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## Impact of a future H<sub>2</sub> transportation on atmospheric pollution in Europe



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### H I G H L I G H T S

- European air quality improves in the future due to emission regulations.
- When road traffic is converted to H<sub>2</sub>, air quality improves further.
- H<sub>2</sub> leaked into the atmosphere does not have a large negative impact on air quality.

### A R T I C L E I N F O

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### A B S T R A C T

Hydrogen (H<sub>2</sub>) is being explored as a fuel for passenger vehicles; it can be used in fuel cells to power electric motors or burned in internal combustion engines. In order to evaluate the potential influence of a future H<sub>2</sub>-based road transportation on the regional air quality in Europe, we implemented H<sub>2</sub> in the atmospheric transport and chemistry model LOTOS-EUROS. We simulated the present and future (2020) air quality, using emission scenarios with different proportions of H<sub>2</sub> vehicles and different H<sub>2</sub> leakage rates. The reference future scenario does not include H<sub>2</sub> vehicles, and assumes that all present and planned European regulations for emissions are fully implemented.

We find that, in general, the air quality in 2020 is significantly improved compared to the current situation in all scenarios, with and without H<sub>2</sub> cars. In the future scenario without H<sub>2</sub> cars, the pollution is reduced due to the strict European regulations: annually averaged CO, NO<sub>x</sub> and PM<sub>2.5</sub> over the model domain decrease by 15%, 30% and 20% respectively. The additional improvement brought by replacing 50% or 100% of traditionally-fueled vehicles by H<sub>2</sub> vehicles is smaller in absolute terms. If 50% of vehicles are using H<sub>2</sub>, the CO, NO<sub>x</sub> and PM<sub>2.5</sub> decrease by 1%, 10% and 1% respectively, compared to the future scenario without H<sub>2</sub> cars. When all vehicles run on H<sub>2</sub>, then additional decreases in CO, NO<sub>x</sub> and PM<sub>2.5</sub> are 5%, 40%, and 5% relative to the no-H<sub>2</sub> cars future scenario. Our study shows that H<sub>2</sub> vehicles may be an effective pathway to fulfill the strict future EU air quality regulations.

O<sub>3</sub> has a more complicated behavior – its annual average decreases in background areas, but increases in the high-NO<sub>x</sub> area in western Europe, with the decrease in NO<sub>x</sub>. A more detailed analysis shows that the population exposure to high O<sub>3</sub> levels decreases nevertheless.

In all future scenarios, traffic emissions account for only a small proportion of the total anthropogenic emissions, thus it becomes more important to better regulate emissions of non-traffic sectors.

Although atmospheric H<sub>2</sub> increases significantly in the high-leakage scenarios considered, the additional H<sub>2</sub> added into the atmosphere does not have a significant effect on the ground level air pollution in Europe.

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## 1. Introduction

Road traffic is a major source of greenhouse gases and pollutants. Greenhouse gases affect the earth system globally, leading to global warming and ocean acidification. Pollution affects human health and ecosystems in particular in densely populated areas. Fine particulate matter (PM<sub>2.5</sub>) enters the lungs and enhances allergies, asthma, lung infections and long term lung diseases. PM<sub>2.5</sub> is recognized as one of the main pollutants reducing life expectancy in Europe (EEA, 2013); recent studies show that PM<sub>2.5</sub> affects health already at levels much lower than present European air quality limits (Beelen et al., 2014). NO<sub>x</sub> contributes to acid rain formation; it is a precursor for tropospheric ozone, aerosols and other toxic chemicals, and affects human health, especially the respiratory system (EEA, 2013; WHO, 2013). CO is a precursor for tropospheric ozone, participates in atmospheric chemistry, and is a toxic gas, affecting blood ability to transport oxygen. Tropospheric O<sub>3</sub> is not emitted directly but formed under influence of NO<sub>x</sub> and volatile organic compound (VOC) emissions. It is one of the major components of photochemical smog; it affects human health, ecosystems and causes important crop losses (EEA, 2013; WHO, 2006, 2008).

In Europe (EU 28), emissions from road traffic were responsible for about 25% of the total CO emissions, 39% of NO<sub>x</sub> and 15% of the primary PM<sub>2.5</sub> in 2012 (EEA, 2014). Road transport was responsible for 26% of O<sub>3</sub> precursor emissions in Europe in 2007 (EEA, 2010).

Replacing fossil fuels by H<sub>2</sub> in a potential future “hydrogen economy” is attractive, in the context of reducing availability of fossil fuels and increased awareness on the problems of pollution and climate change. When using fuel cell technology, H<sub>2</sub> burning emits only water, thus using H<sub>2</sub> as a fuel would avoid direct emissions of both anthropogenic greenhouse gases and pollutants.

Regarding H<sub>2</sub> safety, it is often thought that H<sub>2</sub> would be a dangerous fuel quickly leading to explosions. However, with adequate handling, H<sub>2</sub> can be a safer fuel than e.g. gasoline or methanol: because of its high buoyancy it does not accumulate around leak points, reducing the risk of explosions; also, a H<sub>2</sub> fire causes fewer toxic emissions and less severe radiant heat damage (Adamson and Pearson, 2000; Veziroglu and Barbir, 1992).

However, it is important to consider all potential effects. In 2000s, several studies (Prather, 2003; Schultz et al., 2003; Tromp et al., 2003; Warwick et al., 2004) drew attention to the fact that a hydrogen economy would be associated with an increase in atmospheric H<sub>2</sub> due to leakage, and this additional atmospheric H<sub>2</sub> could have negative effects on the atmosphere. Additional H<sub>2</sub> in the atmosphere could enhance the stratospheric ozone hole (Tromp et al., 2003), and could indirectly increase the radiative forcing by influencing the greenhouse gases methane and tropospheric ozone (Prather, 2003). Later, more detailed studies showed that these negative effects are much smaller than feared initially, and small compared to the potential benefits (Derwent et al., 2006; Jacobson, 2008; Vogel et al., 2012; Wang et al., 2013b; Warwick et al., 2004).

The benefits of a hydrogen economy can be significant, especially regarding air quality. All studies to date reported considerable improvements in air quality, if (part of) the economy or transportation were switched to H<sub>2</sub> as an energy carrier. The first studies on this subject considered the present (~2000) situation and assumed an immediate transition to a H<sub>2</sub> economy.

In their modeling study, Schultz et al. (2003) considered a conversion to H<sub>2</sub> of 50% of the total economy (which is roughly equivalent to 100% conversion of the transportation sector). This resulted in decreases in simulated NO<sub>x</sub> (30%), CO (3%) and O<sub>3</sub> (5%)

mole fractions. They also found that in polluted areas in Western Europe, China and Eastern US the average surface O<sub>3</sub> would increase; however, even in these areas, the peak O<sub>3</sub> values were predicted to decrease, which would result in fewer violations of air quality limits. Another finding of this study was a decrease in oxidizing power of the troposphere, because the decrease in NO<sub>x</sub> leads to less OH.

In a similar study, Warwick et al. (2004) assumed a complete replacement of the fossil fuel economy, and found reductions in tropospheric O<sub>3</sub> (2.2%) and OH (5%).

Jacobson et al. (2005) assumed a conversion of all US vehicles to H<sub>2</sub>, and compared the effects on air quality, health and climate for several H<sub>2</sub> production options. Unlike the other studies, they also took into account the emissions associated to the production of H<sub>2</sub>. The results showed that using H<sub>2</sub> produced from wind energy offers the largest benefits for health and climate. For all H<sub>2</sub> production methods, significant reductions were found for CO, O<sub>3</sub>, NO<sub>x</sub>, black carbon, and other tropospheric pollutants.

Jacobson (2008) estimated the effects of converting the global vehicle fleet to H<sub>2</sub> produced by wind-powered electrolysis, and found reductions over 10 years in tropospheric CO (5%), NO<sub>x</sub> (5–13%), O<sub>3</sub> (6%) and OH (4%).

The recent study of Wang et al. (2013a), which estimated the effects of converting the global transportation to H<sub>2</sub>, is the first one to place the simulations in the future (2050). The study is global, and includes higher resolution simulations with focus on the US territory. Their baseline (no H<sub>2</sub> cars) emission scenarios are based on the Intergovernmental Panel on Climate Change (IPCC) Special Report on Emission Scenarios (SRES) growth scenarios A1F1 and B1 (Nakicenovic et al., 2000), combined with present-day fossil fuel burning emission factors. A1F1 and B1 are the highest and lowest emission SRES scenarios. Both assume a large population increases and a world integrated economically; the A1F1 scenario assumes rapid economic growth and intensive use of fossil fuels, while in B1 the economy becomes more information oriented and less material intensive, and employs more clean and resource efficient technologies. The simulations using these baseline scenarios predict significantly increased air pollution in 2050 compared to present. The pollution decreases then significantly compared to the baseline when switching all the road traffic to H<sub>2</sub>. The largest improvements are found in most polluted, highly populated areas. Wang et al. assume no emissions of air pollutants are associated with H<sub>2</sub> production.

In the present study we investigate the effects on air quality in Europe of a future (2020) H<sub>2</sub>-based road transportation sector, using the chemistry transport model LOTOS-EUROS. We compare future emission scenarios in which 50% or 100% vehicles are converted to H<sub>2</sub>, with a future “baseline” scenario without H<sub>2</sub> vehicles. Our baseline emission scenario assumes that the current and planned European legislation concerning emissions of air pollutants is fully implemented. We account for NO<sub>x</sub> emissions associated to the production of H<sub>2</sub> for vehicle use.

