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## Legal but lethal

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# Legal but lethal: Lessons from NO<sub>2</sub> related mortality in a city compliant with EU limit value

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#### ABSTRACT

Research has indicated that the legal maximum annual-average concentration of nitrogen dioxide (NO<sub>2</sub>) for safe long-term exposure in the European Union and United Kingdom (40  $\mu$ g/m<sub>3</sub>) may not offer adequate protection and that a lower value may be needed. At the same time concerns have been raised in the UK about government methods to assess NO2 for the purposes of compliance with the legal limit. It is suggested that the national assessment underestimates levels of the pollutant and that local authority assessments, which in several cases find higher NO<sub>2</sub> levels, are a more accurate reflection of pollution. This research used Brighton and Hove – which is deemed compliant with NO2 limits by the national assessment - as a case study to inform these debates. Using local authority pollution data, the research found that: up to 15.9% (95% CI 9.4% – 21.9%) of mortality in the examined area, which approximately corresponds to central Brighton, can be attributed to long-term exposure to 2016 levels of NO2; up to 13.9% (95% CI 8.2% -19.2%) of mortality in this area can be attributed to legal concentrations of the annual-average limit; and up to 3% of mortality in the area examined can be attributed to the portion of 2016 concentrations above the 40 µgNO<sub>2</sub>/m<sub>3</sub> annual average limit. These results suggest the current EU and UK limit value for long-term exposure to NO<sub>2</sub> may not be adequate to protect public health. The findings also indicate the UK government assessment does not identify all the local NO<sub>2</sub> hotspots that are contributing to premature deaths.

Keywords: air quality policy, air quality assessment, NO2, health burden, mortality

- 1 1. Introduction
- 2

Outdoor air pollution poses the biggest environmental risk to public health (WHO, 2016), with 3 particulate matter (PM) responsible for 412,000 deaths a year in the European Union (EU) and 4 Nitrogen Dioxide (NO<sub>2</sub>) 71,000 deaths (EEA, 2019). In the UK, PM is thought to cause 29,000 5 deaths a year and NO<sub>2</sub>, 11,000 deaths (RCP, 2016). Despite the larger health burden associated 6 with PM however, NO<sub>2</sub> has assumed more significance from the point of view of UK policy 7 makers and campaigners (COMEAP, 2014). This is because the UK is compliant with the legal 8 concentrations for PM but in breach of the legal limit for long-term exposure to NO2 9 (COMEAP, 2014; Defra, 2017). 10 Long-term exposure to NO<sub>2</sub> has been associated with increased rates of morbidity and 11

with increased rates of mortality (COMEAP, 2014, 2015a; WHO, 2013b). This increased morbidity and mortality principally relates to the exacerbation of chronic respiratory and cardiovascular disease (Beelen et al., 2008; Cesaroni et al., 2013; COMEAP, 2014; Hoek et al., 2013; Lipsett et al., 2011; Schultz et al., 2012; US EPA, 2016; Zhang et al., 2011).

Under both European Union (EU) and UK law the maximum permissible annual-16 average concentration for NO<sub>2</sub> is 40 µg/m<sub>3</sub>. This limit reflects the World Health Organisation's 17 (WHO) estimation of the maximum annual-average NO<sub>2</sub> concentration for safe long-term 18 exposure (WHO, 2018). However, doubt exists about whether this limit does protect the public 19 as research has failed to establish a clear threshold below which exposure does not have 20 negative health effects (COMEAP, 2015a). The 40 µgNO<sub>2</sub>/m<sub>3</sub> guideline maximum level for 21 long-term outdoor exposure was put forward by WHO in 1997 on the basis that children had 22 exhibited respiratory illness when exposed to annual-average indoor concentrations of 38-56 23 µgNO<sub>2</sub>/m<sub>3</sub> (Graham et al., 1997). It was noted that the limit would not provide a margin of 24 safety, but would protect children from the most severe outdoor concentrations (Graham et al., 25 1997). Since the guideline was issued, adverse health effects at concentrations below 40 26 µgNO<sub>2</sub>/m<sub>3</sub> have been demonstrated and a 2013 WHO review of the evidence said recent 27 research may result in lower guideline values (WHO, 2013a). 28

For the purpose of compliance with the  $40NO_2 \mu g/m_3$  limit value in the UK, annual nationwide assessments of NO<sub>2</sub> concentrations are undertaken by the Department for Environment, Food and Rural Affairs (Defra). Monitoring is performed using a network of Automatic Urban and Rural Network (AURN) measurement stations which record direct measurements of NO<sub>2</sub> concentrations across the UK. This is supplemented with modelling to

