

Current and future disease burden from ambient ozone exposure in India

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Supplementary Figure 2: Comparison of rural and urban observed and simulated O₃ concentrations. (a) Comparison of annual and monthly-mean ambient surface O₃ concentrations from rural observation sites. We show the rural site best fit line as solid, and the 1:1, 2:1, and 1:2 lines as dashed. Rural site normalised mean bias (NMB) = 0.28, the rural site best-fit line has slope = 1.18, and rural site Pearson's correlation coefficient (r) = 0.67. (b) Comparison of annual and monthly-mean ambient surface O₃ concentrations from urban observation sites. We show the urban site best fit line as solid, and the 1:1, 2:1, and 1:2 lines as dashed. Urban site NMB = 0.41; the urban site best-fit line has slope = 1.24, and urban site r = 0.47.

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Supplementary Figure 5: The impact of scenarios on O₃ metrics. (a) Percentage of population in 2015 (1st bar) and 2050 (2nd bar) exposed to population-weighted ambient surface O₃ concentrations above 50 ppb (WHO AQG, Indian NAAQS) in each scenario. (b) Absolute population in 2015 (1st

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45 **Supplementary Figure 6:** Sensitivities of health impacts due to O₃ exposure in India to demography
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47 mortality. Impacts are estimated using either Jerrett et al., (2009) (red) and Turner et al., (2016)
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49 the NPS and CAS scenarios. For each panel, the five bars (left to right) show estimates for 2015 with
50 2015 population, age, and baseline mortality, 2050 with 2050 population, age, and baseline mortality,
51 and 2050 with population from 2015 (POP2015), population age grouping from 2015 (AGE2015),
52 and baseline mortality rates from 2015 (BM2015).

53 **Additional Supporting Information (Files uploaded separately)**

54 Supplementary data containing results per Indian state per scenario.

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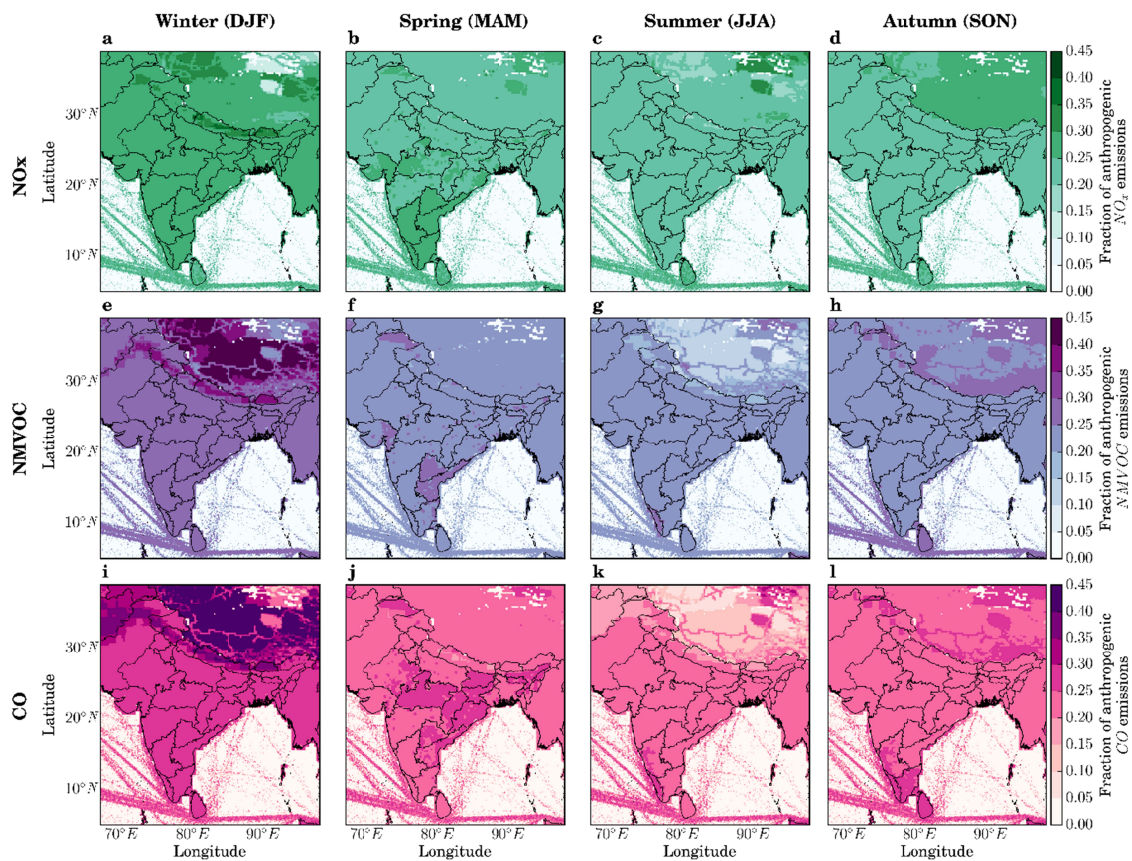
57 **Supplementary Table 1:** Model Setup and parameterisation used in the Weather Research and
 58 Forecasting model coupled with Chemistry (WRF-Chem) model.