## 2. Methods

### 2.1. Model

LOTOS-EUROS is an Eulerian 3D chemistry transport model designed to simulate air pollution in the lower troposphere in Europe (Schaap et al., 2008). The model has been used to simulate for example ozone (Vautard et al., 2006; Schaap et al., 2008), particulate matter (Manders et al., 2009), secondary inorganic aerosol (Schaap et al., 2004a; Erisman and Schaap, 2004), black carbon

(Schaap et al., 2004b; Schaap and Denier van der Gon, 2007) and sea salt (Manders et al., 2010). LOTOS-EUROS is also being used to provide daily forecasts of air pollution over Europe and the Netherlands.

Concerning the European forecasts, LOTOS-EUROS is one of the 7 CTMs that together form the MACC regional air quality ensemble (<http://gmes-atmosphere.eu/>), and its performance in simulating current concentration levels is therefore continuously verified against surface observations and the other models (Marécal et al., 2015). In addition, the model has been included in dedicated validation and model inter-comparison studies (Solazzo et al., 2013; Kukkonen et al., 2012; Vautard et al., 2012). During all these verifications and comparisons, LOTOS-EUROS was found to have a performance comparable to other European regional models. Similarly to other models, LOTOS-EUROS underestimates the concentration of particulate matter (PM) due to unknown sources and missing secondary organic aerosols, and the simulated ozone variability is too low (underestimation of high values and overestimation of low values, also a common feature of models).

In the current study, the LOTOS-EUROS domain is between 35°N and 70°N latitude and between 10°W and 40°E longitude, with a spatial resolution of 0.50° lon × 0.25° lat. The vertical structure is relatively simple, with four vertical levels (surface, mixed layer and two reservoir layers) up to a height of 3500 m a.s.l. The surface layer height is fixed at 25 m; the height of the mixed layer is provided by ECMWF meteorology (see below) and the two reservoir layers are equal in height and calculated from the difference between 3500 m and the mixed layer height, with a minimum of 500 m.

For this work we use LOTOS-EUROS version 1.9.6 with ECMWF meteorological fields for 2008. The temporal resolution of the model output is 1 h. Initial and boundary conditions are provided by daily output at 6° × 4° spatial resolution from the global model TM5 (Krol et al., 2005; Pieterse et al., 2011, 2013).

Gas phase chemistry is computed in LOTOS-EUROS using the CBM-IV scheme (Whitten et al., 1980), with updates as described in Schaap et al. (2008). Aerosol chemistry is represented using the ISORROPIA2 thermodynamic equilibrium module (Fountoukis and Nenes, 2007). Dry deposition of gases is implemented through the module DEPAC 3.11 (Van Zanten et al., 2010) and relies on the parallel resistance approach. The deposition velocity of CO was set in this work equal to half of the H<sub>2</sub> deposition velocity (see below). The dry deposition of particles follows the parameterization of Zhang et al. (2001). Below cloud scavenging is described using simple scavenging coefficients for gases (Schaap et al., 2004a) and particles (Simpson et al., 2003).

## 2.2. Present emissions

The anthropogenic emissions (for CH<sub>4</sub>, CO, NH<sub>3</sub>, VOC, NO<sub>x</sub>, SO<sub>x</sub>, PM<sub>10</sub>, PM<sub>2.5</sub>, CO<sub>2</sub>) are derived from the TNO-MACC emission grids (Kuenen et al., 2014). The emissions include both grid and point sources and are aggregated into 10 main source categories (SNAP (“Selected Nomenclature for Sources of Air Pollution”), level 1), with the road traffic category separated into 5 sub-categories.

Anthropogenic emissions vary with month, day of week, and time of day according to time factors per source category (Mues et al., 2014). Emissions of VOCs and CO from road traffic vary additionally with atmospheric temperature (Sauter et al., 2012).

## 2.3. Implementation of H<sub>2</sub> in LOTOS-EUROS

We added into the CBM-IV chemistry scheme used in LOTOS-EUROS the production of H<sub>2</sub> by formaldehyde photolysis (CH<sub>2</sub>O

(hv) → CO + H<sub>2</sub>) and the reaction of H<sub>2</sub> with OH (H<sub>2</sub> + OH + O<sub>2</sub> → HO<sub>2</sub> + H<sub>2</sub>O). Through the second reaction, H<sub>2</sub> can directly influence the atmospheric composition and chemistry, due to destruction of OH and production of HO<sub>2</sub>. For this reaction we use the temperature dependent reaction rate as given in Houweling et al. (1998) based on DeMore et al. (1994).

The TNO MACC emission data were modified to include H<sub>2</sub> from stationary and mobile fossil fuel combustion. Combustion of traditional fossil fuels emits H<sub>2</sub>, and these H<sub>2</sub> emissions are usually well correlated with CO emissions. Emissions of H<sub>2</sub> from fossil fuel road traffic were computed based on the emissions rates per vehicle category available in literature (Bond et al., 2011 and references therein). For the categories for which no emission rates were available (most of the pre-Euro 3 vehicles), H<sub>2</sub> emissions were computed by scaling the CO emissions with a factor of 0.55 mol:mol (Bond et al., 2011; Vollmer et al., 2007). Only gasoline and gas-fueled vehicles are assumed to emit relevant amounts of H<sub>2</sub>; Diesel vehicles emit negligible amounts of H<sub>2</sub> (Bond et al., 2010, 2011). The temperature dependence of H<sub>2</sub> emissions from road traffic was set equal to the one of CO. Besides the H<sub>2</sub> emissions from fossil fuel burning, in the future scenarios that include H<sub>2</sub> cars, additional emissions of H<sub>2</sub> due to H<sub>2</sub> fuel leakage were added, as described in Section 2.4.

The anthropogenic H<sub>2</sub> emissions from other combustion sources were computed by scaling the CO emissions with a factor of 0.4 mol:mol, which is approximately in the middle of the range estimated from atmospheric measurements (Hammer et al., 2009; Yver et al., 2009, 2011).

Soil uptake is the main sink for atmospheric H<sub>2</sub>, accounting for about 80% of the atmospheric H<sub>2</sub> loss. Soil uptake of H<sub>2</sub> is computed in LOTOS-EUROS by multiplying the deposition velocity with the local mole fraction. The deposition velocity depends on land use and on soil conditions, with lower deposition velocity for wet or frozen soil. No significant H<sub>2</sub> deposition takes place over water bodies and onto plants. Note that, due to its atmospheric lifetime of about 2 years, the H<sub>2</sub> abundance in the LOTOS-EUROS domain is largely determined by the applied boundary conditions from TM5.

## 2.4. Emission scenarios

In order to assess the potential impact of a future change to H<sub>2</sub> powered vehicles, six main emission scenarios were created as summarized in Table 1. The “NOW” scenario represents the present situation and uses emissions for the year 2005. The other scenarios represent the future (2020) and include no H<sub>2</sub> cars (CLE2020), 50% H<sub>2</sub> cars (H2\_50\_01 and H2\_50\_4), or 100% H<sub>2</sub> cars (H2\_100\_01 and H2\_100\_4). The “\_01” and “\_4” codes in the scenario names refer to the 0.1% and 4% H<sub>2</sub> leakage rates (see below). The CLE2020 (“Current Legislation”) scenario assumes that all current and planned European emission regulations will be fully implemented by 2020. We considered the H<sub>2</sub> vehicles are fuel cell – powered, therefore they do not emit NO<sub>x</sub>.

**Table 1**  
Emission scenarios.

Scenario	Time	H <sub>2</sub> vehicles	H <sub>2</sub> leak rate
NOW	Present	0	0
CLE2020	Future	0	0
H2_50_01	Future	50%	0.1%
H2_50_4	Future	50%	4%
H2_100_01	Future	100%	0.1%
H2_100_4	Future	100%	4%

We considered large proportions of H<sub>2</sub> powered vehicles, in order to be able to detect even small effects. It is obviously highly unlikely that a large proportion of vehicles (e.g. 50%) will be using H<sub>2</sub> by the year 2020. The reason we chose the year 2020 for our simulations, and not for example 2050, is that the human population distribution, energy demands, the road traffic location and intensity, and other relevant variables can to some extent be predicted for 2020 but not much further into the future.

For the future scenarios that include H<sub>2</sub> vehicles, we used two H<sub>2</sub> leak rate scenarios of 0.1% and 4% that define what we consider a possible range. Although H<sub>2</sub> is difficult to confine, and higher leak rates (10% or more) have been predicted by some authors (e.g. Tromp et al., 2003), we assume that for financial reasons the losses will be limited to a lower level of 4% in a mature technology. Our high leak rate (4%) is consistent to the estimates of Bond et al., 2011. The 0.1% leak rate is very optimistic, but it is considered achievable by some authors, as it is already attainable in some of the present-day technical systems – e.g., the H<sub>2</sub> distribution grid in Germany (Bond et al., 2011; Lovins, 2003; Zittel and Altmann, 1996).

In our scenarios, H<sub>2</sub> for vehicle use is produced by steam reforming of natural gas coupled with carbon capture and storage (Damen et al., 2006; Spath and Mann, 2000), at natural gas-fired power plant locations. The only emission from H<sub>2</sub> production is NO<sub>x</sub>, at an approximate rate of 0.01 kg NO<sub>x</sub>/kg H<sub>2</sub> (rate based on system total NO<sub>x</sub> emission from Spath and Mann, 2000). The required amount of H<sub>2</sub> for transportation is calculated based on an efficiency increase of 25% when switching from conventional fuels to H<sub>2</sub>, plus the amount of H<sub>2</sub> needed to compensate for leakage losses. Note that H<sub>2</sub> also has approximately a factor three higher energy content on a mass basis than conventional fuels.

The TM5 boundary conditions (see Section 2.1) are identical for all present and future simulations, which means that future possible changes in the background levels of H<sub>2</sub> or other species are not considered.