- estimate background concentrations at 1km2 resolution and concentrations at the sides of major
  urban roads, defined as motorways and major A-roads (Defra, 2017).
- Because of the scale at which the monitoring and modelling are undertaken, Defra has been criticised for not adequately identifying local pollution hotspots. The number of AURN monitors in the national monitoring network – 157 – has been described as "insufficient" for flagging up all exceedances of the limit value (Barnes et al., 2018). Similarly, the modelling is performed at too coarse a scale to accurately capture concentrations in urban areas or at the sides of locally-managed roads where people live (Barnes et al., 2018).
- Separate to the national assessment, local authorities are legally required to conduct 42 their own air quality assessments (Defra, 2018a; Environment Food and Rural Affairs 43 Committee et al., 2018). It has been argued that these assessments, using direct measurements 44 from a relatively dense network of monitoring sites, provide a more accurate reflection of 45 exceedances in areas of exposure (Barnes et al., 2018). A joint report on air quality by four 46 47 House of Commons' select committees concluded that "direct measurement of air pollution [by local authorities] is much more accurate than estimation and modelling is likely to be", 48 (Environment Food and Rural Affairs Committee et al., 2018). Local authorities themselves 49 have criticised the disparity between local data and Defra's assessment, saying that, as a result, 50 action to tackle NO2 will not be "effective or proportionate" (Environment Food and Rural 51 52 Affairs Committee et al., 2018).
- The difference in the methodology used by the Defra assessments and the local authorities' own assessment means that Defra has declared some local authority areas compliant whereas the council itself has found significant exceedances of the limit value (Defra, 2019, 2018b; Preston City Council, 2018). Brighton and Hove, a local authority in the south east of England, is one such authority.
- Brighton and Hove is one of six "reporting zones" set up for the purposes of assessing
  compliance, that has been declared by Defra to be within the annual mean limit (Defra, 2017).
  However, the council's own monitoring consisting of 65 roadside monitors has recorded
  significant exceedances of the annual-mean limit, with 10 monitors averaging over 50
  µgNO<sub>2</sub>/m<sub>3</sub> a year and one recording an average above 100 µg NO<sub>2</sub>/m<sub>3</sub> a year (Brighton and
  Hove City Council, 2017).
- Local politicians and civil servants reject the Defra assessment and point to the fact that only two AURN monitoring stations are within the Brighton and Hove reporting zone (personal communication, April 4th, 2018). Of these, one is in Worthing, outside the local authority area, and the other is situated in a public park 190 metres from the nearest road (Defra, 2019). There

In view of these considerations, the research set out to quantify the health burden of 72 long-term exposure to levels of NO<sub>2</sub> pollution in Brighton and Hove as reported in local data. 73 If it could be demonstrated there is a significant health burden from NO<sub>2</sub> exposure, it would 74 add weight to arguments that the national assessment methodology needs to be altered to 75 properly reflect NO<sub>2</sub> pollution in Brighton and Hove, and elsewhere in the UK. Furthermore, 76 the research attempted establish the health burden of long-term exposure to legal annual-77 average NO2 concentrations in Brighton and Hove. This allowed the research to inform the on-78 going debate about the adequacy of the current maximum limit value. Lastly the research 79 assessed the health burden of the portion of NO<sub>2</sub> concentrations above the legal limit 80 (exceedances). This can be considered the human cost of the status quo in which efforts are not 81 being made at the national level to make Brighton compliant with the legal limit. 82

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#### 85 2. Materials and methods

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The methodological approach broadly followed a cross-sectional technique established by the Committee on the Medical Effects of Air Pollutants (COMEAP) (COMEAP, 2010; COMEAP, 2012), which uses Concentration Response Functions (CRFs) and existing population, pollution and mortality data.

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#### 92 2.1 Population-weighted annual-average concentration

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The COMEAP method requires a population-weighted annual-average concentration to be calculated for the area being studied. This is a metric that reflects the proportions of people within the studied population that are exposed to the different levels of pollution present (COMEAP, 2012; Gowers et al., 2014).

To do this it was necessary to map population and pollution data in a grid over the area of interest, such that each square in the grid had a discrete value for population and annualaverage NO<sub>2</sub> concentration. Gridded population data, at 10m<sub>2</sub> resolution, was taken from a data set in which Office of National Statistics 2011 census headcounts were redistributed to
 residential buildings across the UK (Murdock et al., 2015).