Model Setup and Parameterisation	
Process	Method
Domain	60° to 100° East, 0° to 40° North
Timestep	180 seconds, with Runge-Kutta 2 nd and 3 rd order time integration
Horizontal	Resolution of 30 km along a 140 × 140 grid, with Arakawa C-grid staggering and 2 nd to 6 th order advection schemes
Vertical	33 vertical levels (top at 10 hPa) with terrain-following hydrostatic pressure coordinates and 2 nd to 6 th order advection schemes
Precipitation microphysics	Thompson scheme (Thompson et al., 2008)
Longwave radiation	RRTM longwave (Mlawer et al., 1997), called every 30 mins
Shortwave radiation	RRTM shortwave (Pincus et al., 2003), called every 30 mins
Boundary layer physics	Mellor-Yamada Nakanishi and Niino 2.5 (Nakanishi et al., 2006), called every timestep
Land surface	Noah Land Surface Model (Ek et al., 2003)
Convective parameterisation	Grell 3-D ensemble (Grell et al., 2002), called every 60 seconds
Gas-phase chemistry scheme	MOZART-4 using KPP (Emmons et al., 2010), chem_opt=201 (Hodzic & Knote, 2014), called every 12 mins
Photolysis scheme	Madronich fTUV (Tie et al., 2003), called every 30 mins
Aerosol scheme	MOSAIC 4-bin (Zaveri et al., 2008), called every 12 mins
Dust	GOCART online with AFWA, dust_opt=3 (Chin et al., 2000, 2002)
Initial & boundary chemistry/aerosol	MOZART-4 / GEOS5 (NCAR, 2016)
Initial & boundary meteorology	NCEP GFS and NCEP FNL (NCEP et al., 2000, 2007)

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61 **Supplementary Table 2:** Ambient surface O₃ observation site details.