### 3. Results

#### 3.1. Emissions

Fig. 1 shows the annual anthropogenic emissions of CO, NMVOC, NO<sub>x</sub>, PM<sub>2.5</sub> and H<sub>2</sub>, over the whole model domain, for each of the six scenarios. It is evident that, at present, the road traffic contribution to the total emissions is substantial. For the CLE2020

scenario, the emissions of all species decrease significantly compared to present, due to decreases in both traffic and non-traffic categories of emissions; the traffic contribution to the total emissions decreases as well. For the scenarios that assume 50% H<sub>2</sub> cars (H2\_50\_01 and H2\_50\_4) the total emissions for all species except H<sub>2</sub> are slightly lower than for CLE2020, and the emissions decrease further for the scenarios with 100% H<sub>2</sub> cars (H2\_100\_01 and H2\_100\_4). The difference between the 100% H<sub>2</sub> cars scenarios and 50% scenarios is larger than the difference between the 50% H<sub>2</sub> cars scenarios and CLE2020. That is because the first 50% H<sub>2</sub> cars are assumed to be bought instead of new, low pollution traditional fuel cars, therefore they replace the cleaner half of the CLE2020 fleet; the second 50% H<sub>2</sub> cars replace all the rest of the cars, including the older, more polluting ones. The non-traffic NO<sub>x</sub> emissions increase slightly in the H<sub>2</sub>-vehicle scenarios, due to the addition of NO<sub>x</sub> emissions during H<sub>2</sub> production.

The emissions of H<sub>2</sub> decrease in the CLE2020 scenario compared to the present, due to fewer emissions from fossil fuel burning. For the H<sub>2</sub>-vehicle scenarios with low leakage rate (H2\_50\_01 and H2\_100\_01) the total H<sub>2</sub> emissions are slightly higher than in CLE2020, but still lower than the present emissions. For the scenarios with high leakage rates (H2\_50\_4 and H2\_100\_4), H<sub>2</sub> emissions increase significantly.

#### 3.2. The present atmosphere (NOW scenario)

Fig. 2 shows annual mean ground level concentrations of H<sub>2</sub>, CO, PM<sub>2.5</sub>, NO<sub>x</sub>, O<sub>3</sub> and OH for the NOW and CLE2020 simulations, and the relative differences between the two scenarios. The results corresponding to the present atmosphere are in the leftmost panels.

Within Europe, the area including Benelux, Germany, part of the UK and part of central Europe is the most polluted, because of its high population density, industry and dense road network. High mole fractions of CO and NO<sub>x</sub> are due to large emissions, mainly from road traffic.

Regarding O<sub>3</sub>, this high NO<sub>x</sub> area is in the VOC limited regime, in which O<sub>3</sub> decreases with the increase in NO<sub>x</sub> due to the titration effect (O<sub>3</sub> reacts with the emitted NO, converting it to NO<sub>2</sub>, e.g. Sillman, 1999); the result is a decrease of the average O<sub>3</sub> below the regional background level.

OH is also depleted in this area due to less production from O<sub>3</sub> and the sink of OH through the OH + NO<sub>2</sub> reaction. In the

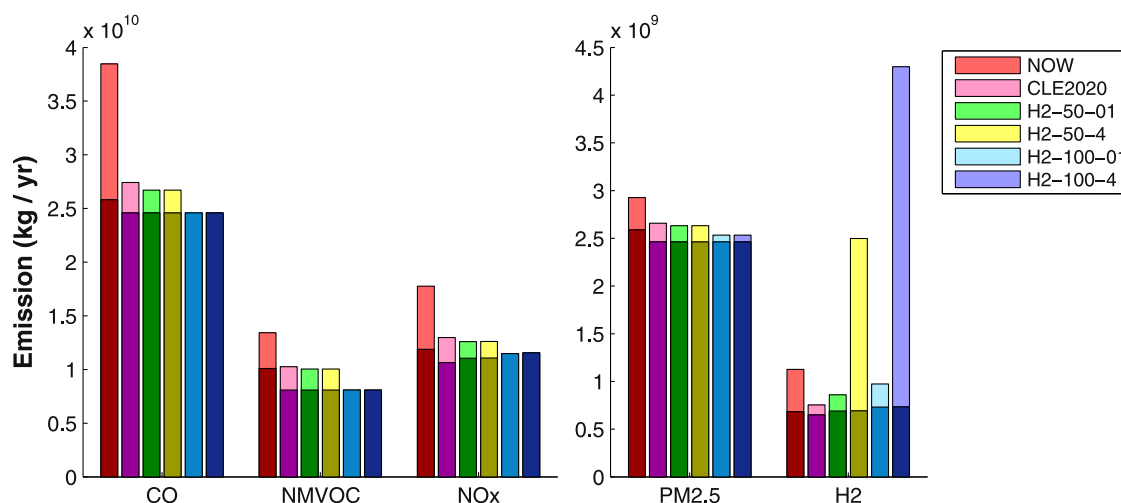
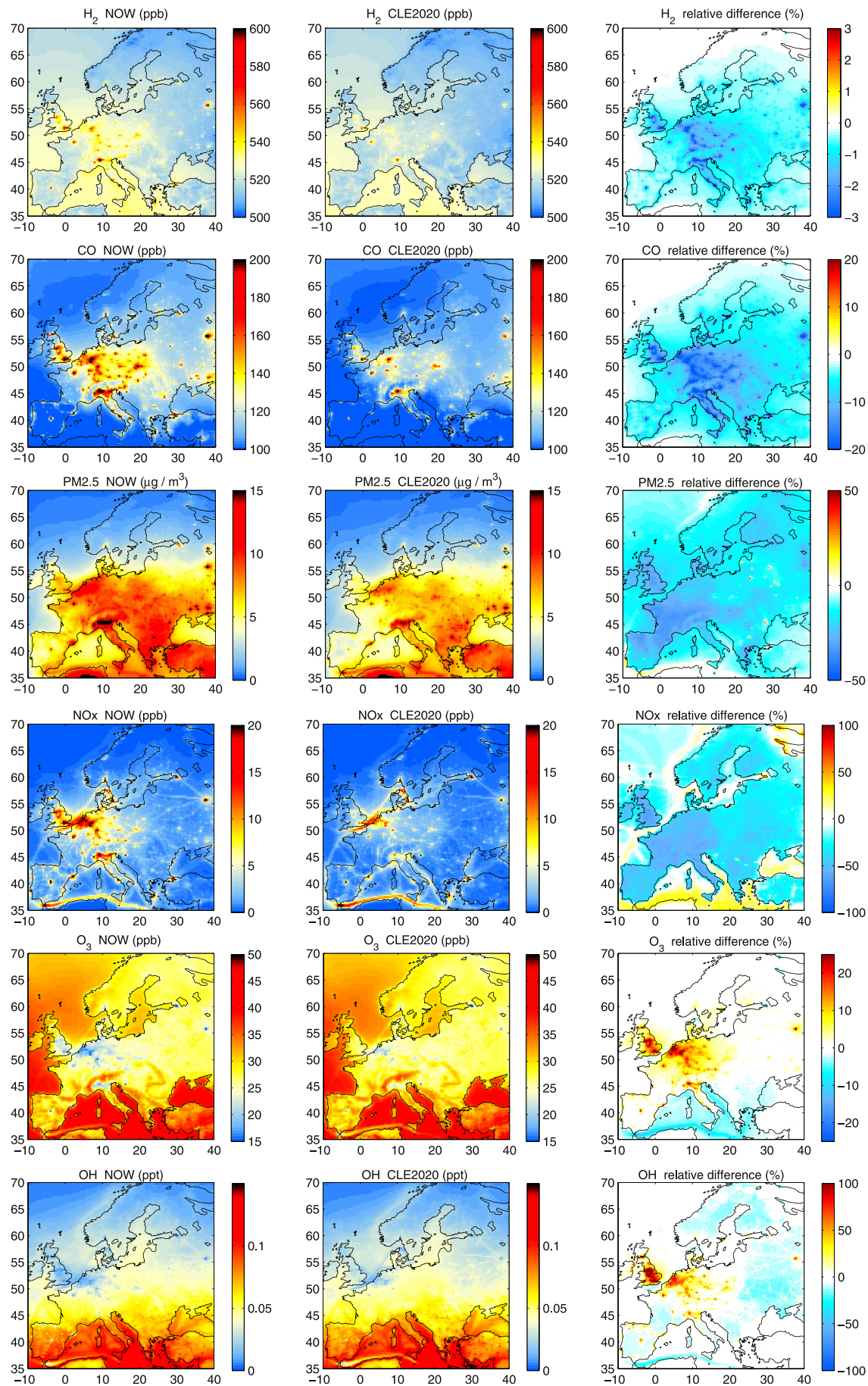


Fig. 1. Total annual emissions in the model domain for different scenarios. The upper, light-colored bar portions represent the contribution of road traffic emissions. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)



**Fig. 2.** H<sub>2</sub>, CO, PM<sub>2.5</sub>, NO<sub>x</sub>, O<sub>3</sub> and OH over Europe for the NOW and CLE2020 scenarios, and the relative differences between the two scenarios for each species. The figure shows annual means at ground level. Note that the color scales are different. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.).

eastern part of the model domain, high CO is largely due to power production. H<sub>2</sub> is also higher in polluted areas, because it is emitted together with CO from anthropogenic burning processes. PM<sub>2.5</sub> has a more uniform distribution over the land areas south of 55°N, with several high concentration areas (around 20 µg/m<sup>3</sup>) in northern Italy and urbanized areas in south-east Europe.