Gridded pollution data was generated by taking local authority reports of the 2016 NO2 103 annual-average concentrations at 65 monitoring sites and using the GIS software QGIS to make 104 a spatial interpolation calculation. The method of spatial interpolation used was Inverse 105 Distance Weighting (IDW). This method uses a formula to estimate the values of unknown 106 data points by averaging the values of the surrounding known data points after weighting them 107 according to their distance from the unknown point (Ramos et al., 2016). It has been used 108 widely in studies examining air quality and the health burden of pollution (Beelen et al., 2007; 109 Bell, 2006; Hoek et al., 2002; Hubbell et al., 2005; Jerrett et al., 2013; Kim et al., 2014; Lipsett 110 et al., 2011; Marshall et al., 2008; Pereira et al., 2016; Ramos et al., 2016; Salam et al., 2005; 111 112 Shukla et al., 2020; Wong et al., 2004; Wu et al., 2006).

The location of the council's NO<sub>2</sub> pollution monitors were overlaid on Ordnance 113 Survey (OS) maps in the GIS software using OS coordinates. Gridded interpolated pollution 114 data was then generated for the whole of the local authority area at 100m2 resolution. Gridded 115 116 pollution data has been estimated at various different spatial resolutions for the purposes of calculating health burdens - from 20m2 (Walton et al., 2015) to 10km2 (Al-Hamdan et al., 117 2009). It was considered that pollution data at 100m2 resolution would capture some of the 118 spatial variation of NO<sub>2</sub> concentrations, which is known to vary at small spatial scales (Jerrett 119 et al., 2005), while still having a manageable number of pollution values. A basic cross-120 validation of the interpolated data was carried out using the leave one out method. A subset of 121 five monitors was taken from the centre of the data map and the IDW interpolation performed 122 five times, excluding one monitor each time. A comparison of the known and predicted values 123 at the monitor sites showed the root mean squared error of the predicted values to be 3.5. The 124 range of the pollution values generated by the IDW interpolation was 18.1 µgNO<sub>2</sub>/m<sub>3</sub> to 63.3 125  $\mu$ gNO<sub>2</sub>/m<sub>3</sub>. 126

After generating gridded pollution data, the boundary of the area being examined was 127 determined by considering the data quality. Robust modelling of pollution using spatial 128 interpolation requires a reasonably dense network of sampling sites (Jerrett et al., 2005; Wong 129 et al., 2004). In Brighton and Hove, the monitoring stations are largely clustered in the city 130 centre, while much of the rest of the local authority area is several kilometres from a monitoring 131 station. Because of concerns about the reliability of interpolated data based on relatively distant 132 monitoring values, it was decided to only assess the health burden of NO2 exposure within the 133 city centre. 134

The area studied was determined precisely by establishing radii of 500m around each 135 of the central cluster of monitoring stations and including interpolated data squares which were 136 wholly or partly within these radii. Previous efforts to map urban pollution have established 137 radii around known data points (recorded by monitoring stations) and only attempted to map 138 pollution within these radii, which range from as little as 100m (Brauer et al., 2008) to as much 139 as 100km (Pereira et al., 2016). Given that NO2 varies over small spatial scales, it was 140 considered that 500m radii struck a balance between accuracy (i.e. only including interpolated 141 data based on relatively close monitoring stations) and ensuring a meaningful proportion of the 142 city's population fell within the examined area. 143

The examined area (Fig. 1) – which can be loosely described as central Brighton –
was 3.87 km<sup>2</sup> and the examined population within this area was 44,553.



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**Fig. 1.** The examined area, showing central cluster of local authority monitors (red dots), with 500m radii around them. The red line encompasses all 100m<sup>2</sup> pollution value squares partly or wholly within the radii.

The population-weighted annual-average concentration was calculated for this area by first aligning the gridded population and pollution data in the GIS software using OS coordinates. The population and pollution values in each 100m2 square were then multiplied and the resulting values added together and divided by the total population in the examined area.

- 155
- 156 2.2 Cut-offs

158 Cut-offs refer to a threshold in a NO<sub>2</sub> concentration. They are used to ensure that only 159 concentrations considered to have negative health effects are included in health burden 160 calculations, with values below the cut-off discounted. However, because it is unclear whether 161 there is a threshold below which exposure to NO<sub>2</sub> does not have negative health effects 162 (COMEAP, 2015a), COMEAP's and WHO's advice regarding cut-offs differs.