Site	Type	Latitude (°N)	Longitude (°E)	Altitude (m)	Data period	Reference
Ahmedabad (ABD)	Semi-arid, urban	23.00	72.60	49	1993 – 1996	(Lal et al., 2000)
					2002 – 2003	(Sahu & Lal, 2006)
					2011	(Mallik et al., 2015)
Anantapur (ANP)	Semi-arid, rural	14.62	77.65	331	2002 – 2003	(Reddy et al., 2008)
					2008 – 2009	(Reddy et al., 2010)
Bhubaneswar (BHB)	Coastal, rural	20.30	85.83	45	2010 – 2012	(Mahapatra et al., 2014)
Delhi (DEL)	Urban	28.65	77.27	220	1997 – 2004	(Jain et al., 2005)
Gadanki (GDK)	Rural	13.50	79.20	375	1993 – 1996	(Naja et al., 2002)
Jabalpur (JBL)	Semi-urban	23.17	79.92	411	2013 – 2014	(Sarkar et al., 2015)
Kannur (KNN)	Semi-rural	11.90	75.40	5	2009 – 2010	(Nishanth et al., 2012)
Kanpur (KNP)	Urban	26.46	80.33	125	2009 – 2013	(Gaur et al., 2014)
Kullu (KLU)	Semi-urban	31.90	77.12	1154	2010	(Sharma et al., 2013)
Mt. Abu (MAB)	High altitude, rural	24.60	72.70	1680	1993 – 2000	(Naja et al., 2003)
Nainital (NTL)	High altitude, rural	29.37	79.45	1958	2006 – 2008	(Kumar et al., 2010)
					2009 – 2011	(Sarangi et al., 2014)
Pune (PNE)	Semi-urban	18.54	73.81	600	2003 – 2004	(Beig et al., 2007)
Pantnagar (PNT)	Semi-urban	29.00	79.50	231	2009 – 2011	(Ojha et al., 2012)
Trivandrum (TRV)	Coastal, rural	8.55	77.00	5	2007 – 2009	(David et al., 2011)
Udaipur (UDP)	Urban	24.58	73.68	598	2010 – 2011	(Yadav et al., 2014)



