Besides fuel consumption, EnergyPLAN allows to insert fuel losses estimated as a percentage of the total fuel consumed at the end of the analysis. Such losses have been set to 1.04 % and 0.07 % for coal and oil in Germany [32] and equal to 0.5 % for natural gas in the Italian case [24].

	Indu	istry	Oth	ner
	Italy (Source:[24]])	Germany (Source: [32])	Italy (Source:[24]	Germany (Source: [32])
Coal	11.16	70.41	0.05	9.55
Oil	30.94	27.35	61.08	66.65
Natural gas	97.23	226.62	27.35	14.62
Biomass and waste	7.64	45.43	73.22	6.22

Table 4.	Industry a	and other	sector fuel	consumption	(TWh/year) at 2016
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2.1.1.4 Transport

With respect to the transport sector, energy demand has been modelled by including fuel and electricity consumption as listed in Table 5 for both countries. In the Italian case, fuel consumption projection for 2016 provided by "Istituto Superiore Per la Ricerca Ambientale" (ISPRA) [35] has been considered to derive how the overall consumption is distributed among fuels, and adjusted according to total energy consumption in the transport sector as provided by IEA for the same year [24]. As for Germany, transport-related energy consumption has been derived from data published by AGEB for the year 2016 [36].

Table 5. Transport sector fuel and electricity consumption (TWh/year) at 2016

	Italy (Source: [24,35])	Germany (Source: [36])
JP (Jet Fuel)	8.05	108.06
Diesel	262.63	423.94
of which biodiesel	11.72	29.94
Petrol	88.42	197.11
of which biopetrol	0.29	0
Natural gas	12.86	1.62
LPG	21.24	4.67
Electricity	11.16	11.74

Given the negligible share of EV in 2016, electricity consumption can be allocated to other means of transportation such as trains and electric trams. Moreover, since electricity demand for transportation is ultimately fulfilled by power plants, its distribution has to be included in the model. Figure A.5, reported in the Appendix of this paper, shows the distribution of transportation demand [27], the same for both countries; only seven days have been displayed to highlight the daily pattern over a week. It is worth recalling that this is battery demand, not electric system demand, as the vehicles are necessarily disconnected from the grid while driving. Thus, such distribution can be interpreted as the hourly battery discharging for 1 week and it is used by EnergyPLAN to work out, on an hourly basis, how many cars are driving and consequently not connected to the grid. The fraction of the EV fleet that is available to interact with the electrical system at any given hour can be estimated from the maximum share of cars that are driving during peak demand hour (V2G_{DrivingShare}) and from the percentage of those parked cars that are actually connected to the grid (V2G_{Connection-Share}). V2G_{DrivingShare} and V2G_{Connection-Share} have been respectively set to 0.2 and 0.7 according to [18].

2.1.2 Supply

Energy supply has been modelled including the current technology mix deployed to satisfy power and thermal loads and ultimately achieve an hourly energy balance throughout the year.

2.1.2.1 Heat and electricity: conventional power plants

While individual heating demand has been already discussed in section 2.1.1.2, CHP and DH plants have been modelled to cater for district heating requirements for both countries. Among CHP plants, EnergyPLAN allows to select large CHP plants able to operate, if required, in electricity mode only. Such capacity is thus included in conventional power plants overall capacity (PP). Capacities and efficiencies are shown in Table 6.

Power plants fuel consumption has to be also considered to properly assess the overall CO_2 emissions related to electricity generation. With this regard, the software allows to set how the overall power plant energy consumption is distributed among fuels. Table 7 shows data used for Italy and Germany.

Table 6. Conventional power and cogeneration plants: installed capacity and efficiency at 2016

	Italy (Source:[24,37])			Germ (Source:	nany [32,38])	
	Capacity (GW)	$\eta_{ m el}$	$\eta_{ ext{th}}$	Capacity (GW)	$\eta_{ m el}$	$\eta_{ ext{th}}$
PP	58.95	0.43	-	86.82	0.40	-
CHP	26.25	0.39	0.22	51.16	0.39	0.30

Table 7. Conventional power and cogeneration plants: fuel distribution (TWh/year) at 2016

	CH	IP	PP	
	Italy	Germany	Italy	Germany
	(Source:[24])	(Source:[32])	(Source:[24,37])	(Source:[32])
Coal	9.59	75.52	100.58	702.76
Oil	44.36	5.07	36.54	12.57
Natural gas	179.75	140.69	219.60	125.22
Biomass	39.02	98.07	62.50	66.27

District heating boilers are modelled to produce 35.83 TWh [32]and 1.14 TWh [24] of thermal energy for Germany and Italy respectively (with an overall efficiency equal to 0.77 and 0.71).