### 3.3. The future without H<sub>2</sub> cars (CLE2020 – NOW)

As shown in Section 3.1, the emissions decrease in the CLE2020 scenario compared to present; it is thus predictable that the air quality improves accordingly. Indeed, it is evident in Fig. 2 that CO, PM<sub>2.5</sub> and NO<sub>x</sub> mole fractions decrease in the CLE2020 scenario relative to the present.

In the CLE2020 simulation, the spatial distribution of CO is similar to NOW, but the mole fractions decrease significantly. The decrease in CO is largest over high CO areas, both in absolute and in relative terms. The average decrease in CO in our domain is 15 ppb (15%). In polluted areas CO decreases by up to 30 ppb (25%). H<sub>2</sub> mole fractions also decrease, due to the decrease in emissions, similarly to CO. The average H<sub>2</sub> decrease is 3 ppb (0.5%), with larger decreases of up to 30 ppb in polluted areas.

PM<sub>2.5</sub> decreases uniformly in western Europe by approximately 2 µg/m<sup>3</sup> (20%). In central and eastern Europe the general decrease is smaller, and there are several urban centers in central Europe where a slight increase can be observed, but the PM 2.5 level still remains below 10 µg/m<sup>3</sup>. In northern Italy the average PM 2.5 decreased to less than 15 µg/m<sup>3</sup>.

NO<sub>x</sub> decreases significantly in all land areas. The relative decrease is of roughly 50% in western Europe and 30% in eastern

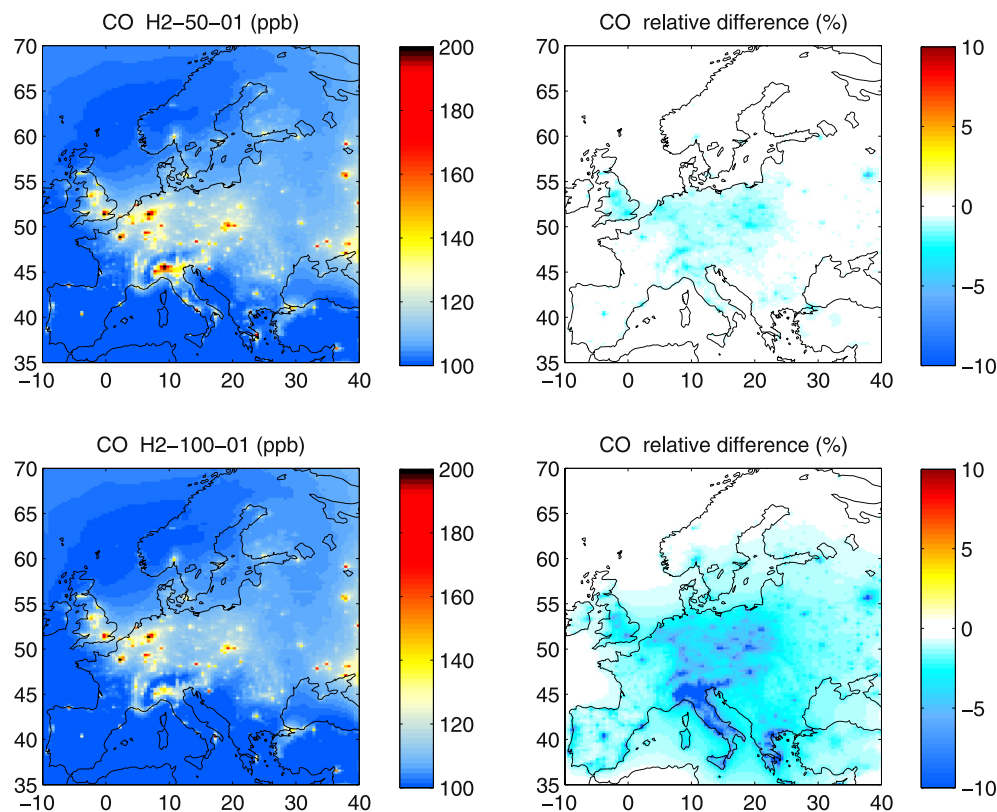
Europe; the absolute decrease is largest in polluted areas. NO<sub>x</sub> increases however over the ship tracks in Mediterranean by up to 3 ppb (20%), due to the fact that ship emissions are less regulated. Even if emissions and atmospheric mole fractions of NO<sub>x</sub> decreased, there are still areas with average NO<sub>x</sub> above 10 ppb, in particular Benelux, and the average NO<sub>x</sub> can reach more than 20 ppb around urban centers.

O<sub>3</sub> behaves unlike the other pollutants: it generally increases over the most polluted areas, by up to 5 ppb or 25%. These are the areas where at present the O<sub>3</sub> is decreased below the continental background level, due to high NO<sub>x</sub>. The decrease in NO<sub>x</sub> in the CLE2020 scenario leads to an increase in O<sub>3</sub> towards the background level. In the southern part of Europe, the background O<sub>3</sub> decreases slightly (by up to 5%), and the decrease is larger along the ship tracks. This decrease is the result of the increased NO<sub>x</sub> in those areas. The behavior of O<sub>3</sub> for all scenarios is analyzed in more detail in Section 3.5.

OH decreases by about 10% over the “clean” land areas, due to the combined opposite effects of less production from O<sub>3</sub> and less consumption by NO<sub>x</sub> and CO. OH also decreases over the ship tracks in the Mediterranean; here the reason is an increased OH sink due to the increase in NO<sub>x</sub> from ships. Over land, in the most polluted regions, where the decrease in NO<sub>x</sub> is largest, OH increases in the CLE2020 scenario because of the decrease in consumption by reaction with NO<sub>x</sub>, and increased production from enhanced O<sub>3</sub>.

### 3.4. The future with H<sub>2</sub> cars

In this section we compare the simulations including 50% and 100% H<sub>2</sub> cars with the CLE2020 results. We use for this comparison the low leak rate scenarios, H2\_50\_01 and H2\_100\_01 (the low and



**Fig. 3.** CO mole fractions for the simulations with 50% (H2\_50\_01) and 100% (H2\_100\_01) H<sub>2</sub> cars (left panels), and the relative differences (between these and the CLE2020 simulation (right panels)). The figure shows annual means at ground level. Note that the color scales are different between left and right panels. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

high leak rate scenarios will be compared in Section 3.6). Each species is discussed in detail below, except for  $H_2$  which is discussed in Section 3.6.

Fig. 3 shows the annual average CO mole fractions at ground level for the H2\_50\_01 and H2\_100\_01 scenarios (50% and 100%  $H_2$  cars), and the relative differences to the CLE2020 scenario. For the H2\_50\_01 scenario, CO slightly decreases compared to CLE2020, by up to 2–3 ppb in western and central Europe. The decrease is small because, as already mentioned in Section 3.1, the relatively clean cars are the first to be replaced by  $H_2$  cars (that is, a new and clean car in the CLE2020 scenario corresponds to a  $H_2$ -car in the H2\_50\_01, while the dirty old cars remain on the road in both scenarios). The decrease in the H2\_100\_01 scenario (100%  $H_2$  cars) is larger, of up to 10 ppb (~10%) in western and central Europe. The largest decrease of approximately 20 ppb occurs in northern Italy, due to the replacement of traditional fuel with  $H_2$  in two-wheelers.

PM 2.5, like CO, decreases very little in the H2\_50\_01 scenario compared to the CLE2020 (Fig. 4). The decrease is less than 1%, and is quite uniform over the land areas. For the H2\_100\_01 scenario, the decrease is larger, of up to  $1 \mu\text{g}/\text{m}^3$ , or 10%. In western Europe, the largest decrease is in northern Italy. This scenario also results in a significant decrease in PM 2.5 in eastern Europe, of 5–10% and locally larger in some urban areas.

In the scenario with 50%  $H_2$  cars (Fig. 5) the average  $\text{NO}_x$  decreases by 0.5 ppb in medium polluted areas and by up to 2 ppb in most polluted urban areas; the relative decrease over western Europe is of 10–15%. In the scenario with 100%  $H_2$  cars, the  $\text{NO}_x$  decreases even more. The relative decrease over western and southern Europe and urban areas in eastern Europe is of 30–50 %;

the absolute decrease is up to 3 ppb in polluted areas and up to 5 ppb in most polluted urban centers. In this scenario, only few cities in Europe still have average  $\text{NO}_x$  mole fractions of more than 10 ppb. The highest  $\text{NO}_x$  regions are now over sea, along the ship tracks in Mediterranean, English Channel and the North Sea. Transported emissions from ships become in this case one of the significant sources of pollution in the coastal areas in Benelux and UK.

Average ground  $\text{O}_3$  is shown in Fig. 6 for the H2\_50\_01 and H2\_100\_01 scenarios, together with the differences between these and the CLE2020 scenario. Converting 50% of cars to  $H_2$  cars in the H2\_50\_01 scenario has a small influence on  $\text{O}_3$  (compared to CLE2020): background  $\text{O}_3$  in south and south-east Europe decreases by 0.2–0.3 %, while in polluted areas it increases by up to 4%. For the H2\_100\_01 scenario the changes are larger: background  $\text{O}_3$  decreases by 1–2%, while in polluted areas  $\text{O}_3$  increases by up to 10%. These changes are qualitatively similar to the ones between the CLE2020 and NOW scenarios: in polluted areas, where  $\text{NO}_x$  decreased the most,  $\text{O}_3$  increases towards the continental background due to less chemical consumption; in background areas  $\text{O}_3$  decreases due to less precursor emissions. In absolute values, the  $\text{O}_3$  never increases in polluted areas above the continental background. This relative increase in  $\text{O}_3$  in western European polluted regions is a well-known feature, and it has been shown that decreasing precursor emissions does not always lead to a decrease in  $\text{O}_3$  population exposure in urban areas (e.g. Colette et al., 2011). The behavior of  $\text{O}_3$  for all scenarios is analyzed in more detail in Section 3.5.