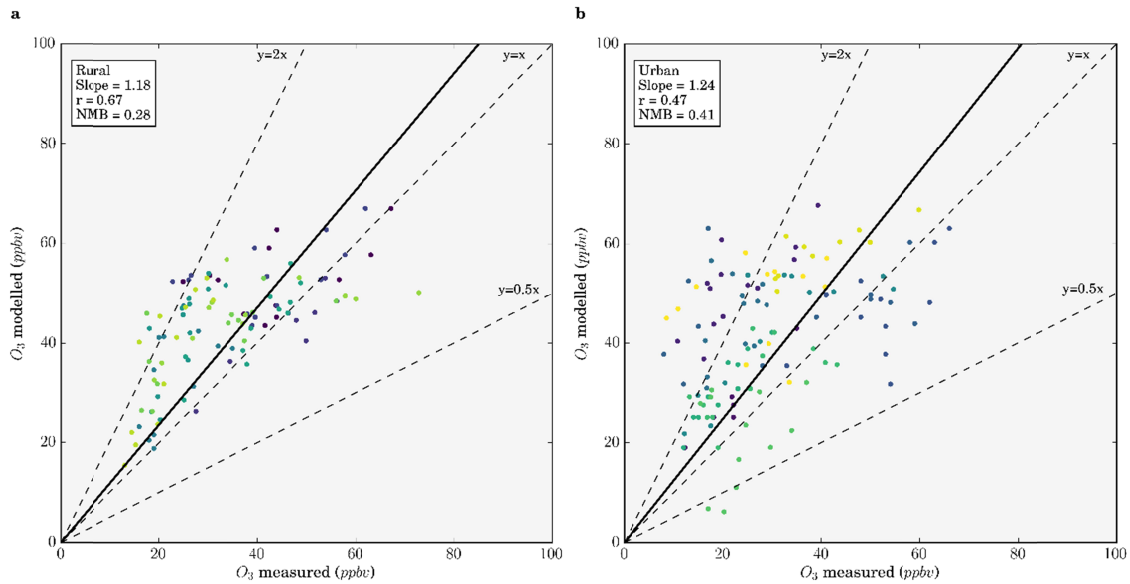
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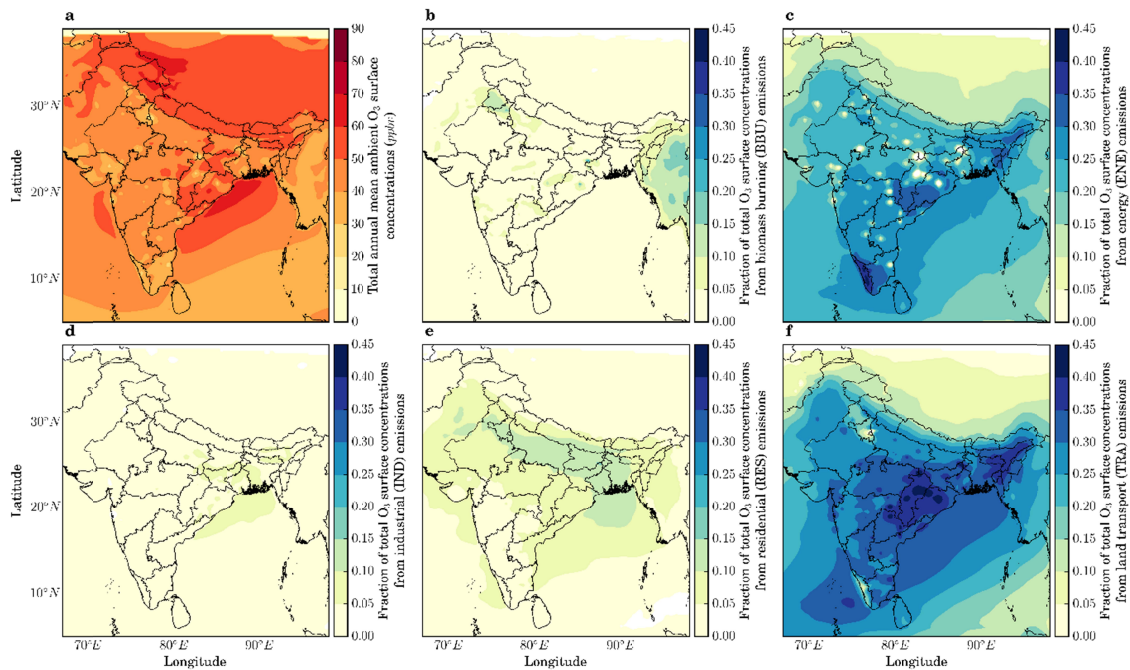