Finally, nuclear power plants have been included in the German energy scenario: the overall capacity has been set to 10.8 GW [38], with an electric efficiency of 0.33 [32].

2.1.2.2 Renewable electricity generation

Besides conventional power plants, electricity provided by renewable energy sources has to be modelled to completely define the technology mix to cater for national electricity demand. Their installed capacities are listed in Table 8.

RES hourly distribution is shown in Figures A.6 and A.7, in the Appendix section, for the Italian and German case respectively along with the related sources ([39,40]).

Table 8.	Renewable	energy installed	capacity (GW) at 2016
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Technology	Italy (Source: [37])	Germany (Source: [38])	
Onshore wind	9.41	45.28	
Offshore wind	-	4.15	
Photovoltaic	19.28	40.68	
River Hydro	5.43	3.95	
Dammed Hydro	18.72	1.54	
Geothermal	0.82	0.04	

2.1.3 Model validation

Base case scenarios have been validated comparing critical indicators against actual data at 2016 as displayed in Table 9. Variation with respect to actual data is within 2.3 %. Primary energy supply related to non-energy uses has been subtracted from the actual value as they are not included in the energy system model; RES electricity production does not include biomass, which is instead included in PP production and RES penetration is expressed as a percentage of total national electricity production.

Country	Indicator	Model	Actual	Source	Difference
	CO ₂ emissions [Mt]	324.9	325.7	[54]	-0.24%
	TPES [Mtoe]	147.8	144.7	[38,54]	2.17%
tal)	RES electricity (excl. biomass) [TWh]	90.3	90.3	[50]	-0.01%
-	PP electricity [TWh]	93.7	93.6	[50]	0.15%
	CHP electricity [TWh]	105.9	105.1	[50]	0.69%
	CO ₂ emissions [Mt]	723.1	731.6	[54]	-1.16%
Iny	TPES [Mtoe]	295.2	288.6	[38,54]	2.27%
rma	RES electricity (excl. biomass) [TWh]	137.5	137.4	[55]	0.12%
Gel	PP electricity [TWh]	301.5	296.0	[38]	1.87%
	CHP electricity [TWh]	125.5	125.5	[38]	0.00%

Table 9. Model validation.

2.2 Future scenarios modelling

Future scenarios have been modelled in EnergyPLAN assuming progressively growing shares of RES, taking into account potential limits for renewable sources, and EV, up to an entire replacement of conventional vehicle fleet.

2.2.1 Electricity generation

As concerns electricity generation, renewable installed capacities for intermittent sources (iRES), as in wind and solar, have been linearly increased for the German case up to the maximum value derived according to 2050 energy policy target which leads to an overall growth equal to approximately 6 times the corresponding 2016 total iRES installed capacity (6xiRES). With this respect, to provide an effective comparison among energy systems, the same sixfold increase in iRES capacity has been kept for the Italian case and divided among sources taking into account an upper limit for wind, conservatively set at 17.15 GW according to National Wind Energy Association (ANEV) projections at 2030 [41]. Values are displayed for each source in Table 10.

	Italy	/	Gern	nany
Technology	iRES2016	6×iRES	iRES2016	6×iRES
	(Source:[37])		(Source:[38])	(Source:[42])
Onshore wind	9.41	16.00	45.28	198.00
Offshore wind	-	1.15	4.15	54.00
PV	19.28	150.66	40.68	275.00
Total	28.69	167.81	90.11	527.00

Table 10.	iRES capacity values	(GW)	
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Assumptions have been also made with respect to fossil fuel consumption for electricity production and conventional power plants. The option of coal phase-out has been implemented for both countries, leading to a reduction in power capacity of 8.20 GW for the Italian case [43] and 42.48 GW (28.89 GW for CHP and 13.59 GW for PP) for Germany [38]. Additionally, a nuclear phase-out has been implemented for the German case, which translates in the decommissioning of 10.8 GW of nuclear capacity.