- WHO recommends using 20  $\mu$ gNO<sub>2</sub>/m<sub>3</sub> as the cut off (WHO, 2013b), while COMEAP recommends using no cut-off, and also using the lowest concentration reported in the studies analysed to derive the coefficient as the cut off (1.5  $\mu$ gNO<sub>2</sub>/m<sub>3</sub>) (COMEAP, 2015b).
- 166 It was decided to use all three approaches, which meant calculating three different 167 population-weighted annual-average concentrations:
- 1681.No cut-off. The population-weighted annual-average concentration was calculated169as above, using all of each 100m2 pollution value.
- 1.5 μgNO<sub>2</sub>/m<sub>3</sub> cut-off. This amount was subtracted from each 100m<sub>2</sub> pollution value
   before calculating the population-weighted concentration.
- 20 μgNO<sub>2</sub>/m<sub>3</sub> cut-off. This amount was subtracted from each 100m<sub>2</sub> pollution value
   before calculating the population-weighted concentration.
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175 *2.3 Concentration-response functions (CRFs)* 

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The CRFs used describe the quantitative relationship between additional mortality risk and long-term exposure to every 10  $\mu$ g/m<sup>3</sup> annual-average of NO<sub>2</sub> pollution (Gowers et al., 2014). They were:

- 1.025 (2.5% additional mortality risk) per 10 μg/m3 annual-average NO2 put forward by COMEAP (2015a) and derived from meta-analyses of cohort studies by Hoek et al. (2013) and Faustini et al. (2014).
- 1.055 (5.5% additional mortality risk) per 10 μg/m3 annual-average NO2 put
   forward by WHO (2013a) and derived from the meta-analysis by Hoek et al. (2013).
- 185

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1.039 (3.9% additional mortality risk) per 10 μg/m3 annual-average NO2 – put forward by Walton et al. (2015) in their study of pollution in London.

Walton et al. calculate that the WHO CRF overestimates the health burden of long-term NO2
exposure by up to 30% because of the overlap with the effects of PM<sub>2.5</sub>. They therefore reduced
it by this amount to 1.039. Using this CRF meant a meaningful comparison could be made
between the results of this study and those of Walton et al. (2015).

As the CRFs provide additional mortality risk per 10  $\mu$ g/m<sup>3</sup> annual-average NO<sub>2</sub>, it is necessary to scale them according to the actual NO<sub>2</sub> concentration that the examined population is exposed to. This value is provided by the population-weighted annual-average concentration(s).

When scaling the different CRFs, only cut-offs used by the researchers who put forward 195 the CRF were used. The following calculations were thus made: WHO's CRF scaled with 196 population-weighted annual-average concentration calculated with a 20 µg/m3 cut off; 197 COMEAP's CRF scaled with population-weighted annual-average concentrations calculated 198 with no cut-off and a 1.5 µg/m3 cut-off; WHO's CRF reduced by 30% and scaled with 199 population-weighted annual-average concentration calculated with no cut-off, as per Walton et 200 al. (2015). The method of scaling used was multiplicative scaling according to the following 201 formula (COMEAP, 2010): Scaled CRFs (sCRFs) =  $x_{(y/10)}$ , where x = the concentration-202 response function and y = population-weighted annual-average concentration. 203

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#### 2.4 Calculating the health burden

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The sCRFs were used to calculate different metrics of the health burden using mortality data for the examined area. COMEAP note that for the purposes of calculating the health burden of long-term pollution exposure, mortality data for a specific year is typically used (COMEAP, 2010). However, it is recommended that the average of the last three to five years of available data is used owing to the variability in small datasets (Gowers et al., 2014). The mortality data used were an average of all-cause mortality, among all ages and both sexes, within the local authority area over the last three years available: 2014, 2015, 2016 (ONS, 2017).

As only a proportion of the local authority population was being examined, it was necessary to refer to the same proportion of the mortality data. The examined population is 16.3% of the local authority population at the 2011 census so this percentage of the mortality data was used (339 deaths).

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Three different metrics of the health burden were calculated:

- i) The proportion of annual deaths attributable to exposure to NO<sub>2</sub> in the examined
   population. This was calculated using the formula: proportion of attributable deaths =
   (sCRF 1)/sCRF (COMEAP, 2012).
- ii) The number of deaths attributable to long-term exposure to NO2 in the examined
   population. This was calculated by multiplying the proportion of attributable deaths by
   the total number of deaths (339) (COMEAP, 2012).

225 226 iii) The number of years of life lost to the population in the examined area as a result of exposure to NO<sub>2</sub>. This was calculated by assuming that an average of 11 years of life is lost per attributable death (see below).