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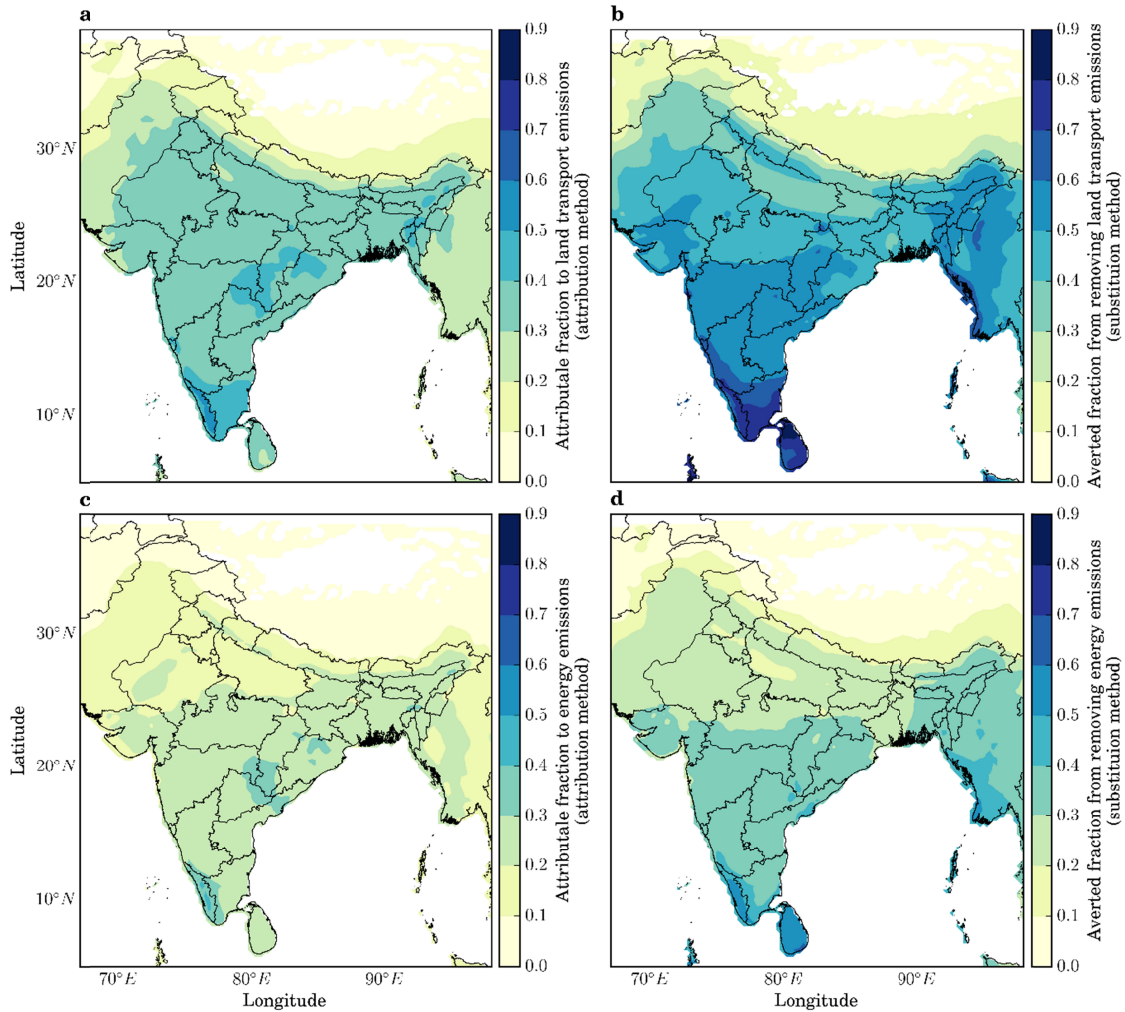
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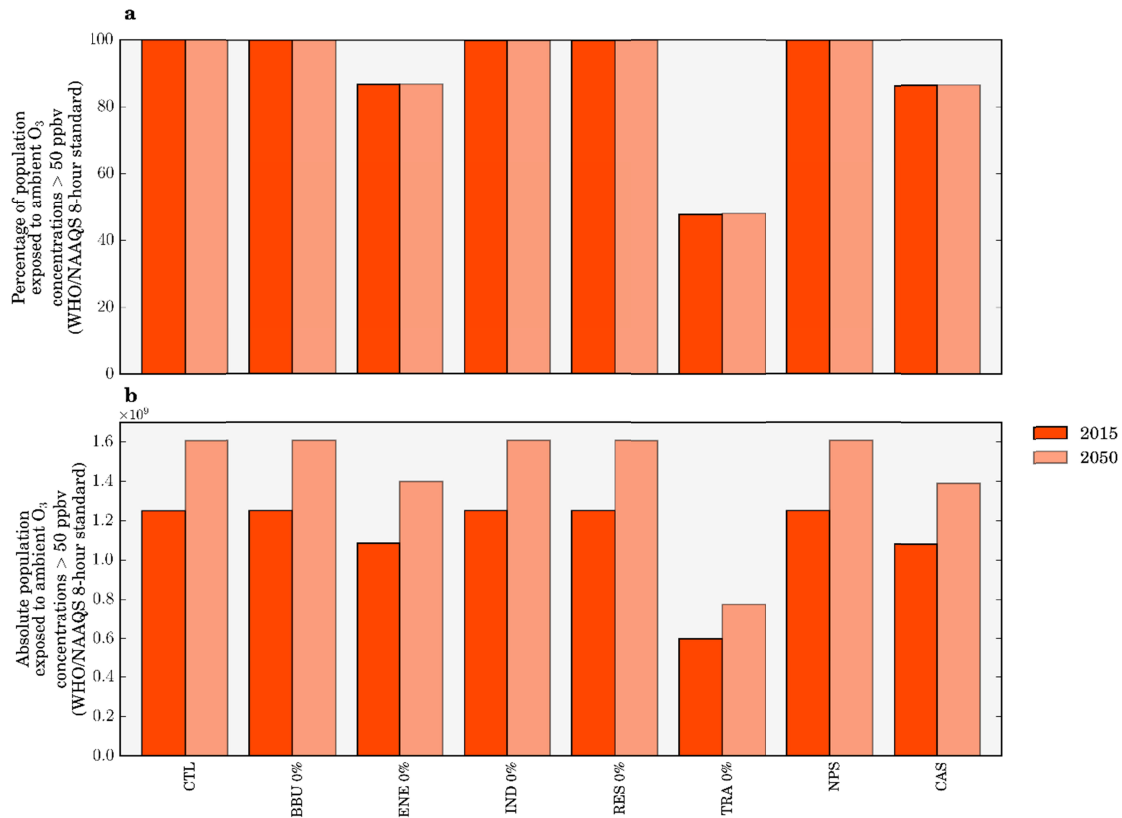