Finally, with respect to import/export management for the Italian case, RES surplus has been considered to be able to replace, at any given hours of each day of the year, electricity import when they both happen to occur simultaneously.

2.2.2 Private transport

Future scenarios for transportation sector have been derived assuming a linear decrease in petrol and diesel cars combined with a simultaneous progressive replacement by EV up to a complete substitution of the conventional vehicle fleet, keeping the total number of vehicles stable at 2016 level, a reasonable assumption according to future projection for the Italian case [43] and resulting, for the German case, from a combination of an increase in new mobility services, future urban development policies based on needs-oriented remodelling of the street environment [44], population and GDP growth rate.

The impact of private transport only within the whole transportation sector needs to been estimated in terms of fuel consumption; conventional and electric vehicles were divided into different categories according to their market segment (as in small, medium and large) based on vehicles registrations over the last ten years for the Italian case [45] and using recent data on German road vehicles fuel consumption disaggregated by segment [46].

Average fuel economy for conventional cars has been derived from manufacturers' data and adjusted in each category to meet the more realistic overall higher value reported in Unione Petrolifera technical report [43].

For the Italian case, the annual driving distance was set to 7280 and 13650 km/year respectively for petrol and diesel cars [43]. With respect to the German case, annual distance covered by petrol and diesel vehicles has been set to 10260 and 18525 km/year, derived as a projection to 2016 from historical data for Germany reported in [47].

EV technical specifications were evaluated as a weighted average of the actual circulating fleet composition for both countries considering new registrations from 2015 onwards [45,48] including also electricity consumption for auxiliary systems and real driving conditions based on the latest EV models available data [49]. Petrol consumption was also taken into account for hybrid plug-in electric vehicles (PHEV) when exceeding the full-electric range. PHEV are also assumed to represent 30% of the EV medium and large size vehicle segment in future scenarios thus leading to an overall BEV/PHEV relative share in the total EV fleet in line with future projections [50]. Final electricity consumption for EV and PHEV was calculated considering a 90% charging efficiency. EV are assumed to cover an average distance between petrol and diesel, i.e. 10367and 13027 km/year for Italy and Germany respectively. An example, referring to a 50 % replacement of the conventional fleet, is shown in Tables 11–14.

	Size	Share	Initial vehicles (×10 ⁶)	Remaining vehicles (×10 ⁶)	Consumption (I/100 km)	Consumption (TWh/year)
	Small	0.86	13.75	6.87	6.19	27.90
<u>lo</u>	Medium	0.13	2.04	1.02	6.79	4.54
Pet	Large	0.01	0.12	0.06	9.38	0.37
	Total		15.91	7.95		32.81
	Small	0.35	5.27	2.63	4.79	16.87
sel	Medium	0.61	9.06	4.53	5.56	33.71
Die	Large	0.04	0.64	0.32	8.09	3.44
-	Total		14.96	7.48		54.02

Table 11. Conventional vehicles fuel consumption at 50 % replacement - Italy

Size	Share	Consumption (kWh/100km)	Vehicles (×10 ⁶)	Electricity consumption (TWh/year)	Battery storage (GWh)	PHEV fuel consumption (TWh/year)
Small	0.62	16.39	9.51	17.95	154.57	-
Medium	0.36	18.44	5.55	11.79	155.53	0.54
Large	0.02	22.11	0.38	0.96	26.01	0.08
Total			15.43	30.70	336.11	0.62

Table 12. EV electricity and PHEV fuel consumption at 50% replacement - Italy

Table 13. Conventional vehicles fuel consumption at 50 % replacement - Germany

	Size	Share	Initial vehicles (×10 ⁶)	Remaining vehicles (×10 ⁶)	Consumption (I/100 km)	Consumption (TWh/year)
	Small	0.32	9.59	4.80	6.19	27.44
<u>lo</u>	Medium	0.58	17.39	8.69	6.79	54.53
Pet	Large	0.10	3.00	1.50	9.38	13.00
	Total		29.97	14.99		94.97
	Small	0.09	1.36	0.68	4.79	5.90
sel	Medium	0.70	10.49	5.24	5.56	52.97
Die	Large	0.21	3.24	1.62	8.09	23.84
	Total		15.09	7.54		82.71