OH (Fig. 7) has a behavior similar to the one of  $\text{O}_3$ . In the polluted areas in western Europe, the OH mole fraction recovers towards the regional background (increased production from  $\text{O}_3$ , and decreased consumption by  $\text{NO}_x$  and CO); the largest changes,

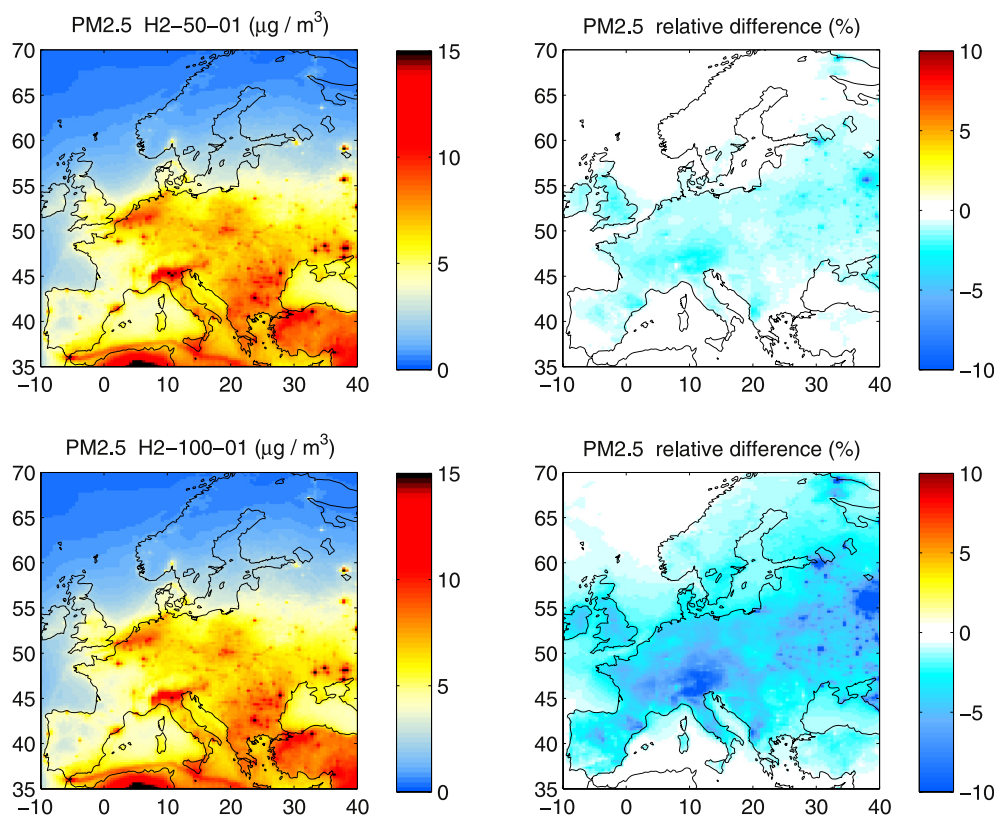
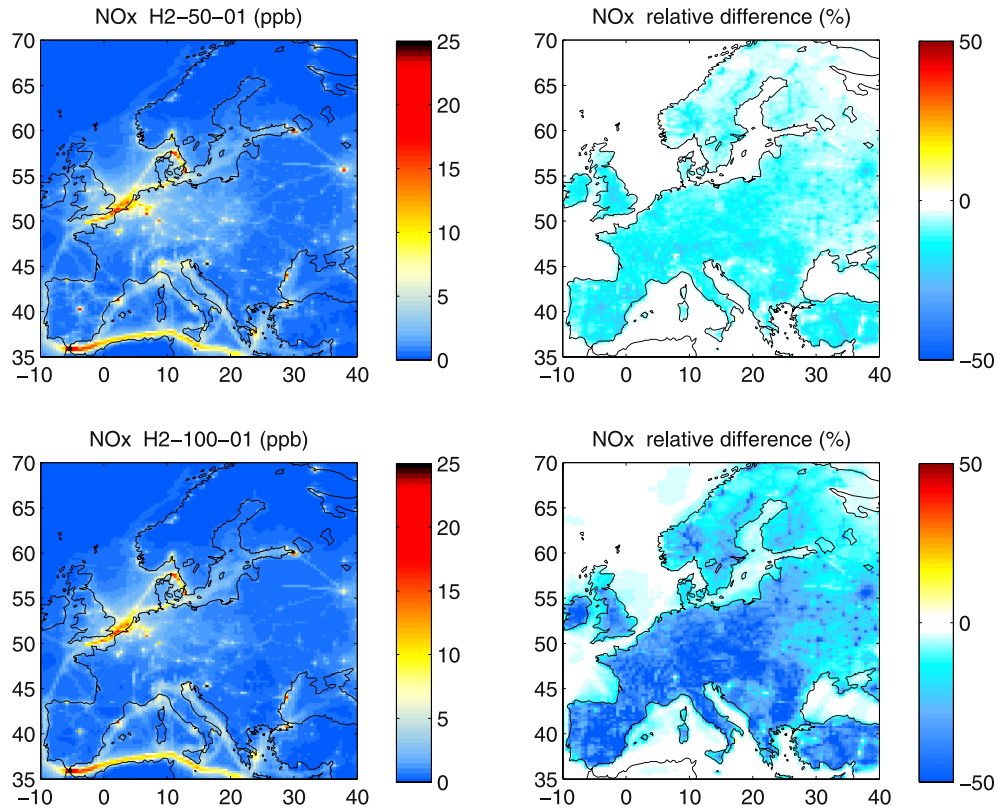
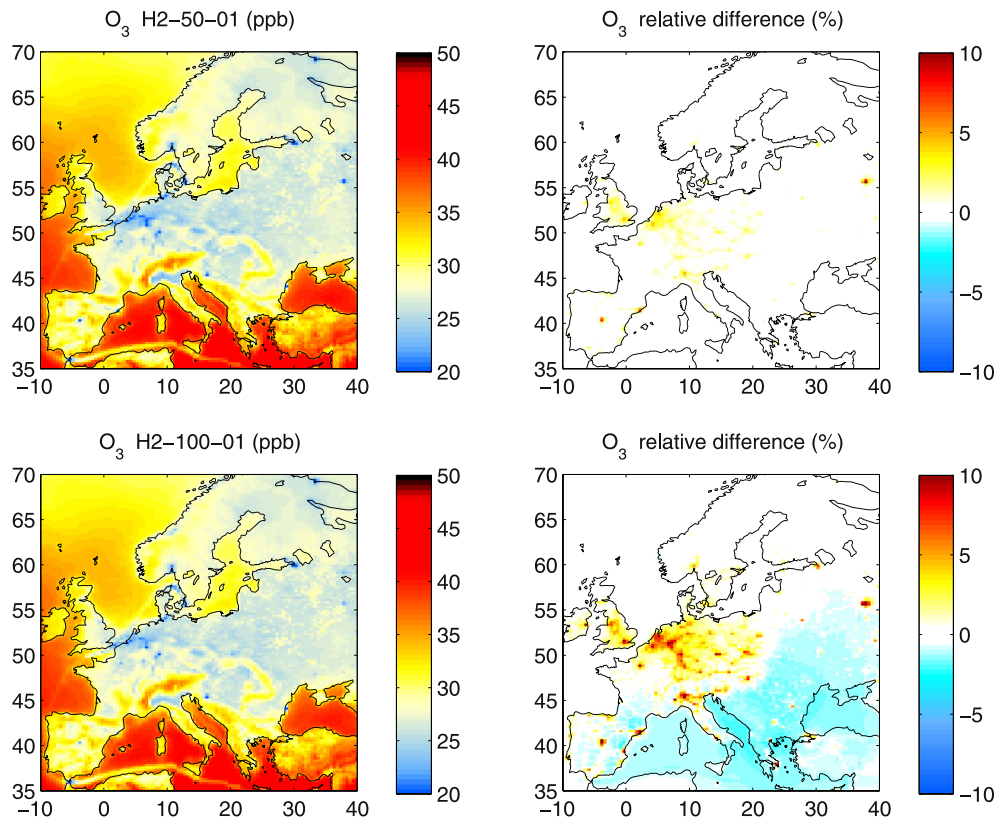


Fig. 4. PM 2.5 concentrations for the simulations with 50% (H2\_50\_01) and 100% (H2\_100\_01)  $H_2$  cars (left panels), and the relative differences between these and the CLE2020 simulation (right panels). The figure shows annual means at ground level. Note that the color scales are different between left and right panels. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article).