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229 2.5 Years of life lost metric

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The years of life lost health burden metric is calculated by multiplying the number of deaths 231 attributable to pollution for each age group by the relevant age-specific life expectancies 232 (Gowers et al., 2014). However, it has been suggested that a reasonable estimate can be made 233 by multiplying the total calculated figure for attributable deaths by an average per-person loss 234 of life (COMEAP, 2012). The average per-person loss of life used was 11 years. It was arrived 235 at by dividing the total years of life lost as a result of long-term NO<sub>2</sub> exposure in the UK in 236 2013 by the total number of UK annual deaths attributed to long-term NO<sub>2</sub> exposure in the 237 238 same year. This data was taken from the European Environment Agency's Air Quality Europe -2016 report (EEA, 2016). 239

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#### 241 *2.6 Baseline scenario, alternative scenario and exceedances*

The method described calculates the health burden of long-term exposure to the current level of NO<sub>2</sub> pollution in the examined area. This can be seen as the **baseline scenario** and provides an answer to the first research question.

To quantify the health burden of legal annual average NO<sub>2</sub> concentrations in the examined area – and answer the second research question – it was necessary to reduce annualaverage concentrations reported by monitoring stations in the examined area to 40  $\mu$ gNO<sub>2</sub>/m<sup>3</sup> if a value over 40  $\mu$ gNO<sub>2</sub>/m<sup>3</sup> had been reported, then repeat the method on this basis. This is described as the **alternative scenario**. There were 47 monitors in the examined area and 33 reported annual-average values over 40  $\mu$ gNO<sub>2</sub>/m<sup>3</sup>.

- The health burden of the alternative scenario can be regarded as both hypothetical and real. It is hypothetical in the sense that it represents the health burden of long-term exposure if NO<sub>2</sub> concentrations were reduced to legal limits. It is real in the sense that it is the health burden of the portion of current concentrations that are within 40  $\mu$ gNO<sub>2</sub>/m<sub>3</sub>.
- The health burden of the exceedances, which relate to the third research question, were regarded as the difference in health burdens between the baseline and alternative scenarios.

This was calculated by subtracting the alternative scenario results from the baseline scenario results.

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#### 261 *2.7 Definition of 'health burden' and 'long-term'*

As the CRFs used describe the additional likelihood of death from all-causes, the health burden assessed was the effect of long-term NO<sub>2</sub> exposure on mortality in general. Long-term in this context refers to exposure to NO<sub>2</sub> for a year or more (Gowers et al., 2014; Hoek et al., 2013).

Although the burden of long-term exposure to NO<sub>2</sub> was examined, the pollution and 266 population data used reflected levels in the last single year for which data was available. 267 Regarding pollution data, it has been noted that "historical exposure is likely to be correlated 268 with current levels and current concentrations can, therefore, also be viewed as a proxy for 269 long-term exposure history" (Gowers et al., 2014). This approach has been used to calculate 270 the health burden of long-term pollution exposure in several studies (for eg COMEAP, 2010; 271 Gowers et al., 2014; Walton et al., 2015). Nevertheless, the use of concentrations from a single 272 273 year allows only for "approximate snapshot" calculations of the health burden in a particular year (Walton et al., 2015). As 2016 pollution data is used, the results presented here indicate 274 275 the health burden of long-term exposure to the concentrations present in that year.

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#### 277 *2.8 Analysis and quantification of uncertainty*

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By calculating the health burden using different CRFs and cut-offs, some of the uncertainty about the precise causal relationship between of NO<sub>2</sub> and all-cause mortality is reflected in the results.

This was further quantified by performing the health burden calculations at the upper and lower boundary of the 95% confidence intervals reported by COMEAP (2015a) (1.01–1.04 per 10  $\mu$ gNO<sub>2</sub>/m<sub>3</sub>), WHO (2013a) (1.031–1.080 per 10  $\mu$ gNO<sub>2</sub>/m<sub>3</sub>) and Walton et al. (2015) (1.022–1.056 per 10  $\mu$ gNO<sub>2</sub>/m<sub>3</sub>) for their proposed CRFs.