Table 14. EV electricity and PHEV fuel consumption at 50% replacement - Germany

Size	Share	Consumption (kWh/100km)	Vehicles (×10 ⁶)	Electricity consumption (TWh/year)	Battery storage (GWh)	PHEV fuel consumption (TWh/year)
Small	0.24	16.72	5.47	13.25	90.13	-
Medium	0.62	18.40	13.94	37.11	368.62	3.99
Large	0.14	22.20	3.12	10.03	215.25	1.73
Total			22.53	60.24	671.80	5.72

With reference to charging strategy two different options have been taken into account:

- Dump charge: Vehicles are charged exclusively according to driver's needs/habits;
- Smart charge: EV charge during low-power demand in order to meet drivers' needs to recharge the vehicle at a certain time as well as to avoid grid overloading.

The graphs displayed in the Results and discussion section refer to the smart charge option.

2.2.3 Cost structure

As concerns costs, economic data are based on projections to 2050 from the EU-funded Heat Roadmap Europe project [27], Tables 15 and 16 display data relevant to the analysis, i.e. RES costs and fuel price.

Country	Technology	Investment (M€/MW _e)	Period (Years)	O. & M. (% of Inv.)
Italy	Onshore wind	0.86	30	3.41
	Offshore wind	1.39	30	1.93
	Photovoltaic	0.66	40	1.11

Table 15. Intermittent RES related costs at 2050 (Source:[27])

Germany	Onshore wind	0.91	30	3.40
	Offshore wind	1.47	30	1.93
	Photovoltaic	0.70	40	1.11

Table 16.	Fuel price	(€/GJ)	(Source:[27])
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Fuel	Price
Coal	2.4
Fuel Oil	9.7
Diesel fuel	12.1
Petrol/JP	12.1
Natural gas	9.3
LPG	13.4
Biomass	8.6

A weighted average price for EV has been considered from the current vehicle fleet composition. Medium and large EV price has been evaluated considering such category made up of 30 % BEV and 70 % PHEV. As concerns petrol and diesel cars, for both countries purchase costs have been derived from manufacturers' prices for the most common vehicles for each category, chosen as representative of the particular segment. Resulting data are summarized in Table 17.

Country	Category	Petrol	Diesel	EV
Italy	Small	12.39	13.45	29.81
	Medium	23.40	21.00	37.03
	Large	62.65	58.17	88.33
Germany	Small	13.60	16.20	24.96
	Medium	23.40	26.40	36.43
	Large	62.65	60.43	87.68

Table 17.	Conventional	and EV	purchase	costs (′k€))
	Convolutional		paronaoo	00010 (

Given the foreseen decrease in battery costs in the medium-long term future [51,52] a parametric analysis has been also undertaken with respect to EV price, evaluating the effect of possible reasonable future price reductions for EV as compared to conventional vehicles. In particular, cost analysis has been carried out under three different EV purchasing cost assumptions:

- EV price @2016: EV price is stable at 2016 level;
- EV price reduced: average between current EV and conventional car price;
- EV=Conventional: EV price equals that of conventional cars.

3 RESULTS AND DISCUSSION

The variety of scenarios defined according to the above-mentioned assumptions have been compared using environmental and techno-economic indicators as CO_2 emissions variation, RES penetration and surplus. These latter have been evaluated with respect to the domestic electricity production.

3.1 RES and EV positive interactions

Figure 1 displays how the increase in iRES capacity with respect to 2016 (labelled as iRES capacity growth factor) affects two crucial energy indicators, namely CO₂ emissions and RES surplus, for the Italian and German case respectively; EV are assumed to be charged under a smart strategy.



Figure 1. CO₂ emissions at increasing iRES capacity – Italy (left) and Germany (right)

While the Italian energy system always benefits from EV, in Germany the additional electricity required for EV charging leads to a different trend in CO_2 emissions, so that, when iRES capacity is below a certain threshold, emissions remain almost unchanged irrespective of EV penetration (and actually slightly increase). Moreover, as discussed in Section 3.3, for the German case the overall installed capacity for electricity generation is not adequate to fulfil the increase in electricity demand that arises under significant EV penetrations, thus requiring additional electricity to be imported from neighbouring countries (or, possibly, additional increase of existing installing capacity). For such scenarios, CO_2 emissions equivalent to additional import have been calculated as if they were produced by national PP capacity, that is, German PP specific CO_2 emissions have been applied to the additional import.