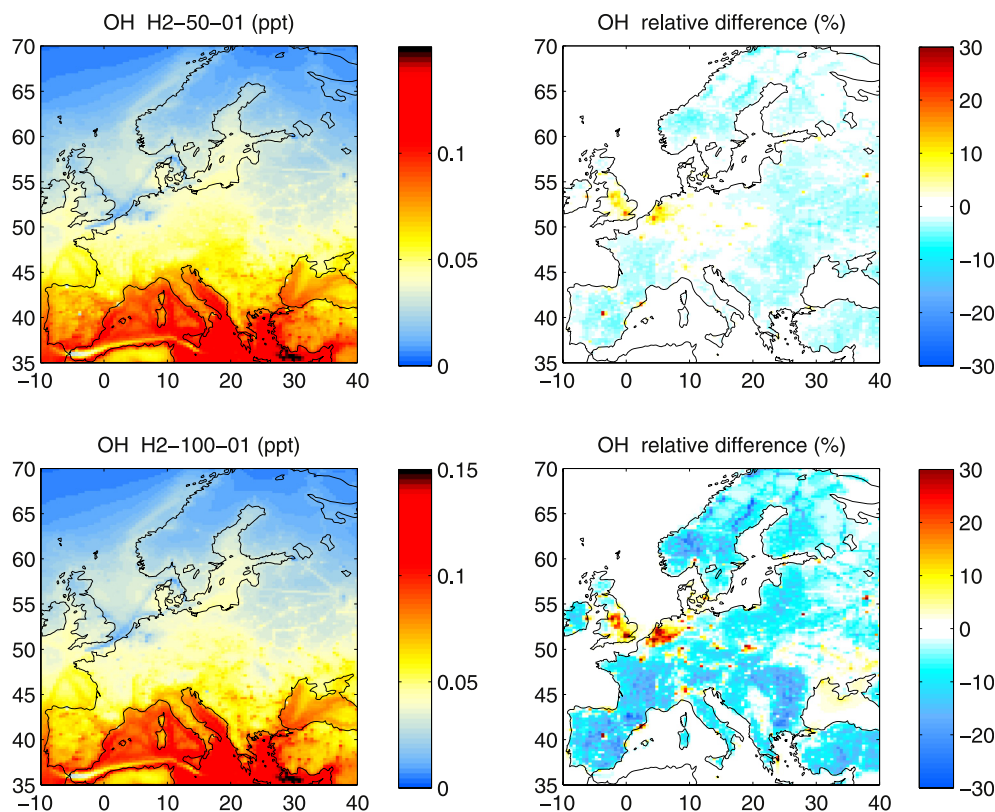


**Fig. 5.** NO<sub>x</sub> mole fractions for the simulations with 50% (H2\_50\_01) and 100% (H2\_100\_01) H<sub>2</sub> cars (left panels), and the relative difference between these and the CLE2020 simulation (right panels). The figure shows annual means at ground level. Note that the color scales are different between left and right panels. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)



**Fig. 6.** O<sub>3</sub> mole fractions for the simulations with 50% (H2\_50\_01) and 100% (H2\_100\_01) H<sub>2</sub> cars (left panels), and the relative difference between these and the CLE2020 simulation (right panels). The figure shows annual means at ground level. Note that the color scales are different between left and right panels. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)





**Fig. 7.** OH mole fractions for the simulations with 50% (H2\_50\_01) and 100% (H2\_100\_01) H<sub>2</sub> cars (left panels), and the relative difference between these and the CLE2020 simulation (right panels). The figure shows annual means at ground level. Note that the color scales are different between left and right panels. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.).

of up to 10% in the H2\_50\_01 scenario and 30% in the H2\_100\_01 scenario, are in Benelux and the UK. The background OH decreases over land areas by up to 5% in H2\_50\_01 and up to 20% in H2\_100\_01. This decrease is the net effect of decreased production from O<sub>3</sub> and decreased consumption by NO<sub>x</sub> and CO. The absolute OH decrease is much larger in southern than in northern Europe.

### 3.5. O<sub>3</sub> detailed analysis

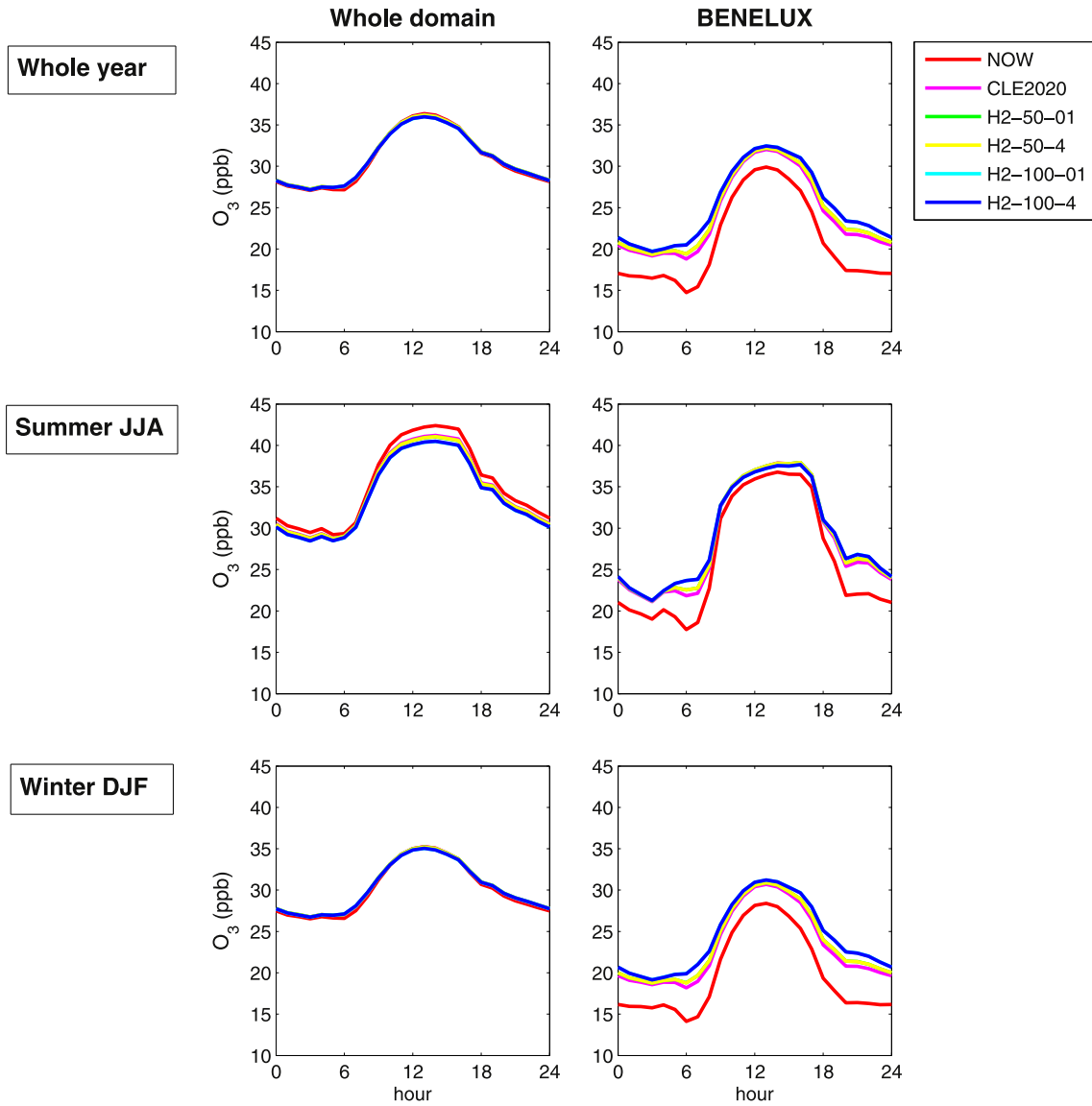
As already shown, O<sub>3</sub> behaves differently than the other pollutants, because of the complex chemistry controlling its mole fractions. In our simulations, the annual average of O<sub>3</sub> over the whole model domain did not change significantly in the future scenarios compared to present. However, when looking at smaller spatial scale, there are patterns that may seem contradictory: in polluted areas (e.g. Benelux and UK) the O<sub>3</sub> increased for the future (cleaner) scenarios, while the background O<sub>3</sub> decreased slightly.

O<sub>3</sub> mole fractions are highly variable in time, being higher during day than during night, and higher in summer than in winter. The damaging effects on human health and ecosystem are mainly related to the high summer day-time mole fractions. Fig. 8 shows the average diurnal variation in O<sub>3</sub> for the whole year, and the summer and winter months separately; the separate panels show averages over the whole model domain, and over the polluted area of Benelux, separately. Although the whole-domain, whole-year diurnal cycle does not change between the scenarios, in the summer diurnal cycle a small decrease for the future scenarios (compared to the present) is evident; this decrease is largest during the day-time maximum. When looking separately at the Benelux area (where the annual average O<sub>3</sub> increased significantly for the

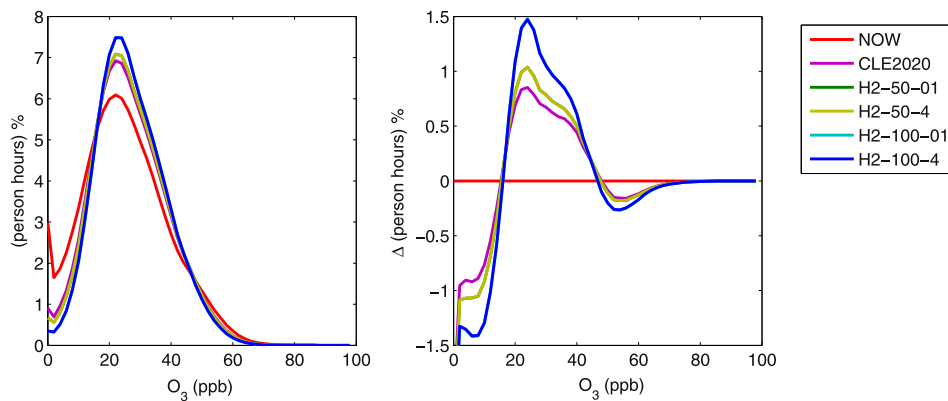
future scenarios), we see that the increase is larger during night time and during winter, thus when the mole fractions are lowest. That means that the O<sub>3</sub> maxima increase less than the mean mole fractions. Also, it is evident from this figure that the O<sub>3</sub> maxima in the polluted areas (where the O<sub>3</sub> annual average increased) are still well below the background.