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#### 288 **3. Results and discussion**

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*3.1 Health burden of NO2 concentrations (baseline scenario)* 

292	As much as 15.9% of annual deaths in the examined population can be attributed to long-term
293	exposure to 2016 concentrations of NO2 pollution (Table 1). The proportion of deaths
294	attributable to long-term exposure to the 2016 level of $NO_2$ in the examined population ranges
295	from 10.2%, using the COMEAP CRF and a 1.5 $\mu\text{g/m3}$ cut-off, to 15.9% using the Walton et
296	al. CRF and no cut-off.
297	The upper limit of the range of proportion of attributable deaths, 15.9%, means up to
298	54 deaths a year in the examined population can be attributed to long-term exposure to 2016
299	concentrations of NO $_2$ (Table 1). The range of annual deaths in the examined population
300	attributable to long-term exposure to 2016 NO2 concentrations is from 35 to 54. Expressed as
301	life years lost, the health burden in the examined population of long-term exposure to 2016
302	levels of NO <sub>2</sub> is as much as 593 (Table 1).
303	
304	Table 1
305	The health burden among examined population attributable to long-term exposure to 2016
306	concentrations of NO2 (baseline scenario)
307	

	Proportion of deaths	Attributable deaths	Years of life lost	
Walton et al.	15.9% (95% CI 9.4% – 2	21.9%) 54 (95% CI 32 – 74)	593 (95% CI 350 - 816)	
WHO	12.7% (95% CI 7.4% – 1	17.7%) 43 (95% CI 25 – 60)	472 (95% CI 277 – 660)	
COMEAP no o	cut-off 10.6% (95% CI 4.4% – 1	16.3%) 36 (95% CI 15 – 55)	395 (95% CI 164 - 607)	
COMEAP 1.5	cut-off 10.2% (95% CI 4.3% – 1	15.8%) 35 (95% CI 14 – 54)	382 (95% CI 159 – 589)	
Average	12.3%	42	461	
308				
309 The	309 These results indicate that long-term NO <sub>2</sub> exposure has a significant health burden in the			
310 exa	examined area, with the proportion of deaths attributable to NO2 similar to that found in Inner			
311 Loi	London in 2010 (Table 2).			
312				
313				
314				
315 <b>Ta</b> l	ble 2			
316 Hea	Health burden from long-term NO2 exposure in examined area and 10 most polluted London			
317 <u>bor</u>	oughs 2010			
318				
	Examined area versus London boroughs	Proportion of attributable Pop deaths cor	pulation-weighted NO <sub>2</sub>	

	1	City of London	20%	58.2
	2	Westminster	17.2%	49.5
	3	Tower Hamlets	16.3%	46.5
	4	Kensington & Chelsea	16.6%	47.5
	5	Camden	16%	45.7
	6	<b>Baseline scenario</b>	15.9%	45.3
	7	Islington	15.9%	45.2
	8	Southwark	15.5%	44.1
	9	Hammersmith & Fulham	15%	42.6
	10	Lambeth	14.7%	41.6
	11	Hackney	14.7%	41.4
319		(Aa	apted from Walton	et al., 2015)
320				
321	3.2	Health burden of legally comp	oliant NO2 concen	trations (alternative scenario)
322				
323	As	much as 13.9% of deaths in	the examined p	opulation can be attributed to long-term
324	exposure to legally compliant concentrations of NO2 (Table 3). The proportion of deaths			NO <sub>2</sub> (Table 3). The proportion of deaths
325	attributable to legally compliant NO <sub>2</sub> concentrations ranges from 8.9% using the COMEAP			
326	CRF and a 1.5 µg/m <sub>3</sub> cut-off to 13.7% using the Walton et al. CRF and no cut-off.			
327	The top of this range, 13.9%, represents 47 deaths a year (Table 3). The range of deaths			
328	a year that can be attributed to long-term exposure to legally compliant concentrations of NO2			
329	is 30 to 47 and the range of attributable years of life lost is 331 to 518 (Table 3).			e lost is 331 to 518 (Table 3).
330	The results show that an overwhelming majority of the health burden of long-term NO2			ority of the health burden of long-term NO2
331	exposure in the examined area is attributable to legal concentrations. This was also the case in			al concentrations. This was also the case in
332	the	study of the health burden of	pollution in Lond	lon by Walton et al. (2015). Other studies
333	hav	e also found that long-term NC	D2 exposure increa	ased mortality risk when the majority or all
334	of the populations studied were exposed to NO <sub>2</sub> levels below 40 $\mu$ g/m <sub>3</sub> (Cesaroni et al., 2013;			
335	Gan et al., 2011; Hart et al., 2011; Jerrett et al., 2011).			1).
336				
337	Tab	ole 3		
338	The	e health burden among examin	ed population attr	ibutable to long-term exposure to legally
339	compliant NO2 concentrations (alternative scenario)			
340				