On the other hand, at higher levels of RES penetration (approximately twice the base case capacity), the interaction between RES and EV proves to be beneficial for both countries, even more effective in the German case where RES replace a more carbon-intensive electricity generation sector. In particular, without including the electrification of transport sector, if RES are increased up to 6 times the overall 2016 capacity, CO_2 emissions can be reduced by 9 % and 27 % for Italy and Germany respectively. At the highest RES level, EV allow a further reduction of CO_2 emissions down to 22 % and 39 % for Italy and Germany respectively by absorbing the otherwise-curtailed renewable surplus, which is reduced from 29 % to 15 % of total electricity production for Italy and from 50 % to 28 % for Germany (Tables 18 and 19).

Nonetheless, it is worth mentioning that curtailments cannot be effectively reduced unless the deployment of renewable sources is extended, besides transportations, also to other sectors of the energy system to maximise the positive effects of sector coupling [53], or suitable grid-scale electricity storage systems become available and widely used [54].

3.2 Impact of charging strategy

Tables 18 and 19 and show CO_2 variations (with respect to 2016 base-case), RES penetration and surplus (both expressed as a percentage of the total production) for increasing EV penetrations comparing dump and smart charging strategies at the highest RES level.

For both countries, shifting from dump to smart strategy results in a positive effect on CO₂ emissions; when a smart charge is implemented Italy features a higher percentage variation than Germany with respect to results obtained using a dump charge. This is due to the particular uneven distribution of the Italian RES potential generation throughout the day; conversely, the charging strategy shows a lower effect for the German case where potential RES surplus, more uniformly distributed, lessens the negative impact of dump charge. In fact, vehicle charged at evening/night time can still exploit some RES power related to wind electricity generation, as opposed to Italy where renewable production occurs mostly during the day due to the higher solar power share. As a result, in terms of percentage change, RES penetration variation, and subsequent RES surplus, is higher for the Italian case when a smart charge is applied as a relatively higher share of renewable power can be incorporated in the energy system.

	0%EV	20%EV	40%EV	60%EV	80%EV	100%EV
CO ₂ [%]						
Dump	-9.2%	-10.9%	-12.7%	-13.6%	-15.0%	-16.3%
Smart	-9.2%	-11.8%	-14.3%	-16.8%	-19.2%	-21.5%
Variation	0.0%	7.9%	13.1%	23.3%	28.3%	31.5%
RES penetratio	on [% of tot. pro	od.]				
Dump	51.2%	53.1%	52.3%	50.1%	48.7%	47.3%
Smart	51.2%	52.4%	53.5%	54.3%	55.0%	55.3%
Variation	0.0%	-1.4%	2.2%	8.4%	12.9%	16.9%
RES surplus [%	6 of tot. prod.]					
Dump	29.3%	28.1%	26.3%	25.9%	25.0%	24.2%
Smart	29.3%	26.1%	23.0%	20.1%	17.4%	15.0%
Variation	0.0%	-7.1%	-12.5%	-22.4%	-30.4%	-38.1%

Table 18.	CO ₂ variations,	RES penetration	and surplus at 6xiRE	S - Italy
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-	0%EV	20%EV	40%EV	60%EV	80%EV	100%EV
CO ₂ [%]						
Dump	-27.4%	-27.3%	-28.5%	-29.4%	-30.2%	-31.0%
Smart	-27.4%	-29.8%	-32.2%	-34.5%	-36.8%	-39.1%
Variation	0.0%	9.4%	13.0%	17.4%	21.9%	26.3%
RES penetratio	on [% of tot. pro	od.]				
Dump	60.6%	60.3%	60.0%	59.4%	58.5%	57.7%
Smart	60.6%	61.8%	62.9%	64.0%	64.9%	65.8%
Variation	0.0%	2.5%	4.9%	7.8 %	10.9%	14.0%
RES surplus [%	6 of tot. prod.]					
Dump	50.4%	50.6%	47.0%	43.9%	41.2%	39.0%
Smart	50.4%	45.2%	40.5%	36.0%	31.8%	28.0%
Variation	0.0%	-10.7%	-13.8%	-18.0%	-22.8%	-28.2%