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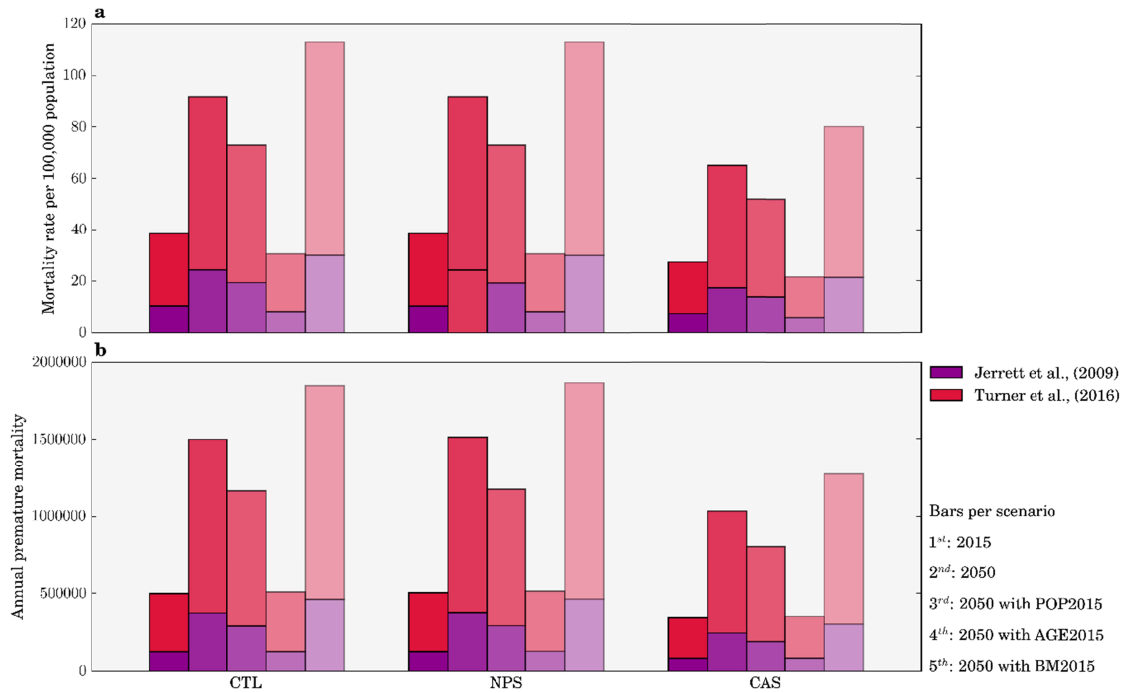
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