	Proportion of deaths	Attributable deaths	Years of life lost
Walton et al.	13.9% (95% CI 8.2% -19.2%)	47 (95% CI 28 – 65)	518 (95% CI 304 - 715)
WHO	9.7% (95% CI 5.7% – 13.6%)	33 (95% CI 19-46)	362 (95% CI 211 – 509)

COMEAP no cut-off	9.2% (95% CI 3.8% – 14.2%)	31 (95% CI 13 – 48)	343 (95% CI 142 – 530)
COMEAP 1.5 cut-off	8.9% (95% CI 3.7% – 13.7%)	30 (95% CI 12 – 46)	680 (95% CI 404 – 937)
Average	10.4%	35	476

342 *3.3 Health burden of the exceedances legal NO2 limit* 

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As discussed (section 2.6), the health burden of the exceedances was arrived at by subtracting
the results of the alternative scenario from those of the baseline scenario. Doing this, we see
that proportion of annual deaths attributable to long-term exposure to the 2016 exceedances of
the legal limit ranges from 1.4%, using the COMEAP CRF, to 3%, using the WHO CRF and a
20 μgNO<sub>2</sub>/m<sub>3</sub> cut-off.

The proportion of deaths arrived at with the WHO CRF, 3%, means the 2016 exceedances of the legal limit are responsible for up to 10 deaths and 110 life years lost (Table 4). These figures can also be seen as the potential health *impact* (COMEAP, 2010) of policy interventions that would reduce NO<sub>2</sub> concentrations to the legal limit. In other words, the results show that measures to reduce NO<sub>2</sub> concentrations to within the legal limit may prevent up to 10 deaths a year and extend lives by up to 110 years.

355

#### 356 **Table 4**

- The health burden among examined population attributable to long-term exposure to 2016
   exceedances of NO<sub>2</sub> legal limit
- 359

	Proportion of deaths	Number of deaths	Years of life lost
Walton et al.	2.0%	7	75
WHO	3.0%	10	110
COMEAP no cut-off	1.4%	5	52
COMEAP 1.5 cut-off	1.4%	5	52
Average	1.9%	7	72

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361

#### 362 *3.4 Interpreting the results*

363

The greatest health burden from long-term NO<sub>2</sub> exposure in the examined area is found when using Walton et al.'s method. This method finds a larger health burden than that recommended by WHO even though the relative risk of NO<sub>2</sub> exposure under the WHO method is greater. This is because, under the WHO method, 20  $\mu$ gNO<sub>2</sub>/m<sub>3</sub> is subtracted from the populationweighted average pollution value when making the calculations.

However, it should be noted that a larger health burden is attributable to the exceedances using the WHO method. This is because the exceedances represent a bigger proportion of the baseline population-weighted annual-average concentrations when a cut-off is used. When multiplicative scaling of the CRFs takes place, it results greater difference between the relative risk of the baseline and alternative scenarios than if no cut off were used.

374

#### 375 *3.5 Internal validity issues*

376

There are a number of uncertainties about the results which stem from the methods used. 377 Although it is agreed that NO<sub>2</sub> has a causal relationship on mortality (WHO, 2013b; COMEAP, 378 2014; US EPA; 2016), the exact quantitative nature of the relationship remains uncertain. 379 380 COMEAP describes their CRF as "interim" (COMEAP, 2015b) and after an attempt to put forward a definitive CRF, COMEAP said it was unable to establish the relationship between 381 NO2 and mortality independent of other pollutants, particularly PM (COMEAP, 2018). For the 382 same reason, the WHO acknowledge that estimates of the effects of NO2 based on their CRF 383 may overestimate the effect from 0% to 33% (WHO, 2013b). 384

Another source of uncertainty is the mapped pollution data. Firstly, 62 of the 65 385 monitors used to produce the pollution data are diffusion tubes, which are described as an 386 "indicative" monitoring technology with levels of uncertainty up to  $\pm 25\%$  (Targa and Loader, 387 2008). Secondly, the pollution data may not have been mapped at a sufficiently fine resolution 388 to accurately reflect the distribution of pollution concentrations and consequently people's 389 pollution exposure. The resolution used, 100m<sub>2</sub>, is finer than that used in several studies of the 390 effect of NO<sub>2</sub> (Al-Hamdan et al., 2009; Lipsett et al., 2011; Gowers et al., 2014). However, 391 because NO<sub>2</sub> concentrations are known to vary at small spatial scales, it remains possible that 392 levels in hot spots were smoothed, or rounded down, so that exposure was underestimated. 393