Table 19. CO2 variations, RES penetration and surplus at 6xiRES - Germany

This phenomenon is visible in Figures 2 and 3, which show boxplots related to electricity demand normalized distributions throughout the 24 hours for the whole year considering dump and smart charge at 6xiRES and EV entirely replacing the conventional vehicle fleet (100%EV). Electricity demand distribution is reshaped from dump to smart strategy according to the availability of RES surplus, shifting night-hour load to day hours characterised by an abundance of renewable power. The contribution of conventional power plants and RES surplus can thus be partly reduced as shown in Figures 4–7, representing, for the Italian and the German case respectively, hourly demand and supply by RES and conventional sources for approximately ten days of February, in which it can be also observed how the higher share of wind generation may reduce issues related to an unregulated EV charge.

The variation of CO₂ emissions divided by energy sectors is displayed in Figures 8–13 for base-case and for iRES2016 and 6xiRES at the highest EV share.

When EV replace entirely conventional cars, CO_2 emissions in the transport sector can be reduced by 13 and 12 percentage points respectively for Italy and Germany at the price of a rise in total electricity generation emissions (11 and 13 percentage points respectively) when RES are kept at 2016 level. As discussed previously (section 3.1), full transport electrification results in an overall decrease in emissions in Italy, while it leads to a slight increase in Germany, due to the carbon-intensive electricity generation sector of this country.

An increase in iRES capacity up to 6 times 2016 level allows a reduction in CO_2 emission within the electricity generation, leading to a level that is comparable to the total 2016 emissions for the Italian case (30 % of the overall emissions) and even lower for Germany (22 %), that entails however a huge amount of RES surplus (as described previously).

Emissions due to transportation are still significantly affected by other means of transportation other than light-duty vehicles (heavy-duty vehicles, boat and air transport, etc) whose contribution, for both countries, represents 20–21 % of the overall emissions in the best-case scenario. Such figure could be curbed by replacing petrol and diesel supply with electrofuels, these latter generated out of electricity (possibly from RES surplus), hydrogen and biomass [53]. At the present stage, however, electrofuels have not been included in the analysis.



Figure 2. Daily distributions for the whole year of electricity demand under dump (top) and smart (center) EV charge and RES surplus (bottom). 6xiRES and 100%EV scenario - Italy.



Figure 3. Daily distributions of electricity demand under dump (top) and smart (center) EV charge and RES surplus (bottom). 6×iRES and 100%EV scenario - Germany.



Figure 4. Power generation and demand at 100% EV and 6xiRES (Dump Charge) - Italy



Figure 5. Power generation and demand at 100% EV and 6xiRES (Smart Charge) - Italy



Figure 6. Power generation and demand at 100% EV and 6xiRES (Dump Charge) - Germany



Figure 7. Power generation and demand at 100% EV and 6xiRES (Smart Charge) – Germany



Figure 8. CO₂ emissions (Mt) divided by sector (base-case) - Italy





Figure 9. CO₂ emissions (Mt) divided by sector (iRES2016 and 100%EV) - Italy





Figure 10. CO2 emissions (Mt) divided by sector (6xiRES and 100%EV) - Italy



Figure 11. CO₂ emissions (Mt) divided by sector (base-case) - Germany





382 53%





Figure 13. CO₂ emissions (Mt) divided by sector (6xiRES and 100%EV) - Germany

3.3 Coal and nuclear phase-out

The effect of coal phase-out included in the energy strategies of both countries [70,71] has been also assessed; results are shown in Table 20 when EV entirely replace the conventional vehicle fleet at the lowest and highest iRES installed capacity. The reduction of CO_2 emissions is remarkable when coal is phased out from the German energy system; however, it occurs at the price of a considerable electricity import as the projected installed capacity is not adequate to cater for an increase in electricity demand. Import has been assumed to be fulfilled by PP by virtually increasing their available capacity, and corresponding emissions taking into account German PP specific emissions.

In this regard, while almost negligible for the Italian case, import can be as high as 44 % of the total national production for the German case if RES capacity is kept at 2016 level. As a result, the energy mix of the country where electricity is imported from highly affects the overall sustainability of both coal and nuclear phase-out strategies.