Fig. 9 shows the proportion of the population in our model domain that is exposed to different levels of O<sub>3</sub>. Plot 9a shows the scaled person hours (that is, scaled to the total number of persons in our domain and to the total number of hours in our simulation) for each level of O<sub>3</sub>, for each scenario, calculated over 1 year using hourly data; plot 9b shows, for the same data, the differences between the future scenarios and the present. The O<sub>3</sub> values (x-axis) were binned in 2-ppb intervals. We used population count distribution for the year 1995 based on the Gridded Population of the World, Version 2 (GPWv2, 2000). This figure shows that the exposure of the population to medium levels of O<sub>3</sub> (approx. 20–45 ppb) increases in the future scenarios, while the exposure to high levels of O<sub>3</sub> (>45 ppb) decreases; the exposure to very low levels of O<sub>3</sub> decreases as well. Also, there are significant differences between the future scenarios – the decrease in exposure to high levels of O<sub>3</sub> (and the increase in exposure to medium O<sub>3</sub>) is larger for the H<sub>2</sub>-vehicle scenarios. The picture is qualitatively similar when looking separately at the Benelux area (Fig S1 in the Supplementary material). For this area, however, the increase in exposure to medium levels of O<sub>3</sub> is larger, while the decrease in exposure to high levels of O<sub>3</sub> is much smaller than over the whole model domain.

We made a similar comparison for the 8-hr running mean daily maxima of O<sub>3</sub> calculated following the procedure used for assessing population exposure (EU, 2008). The results are presented in the



**Fig. 8.** Average diurnal cycles of  $O_3$ , from top to bottom: whole year, summer (Jun–Aug), and winter (Dec–Feb). The left plots show diurnal cycles over the whole LE domain. For the middle and right plots, two highly polluted regions in western Europe were selected, one in Benelux (lon 4 ... 10 °W, lat 50 ... 52.5 °N) and one in UK (lon -3 ... 1 °W, lat 51 ... 54 °N).



**Fig. 9.** Population exposed to different levels of  $O_3$  for the different scenarios, for the whole LOTOS-EUROS domain. (left) Person hours versus  $O_3$  level for the whole year, scaled by the total population in the domain and the total number of hours, and expressed in %. (right) Differences in person hours (%) between each scenario and the NOW scenario. Note that the y-values depend on the  $O_3$  bin size; the  $O_3$  bins used here are 2 ppb.

**Supplementary material**, for the whole model domain, and separately for Benelux area (Fig. S2). The general picture for the whole domain is similar to the one based on 1-hr data: the number of person days exposed to high (>45 ppb) O<sub>3</sub> 8-hr maxima decreases, while the exposure to medium levels of O<sub>3</sub> increases. The number of person days that exceed the European and WHO limits (60 ppb (EU, 2008), and 50 ppb (WHO, 2006), respectively) is lower in the future scenarios compared to the present, and again lower in the H<sub>2</sub>-vehicle scenarios compared to CLE2020. Although the tendency is similar for the polluted Benelux area, the decrease in population exposure to high levels of O<sub>3</sub> is very small here, while the increase in the population exposure to medium levels of O<sub>3</sub> is relatively large. Note, however, that the overall O<sub>3</sub> mole fractions are smaller in this area than for the whole model domain average, and there are much fewer occurrences of daily maximum 8-hr averages above 60 ppb to begin with.

In summary, the observed increases in the annual average O<sub>3</sub> for the future scenarios mainly arise from increases during low O<sub>3</sub> levels; the overall population exposure to high O<sub>3</sub> levels, both in terms of hourly averages and of daily maximum 8-hr means, decreases significantly (over the whole domain) or does not change much (in Benelux); and the population exposure to medium level O<sub>3</sub> increases.

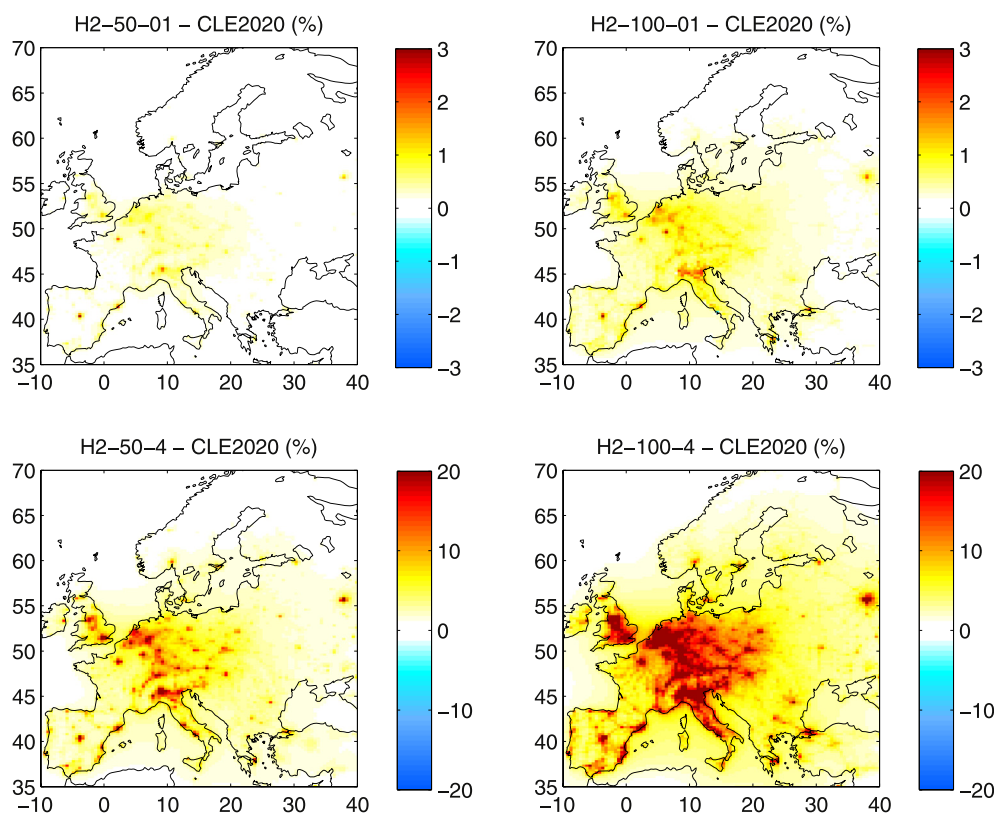
### 3.6. Influence of the H<sub>2</sub> leak rate

In this section we compare the scenarios with low H<sub>2</sub> leak rate (0.1% H<sub>2</sub> leak, scenarios H2\_50\_01 and H2\_100\_01) with the scenarios with high H<sub>2</sub> leak rate (4% H<sub>2</sub> leak, scenarios H2\_50\_4 and H2\_100\_4) for estimating the influence of the additional H<sub>2</sub>

emissions on the atmospheric composition.

Fig. 10 shows the relative differences in annual average ground level H<sub>2</sub> between the four scenarios including H<sub>2</sub> cars and the CLE2020 scenario. The atmospheric mole fraction of H<sub>2</sub> increases in all scenarios including H<sub>2</sub> cars, relative to the CLE2020 scenario. In the low leakage scenarios, however, anthropogenic emissions of H<sub>2</sub> are lower than today (NOW), and atmospheric levels of H<sub>2</sub> are slightly lower than today as well (not shown in figure). In the high leakage scenarios, ground level atmospheric H<sub>2</sub> averaged over the model domain increases by approx. 5% in H2\_50\_4 and 10% in H2\_100\_4 compared to CLE2020. The increase is largest in high road density areas; here the H<sub>2</sub> can increase locally by up to 20% in H2\_50\_4 and by 50% in H2\_100\_4. It should be noted that, as H<sub>2</sub> is a long lived species and in our simulation the lateral and top boundaries are fixed, this result is likely an underestimation of the potential increase in atmospheric H<sub>2</sub> over Europe.

For the 100% H<sub>2</sub> cars scenarios, the difference between 4% and 0.1% H<sub>2</sub> leak rates leads to a decrease in OH of up to 1% (Fig. 11). The associated increase in NO<sub>x</sub> is of up to 1% and the effect on the other species is much smaller. There is no noticeable effect on CH<sub>4</sub> – which is expected, since CH<sub>4</sub> has a lifetime of 9 years, and its residence time within our domain is only several days. Thus, the H<sub>2</sub> added into the atmosphere can lead to small increases in some pollutants (e.g. NO<sub>x</sub>), but the effect is much smaller than the decrease in pollution due to the decrease in pollutant and precursor emissions in H<sub>2</sub> scenarios compared to CLE2020. Note that this estimate only refers to the influence of H<sub>2</sub> on other species within our limited domain; the global influences cannot be assessed from our study.



**Fig. 10.** Relative differences in H<sub>2</sub> mole fractions between the scenarios including H<sub>2</sub> cars (H2\_50\_01, H2\_50\_4, H2\_100\_01 and H2\_100\_4) and the CLE2020 scenario. The plots show annual averages of ground level mole fractions. Note the difference between color scales. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

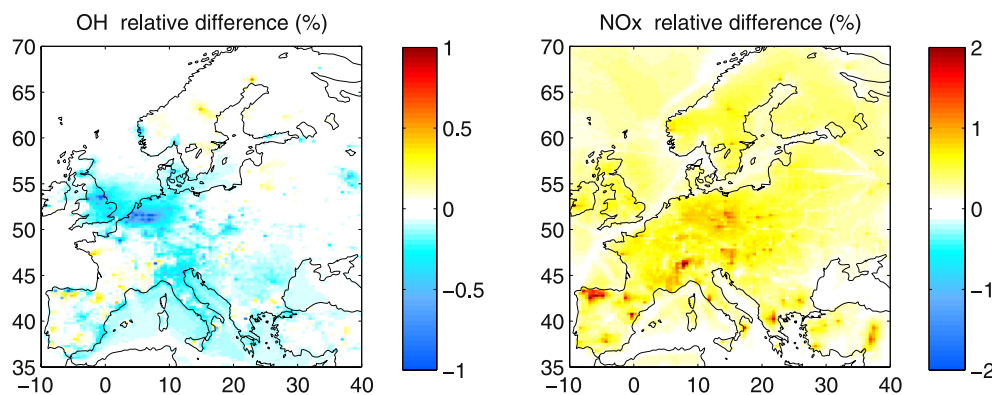


Fig. 11. Influence of the H<sub>2</sub> leak rate on OH and NO<sub>x</sub>. The figure shows the relative differences between the high and low leak scenarios H2\_100\_4 and H2\_100\_01.