Thirdly, although IDW is commonly used to map pollution values in epidemiological studies of NO<sub>2</sub>, other more techniques may map pollution values more accurately (Jerrett et al., 2005). In this case, atmospheric dispersion modelling, which is more complex and, for the best results, requires proprietary software (Yudego et al., 2018), was not possible within the budget and time period of this research. Similarly, land use regression modelling requires other data relating to emission sources and their dispersion in order to develop a multi-variable model in GIS software (Beelen et al., 2013; Jerrett et al., 2005). Consequently, it was not possible with the resources available. It should be noted however, that, of the other interpolation techniques
available, kriging provides limited advantages over IDW (Qiao et al., 2018; Shukla et al., 2020;
Vorapracha et al., 2015).

The final source of uncertainty is the mortality data. As the examined area is 404 idiosyncratic in the sense that it has only been defined for the purpose of this research, there 405 was no corresponding mortality data for just this area. It was necessary to assume that, as the 406 examined population was 16.3% of the whole local authority area population, the examined 407 population also experienced 16.3% of the mortality. However, the distribution of the mortality 408 across the local authority may not match the distribution of the population so that the mortality 409 assumed for the examined area was over or under-estimated. As a consequence, the health 410 burden may also have been over or under-estimated. 411

412

### 413

#### 414 **4.** Conclusions

415

By providing a quantitative description of the health burden of NO<sub>2</sub> pollution in central
Brighton, it is hoped the research will inform on-going policy debates about NO<sub>2</sub> pollution.

In Brighton and Hove, air quality is already a concern among residents, local environmental activists and politicians (Vowles, 2017). Quantifying the health burden of NO<sub>2</sub> levels in central Brighton (baseline scenario) helps increase understanding of the public health risk local people are exposed to and enables concerned stakeholders to increase pressure on policy makers to reduce pollution.

In the context of UK policy, the findings of the research raise questions about the adequacy of the national assessment. The select committee report discussed above (section 1) recommends Defra adjust its NO<sub>2</sub> assessment methodology to include more accurate local data so that the true extent of NO<sub>2</sub> pollution is recognised. By demonstrating that, with local data, up to 54 lives a year are attributable to NO<sub>2</sub> pollution in a sub-section of a city deemed compliant by the national assessment, the research supports this recommendation.

Efforts to get Defra to improve its assessment methods are bolstered further by the quantification of the health burden of just the exceedances of 40  $\mu$ gNO<sub>2</sub>/m<sub>3</sub>. The results show that, in a sub-section of one city, the consequence of the government not acknowledging or eliminating NO<sub>2</sub> exceedances could be as many as 10 deaths a year. This finding strengthens calls by local MPs and councillors for Defra to recognise the exceedances by including councilrun automatic monitors in two of the city's most polluted roads in the AURN network used to
calibrate the modelling (personal correspondence, April 4th and 12th, 2018).

At the same time, putting a figure on the health burden of legally compliant NO2 436 concentrations in central Brighton (alternative scenario) informs the on-going debate about the 437 adequacy of the guideline maximum limit for safe long-term exposure. In its 2013 review of 438 the evidence of the effect of long-term NO2 exposure, the WHO concluded that "it would be 439 wise to consider whether the guideline [40 µg NO<sub>2</sub>/m<sub>3</sub>] should be lowered at the next revision 440 of the guidelines" expected in 2020 (WHO, 2013b). This study, and that of Walton et al. (2015), 441 does not contradict that conclusion. Rather the finding that there is a significant health risk 442 associated with NO<sub>2</sub> concentrations currently deemed safe supports moves to lower the WHO 443 guidelines and the EU annual mean limit to protect public health. 444

It would be useful to calculate the health burden of long-term NO<sub>2</sub> exposure for the whole of the local authority area, rather than for a sub-section as has been done here. Providing a health burden metric for the whole governance area may strengthen impetus for policy measures to tackle the problem. Such a calculation could be performed by determining pollution levels across the authority using atmospheric dispersion modelling.

Looking beyond Brighton and Hove, it would be interesting to conduct a similar study to this one in another city deemed compliant with NO<sub>2</sub> concentrations by the national assessment. If it can be shown that there is a pattern of Defra's modelling underestimating NO<sub>2</sub> pollution and the associated health burden vis à vis local assessments, it would further illuminate whether Defra's approach needs revising. Similarly, further studies quantifying the health burden of long-term exposure to legal NO<sub>2</sub> concentrations would also inform whether the current legal limit value is adequate.

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