	Italy		Germ	any
	iRES2016	6×iRES	iRES2016	6×iRES
CO ₂ [%]				
No phase-out	-5.2%	-21.7%	0.5%	-39.2%
Coal phase-out	-8.3%	-23.3%	-26.5%	-45.1%
Coal and nuclear phase-out	-	-	-22.3%	-43.8%
Additional import [% of total production]				
No phase-out	0.1%	0.0%	1.1%	0.0%
Coal phase-out	0.5%	0.1%	26.6%	0.8%
Coal and nuclear phase-out	-	-	43.9%	2.0%

Table 20.	CO ₂ emissions	and import -	effect of coal	and nuclear	phase-out
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3.4 Cost analysis

A preliminary cost analysis was undertaken breaking down total annual costs in investments and variable costs according to EnergyPLAN subdivision.

Tables 21 and 22 report cost composition for iRES2016 and 6×iRES at 100%EV, compared with the base case scenario assuming the different EV purchasing costs. Set to 100 total costs for the reference case, variable and investment costs were normalized accordingly:

$$C_{i\,norm} = C_i / C_{tot\,2016} \times 100$$

Table 21. Total, investments and variable normalized costs at 2016 (base case) and iRES2016 and 6xiRES at 100%EV - Italy

	Base case 2016	100%EV iRES2016	100%EV 6×iRES
Variable costs	49.8	46.8	41.1
of which CO ₂ emissions costs	8.3	7.9	6.5
Investments and O&M (EV price @2016)	50.2	85.9	89.0
Investments and O&M (EV price reduced)	50.2	68.0	71.1
Investments and O&M (EV=Conventional)	50.2	50.1	53.2
Total costs (EV price @2016)	100.0	132.7	130.2
Total costs (EV price reduced)	100.0	114.8	112.3
Total costs (EV=Conventional)	100.0	96.9	94.3

	Base case 2016	100%EV iRES2016	100%EV 6×iRES
Variable costs	40.7	37.3	28.1
of which CO ₂ emissions costs	10.0	10.1	6.1
Investments and O&M (EV price @2016)	59.3	82.3	90.5
Investments and O&M (EV price reduced)	66.7	70.8	79.1
Investments and O&M (EV=Conventional)	66.7	59.3	67.6
Total costs (EV price @2016)	100.0	119.6	118.6
Total costs (EV price reduced)	100.0	108.1	107.1
Total costs (EV=Conventional)	100.0	96.6	95.6

Table 22. Total, investments and variable normalized costs at 2016 (base case) and iRES2016 and 6xiRES at 100%EV - Germany

For both countries, the increase investment costs due to both new RES installed capacity and EV is partly offset by a reduction in variable costs leading to an overall increase in total costs in the range 20–33 % with respect to the base case scenario when EV price remains unchanged from 2016 level. As EV purchasing cost decreases so do investments costs ultimately leading to a reduction in total costs up to around 5 % when the difference in EV and conventional cars' price is eventually evened out.

3.5 Policy recommendations

Electrification of transport is a priority in the European Community Research Program, due to several advantages related to EV, including higher "tank-to-wheel" efficiency with respect to traditional combustion engines, no tailpipe emissions of CO₂ and pollutants at the point of use, and lower impacts in terms of noise and vibrations. Moreover, a key aspect is the possibility of increasing the share of RES in the transport sector through electricity generation, as deeply analyzed in this paper.

This last aspect is particularly of interest in Germany and Italy, where RES shares in electricity mixes are already reaching remarkable values. Both countries are currently supporting EV by providing tax incentives to EV owners, and Germany is also supporting the diffusion of EV with an environmental bonus for buyers. Both countries are also investing in the development of a charging infrastructure, which will be a crucial point for the diffusion and use of EV.

The results of this paper provide some valuable insights for the further development of EV supporting policies. The electricity generation mix is a crucial parameter for the success of reducing CO_2 emissions through the diffusion of EV in any country. The comparison of Germany and Italy clearly highlights that a threshold exists in RES electricity share for an effective reduction of CO_2 emissions. For this reason, an integrated energy policy is needed to couple the increase of EV diffusion to a parallel development of electricity generation from RES.

Again, as confirmed by the results of this work, without a careful support of RES electricity generation, the strong increase of EV penetration could potentially lead to an unwanted rebound effect, i.e. an increase of CO_2 emissions in the transport sector. Attention must be paid also to the electricity profiles, to guarantee the optimal coupling between RES generation and EV charging logics and avoid the necessity of additional electricity import and/or conventional generation to offset the mismatch between RES potential production and increased electricity demand.