#### 4. Discussion and conclusions

We simulated the future air quality in Europe, replacing part of or all traditionally-fuelled vehicles by H<sub>2</sub> vehicles (fuel cell), and taking into account the present and planned European legislation.

In general, our simulations show that the air quality will improve in the future in the CLE2020 scenario, and further (smaller) improvements will occur if land transportation will be converted to H<sub>2</sub>. As expected, the largest improvements in air quality occur in and around urban centers, where the influence on human health is large.

One important aspect of our study is that in our reference scenario (CLE2020), the future atmosphere is much cleaner than the present one, even without H<sub>2</sub> cars. This is because Europe has current and planned regulations much stricter than most of the world, and we assume these will be all successfully implemented. Because of this already clean future atmosphere, the additional improvement brought by the H<sub>2</sub> vehicles is relatively small. This is the major difference between our work and the previous studies on the effect on air quality of a H<sub>2</sub>-based economy (Jacobson, 2008; Jacobson et al., 2005; Schultz et al., 2003; Wang et al., 2013a; Warwick et al., 2004). All these previous works compared a highly polluted “baseline” situation with a clean H<sub>2</sub> scenario, and found dramatic improvements in air quality when (part of) the economy or transportation is converted to H<sub>2</sub>.

Our study is the second after Wang et al. (2013a) to place the simulations in the future. Wang et al. performed global simulations, with a higher resolution focus area over the US territory. Their baseline emission scenarios are based on the IPCC-SRES growth scenarios A1F1 and B1 (Nakicenovic et al., 2000), combined with present-day fossil fuel burning emission factors. The simulations using these baseline scenarios predict significantly increased air pollution in 2050 compared to present, which is in contrast to our baseline being the relatively clean CLE2020 scenario. Therefore, in their simulation, the air quality then improves significantly, compared to the highly polluted future baseline, when switching all the road traffic to H<sub>2</sub>.

The differences discussed above reflect the much stricter European traffic emission regulations, both present and future, compared to the rest of the world. However, these are based on existing and planned regulations, and not on existing technology. In practice, complying with stricter emission limits becomes gradually more difficult from a technological point of view. Our results show that H<sub>2</sub> vehicles could be, in fact, part of the solution to fulfill the future European low emission requirements.

Among all pollutants considered, particulate matter has the largest effects on human health. There is a clear quantitative

relationship between PM exposure and increased mortality and morbidity, and no threshold has been identified below which no damage to health is observed (e.g. Hoek et al., 2013; Pope et al., 2002; WHO, 2006). In Europe, outdoor exposure to fine PM leads to about 100 000 deaths and 725 000 years of life lost annually (WHO, 2002). Assuming a linear relationship between the PM<sub>2.5</sub> levels and mortality, the decrease in PM<sub>2.5</sub> of about 20% between the NOW and CLE2020 simulations (Section 3.3) would lead to a decrease of 20% in the PM<sub>2.5</sub> related mortality, thus to about 20 000 deaths avoided annually in Europe.

While most pollutants decrease with the decrease in emissions, ground level O<sub>3</sub> behaves differently, due to the complex atmospheric chemistry controlling its mole fractions. At present, a high NO<sub>x</sub> region exists in western Europe, roughly covering Benelux and the south-eastern part of the UK, where O<sub>3</sub> is on average lower than the continental background, due to titration by NO. Here, O<sub>3</sub> production is in the VOC limited regime, and increases with the decrease in NO<sub>x</sub> emissions, as seen in our future simulations. The annual average O<sub>3</sub> increases in this region in the future scenarios; the increase in O<sub>3</sub> in this region is however largest under low-O<sub>3</sub> conditions (night and winter). Despite this increase in average O<sub>3</sub> mole fractions, the population exposure to very high day-time ozone mole fraction decreases over the entirety of Europe. Nevertheless, the O<sub>3</sub> situation in Benelux highlights the importance of controlling VOC emissions, in particular in this area.

In the present scenario (NOW), traffic emissions account for an important fraction of total emissions. In the CLE2020 scenario (without H<sub>2</sub> cars), traffic emissions decrease significantly, and much more than the emissions from other categories; the consequence is that traffic emissions become a much smaller contributor to the total. As shown in this paper, H<sub>2</sub> cars still reduce emissions and atmospheric mole fractions further. However, the other emission categories become proportionally more important and, for further improvements in air quality, stricter regulations on emissions from non-road traffic sectors (e.g. sea traffic) are necessary, and possibly more effective.

For example, while for most categories the emissions decrease in the future, shipping emissions increase in all future scenarios compared to the present, and their relative contribution to pollution increases even more as road traffic emissions decrease. That is because shipping emission regulations are currently quite lenient. The pollution from ships is also transported towards coastal regions and affects densely populated regions in Benelux and UK. This is thus an issue that still needs and can be improved by setting stricter emission regulations.

One other important result of this work is related to the additional H<sub>2</sub> released into the atmosphere through leakage. Although

the reaction of this additional H<sub>2</sub> with OH leads to small increases in several pollutants, the effect is small compared to the decrease in pollutants that comes with the decreases in pollutant emissions. Because of this, the results of our study can be considered as representative for the effect on air quality of any other low emission technology. The high leakage scenarios lead however to considerable increases in atmospheric H<sub>2</sub>; moreover, this increase is likely underestimated in our simulations because of fixed lateral and top boundaries. The increased atmospheric H<sub>2</sub> can have effects on the global atmosphere that cannot be estimated with our modeling setup.

The main sources of uncertainty in our results are due to (1) model errors and (2) uncertainties in emissions. Uncertainties in model simulations could arise from lack or insufficient parameterization of physical processes, finite resolutions, limited input data, etc. The model performance is therefore continuously verified by comparison with observations (Section 2.1). Note that the impact of model uncertainties is limited by focusing on yearly average concentrations as the end-result: while hourly concentrations can differ substantially from observations, the yearly average is much more accurate. However, since we use the same model setup and meteorology for all the simulations, the uncertainties of the relative differences reported are mainly driven by the uncertainties in emissions. For O<sub>3</sub> and NO<sub>x</sub>, additional uncertainties are related to the ability of the model to simulate the nonlinear chemistry of these species, and are difficult to estimate. The emission data include uncertainties in activity data (5–10% for the present emissions, EMEP/EEA, 2013) and in emission factors (up to 20%, EMEP/EEA, 2009). The future emissions depend on economic growth, penetration of new technologies and many other autonomous developments that are difficult to predict with certainty. These uncertainties in emissions will have less impact on the relative differences between scenarios than on each simulation; also, the differences between future scenarios will be less affected by uncertainties (since they share the same activity data) than the differences between present and future scenarios.

In general, the fixed boundary conditions in our simulations are expected to lead to an underestimation of the differences between scenarios. This effect will be larger for the longer lived species like H<sub>2</sub> and CO. Thus in reality, the effects of changing the emissions could be slightly larger, and they will depend on what happens in the rest of the world.

Because of the larger potential uncertainties in the individual simulations, we did not focus on comparisons with air quality limits. Instead, we focused on the relative differences between the different simulations, which are much less affected by model errors.

Like the previous studies regarding the possible future H<sub>2</sub> economy, our study does not account for the effects of future climate change on e.g. emissions, atmospheric chemistry or soil deposition. The possible effects of climate change on air quality are complex: for example, it is generally predicted that a warmer climate could lead to a slight increase in pollution levels, while an increase in precipitation can lead to pollution decrease (e.g. Colette et al., 2013; Fiore et al., 2012; Isaksen et al., 2009; Jacob and Winner, 2009). Model studies have shown that the climate impact on future air quality is in general much smaller than the impact of change in emissions. However, Hedegaard et al. (2013) found that in the Benelux area, climate change could have more influence on ground level ozone than the changes in ozone precursors, and would lead to an additional increase in O<sub>3</sub>. In this case the increases in O<sub>3</sub> could be significantly larger than our estimates. Regarding our comparison between scenarios with and without H<sub>2</sub> cars, a warmer climate would affect all future simulations, and the resulting effect of climate on the relative differences between scenarios would likely be smaller than the absolute effect on each individual scenario.

In summary, we have shown that (1) air quality in Europe improves in the future, if we assume that current and planned legislation is successful; (2) air quality improves further with the introduction of H<sub>2</sub> vehicles, thus H<sub>2</sub> vehicles may be an effective pathway to fulfil the strict future EU air quality regulations; (3) with the decrease in traffic emissions, other emission categories become more important and will have to be better regulated; (4) the additional H<sub>2</sub> from leakages does not significantly affect the air quality in Europe, as long as the leak rate is kept below 4%.

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## Appendix A. Supplementary data

Supplementary data related to this article can be found at <http://dx.doi.org/10.1016/j.atmosenv.2015.03.022>.

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