A policy support to smart charging solutions is essential to increase the benefits in terms of overall efficiency and CO₂ emissions reduction. The main option to shift the electricity consumption during a specific time frame is to apply a different electricity price depending on the hour of the day, although for the final users these tariffs are generally fixed and unrelated with the wholesale prices, which in turn are more representative of the actual composition of the power mix. In Europe and Germany, the electricity price for final users is currently mainly made up by taxes and levies, rather than on the power generation price, thus complicating the definition of variable tariffs. Moreover, it is not clear if a small difference in the electricity price for the EV supply will suffice to shift the users' behavior towards smart charging strategies. It would also be necessary to dynamically adjust the power price depending on the live conditions of the network, but final users may require some guarantees on the maximum prices to accept this option.

A more effective solution, as it is already happening in some contexts, may be the aggregation of a large number of EV into virtual power plants, which are the aggregation of a mix of distributed generation, storage and demand side management that are controlled and operated together to reach the required capacity to participate to the power market. While virtual power plants are currently mainly justified by economic advantages, as well as regulation limits on the access to wholesale markets, the remote operation of multiple EV by a single operator may result in an optimal management of the charging process. However, it has to be noted that for allowing such a smart charging, EV need to remain connected to charging stations for a longer duration, thus leading to the need of a higher vehicle/charging point ratio than for standard charging. Moreover, the users should be able to request a specific level of charge at the time they need it, depending on their specific habits, which may not always be in accordance with the optimal charging strategy.

Finally, it is useful to observe that, besides potentially reducing CO_2 emissions, a significant adoption of EV in private transportation also contributes to improve air quality, which is an ever-increasing problem particularly in cities [55], and to increase energy security. In this respect, this study only focuses on investment and fuel costs variations; however, further analysis should be dedicated to include the above-mentioned beneficial actions so as to assess the actual overall costs of EV penetration from a wider technical and socio-economic perspective.

4 CONCLUSIONS

This study aims to assess the impact of electric vehicles on energy systems characterised by a different supply mix for the electricity generation sector in the framework of a progressive increase of renewable energy sources capacity. Projections for possible future increase of renewable energy capacity have been implemented along with linearly growing shares of electric vehicles up to a total replacement of conventional vehicle fleet.

Results confirm that the electricity generation mix is a crucial parameter for the success of reducing CO_2 emissions through the diffusion of electric vehicles in any country. In particular, electric vehicles penetration in the energy system curbs CO_2 emissions for the German case provided that renewable capacity is increased up to a certain threshold (approximately twice the base case capacity) while in the Italian system electric private mobility proves to be sustainable even at the current renewable installed capacity.

With a sixfold increase in intermittent renewable sources capacity, and a complete replacement of conventional cars by electric vehicles, CO_2 emissions can be reduced by 22 % and 39 % for Italy and Germany respectively at the price of a significant amount of curtailments (respectively 15 % and 28 % of the total national production).

Smart charge positively contributes to emissions reduction, more significantly for the Italian case due to the more uneven distribution of potential renewable power throughout the day with respect to Germany.

The higher installed capacity for renewables and electric vehicles penetration in the energy system result in higher investment costs, which are however mitigated by a variable costs reduction related to lower fuel consumption, thus leading to a total cost increase in the range 20–33 % with respect to the base case scenario under the conservative assumption that electric vehicles price stays the same with respect to 2016 level.

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DECLARATIONS OF INTEREST

None.

APPENDIX



Figure A.1. Electricity demand and net import/export hourly distribution: Italy at 2016 (Sources:[56,57])



Figure A.2. Electricity demand and net import/export hourly distributions: Germany at 2016 (Source:[58,59])

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Figure A.3. Heating and cooling demand hourly distributions: Italy at 2016 (Sources:[27,34])



Figure A.4. Heating and cooling demand hourly distributions: Germany at 2016 (Source:[27])

25



Figure A.5. Hourly distribution of transportation demand (discharging of EV battery) for 1 week, valid for both Germany and Italy [27].



Figure A.6. Distribution of renewable electricity generation: Italy at 2016 (Source:[39])



Figure A.7. Distribution of renewable electricity generation: Germany at 2016 (Source:[40])

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