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## A VALIDATION STUDY OF THE ADMS PLUME CHEMISTRY SCHEMES

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**Abstract**: The paper presents validation, from two sites in Alaska, of two ADMS chemistry schemes for the prediction of in-plume  $NO_2$  concentrations. Both the standard scheme, which assumes instantaneous mixing of ambient  $O_3$  into the plume at source, and the dilution and entrainment scheme which takes account rate of the entrainment of  $O_3$  into the plume, show good performance. A novel methodology comprising a scatter plot of the ratio of modelled to observed  $NO_2$  vs. modelled to observed  $NO_x$  is used to distinguish errors in the chemistry schemes from errors in the prediction of  $NO_x$ . This shows the dilution and entrainment model has superior performance.

Key words: plume chemistry, nitrogen dioxide, ADMS, validation

## **INTRODUCTION**

Combustion sources emit a combination of oxides of nitrogen (NO<sub>x</sub>), but air quality standards are generally expressed in terms of one component of NO<sub>x</sub>, nitrogen dioxide (NO<sub>2</sub>). For example the EU imposes limit values for annual and hourly average concentrations of NO<sub>2</sub>. As the components of NO<sub>x</sub> are chemically reactive in the atmosphere it is necessary to model this conversion to predict concentrations of NO<sub>2</sub> for comparison with the standards. The simplest models assume a fixed conversion rate, empirically based formulae (e.g. Carslaw *et al.*, 2013), or use an ozone limiting method in which all available ozone is used to oxidize NO to NO<sub>2</sub> (Cole and Summerhays, 1979). A more advanced plume based chemical scheme, PVMRM, is available in AERMOD (Hanrahan, 1999). The Atmospheric Dispersion Modelling System ADMS 5 (Carruthers *et al.*, 1994, Carruthers *et al.*, 2003) includes two plume based schemes for predicting NO<sub>2</sub>, a standard chemistry scheme and a newly developed scheme that takes account of the rate of entrainment of air into the plume and its dilution as it travels downstream.

This paper presents validation of both the ADMS 5 chemistry schemes and includes a new graphical method which allows the performance of a chemistry scheme to be considered in isolation from a model's performance in predicting  $NO_x$ . An ideal validation dataset for  $NO_2$  would include observations of  $NO_2$ ,  $NO_x$  (total NO and  $NO_2$ ) and  $O_3$  concentrations from several monitors around an emission source with well quantified emissions and appropriate meteorological observations. Such a dataset does not exist, but two adequate datasets were identified, in Wainwright and Prudhoe Bay, both of which are in Alaska.

### ADMS CHEMISTRY SCHEMES

Both chemical reaction schemes within ADMS consider the two reactions which take place over short timescales:

$$NO + O_3 \rightarrow NO_2 \tag{1}$$

$$NO_2 \xrightarrow{n_0} NO + O_3 \tag{2}$$

where the photochemical reaction (2) may only take place during daylight. In the standard scheme, concentrations of primary NO and NO<sub>2</sub> within the plume are first calculated using the standard dispersion algorithms. The background concentrations of NO<sub>x</sub>, NO<sub>2</sub> and O<sub>3</sub> are assumed to be well-mixed into this 'primary' plume at the source; to calculate in-plume concentrations of NO<sub>2</sub> and O<sub>3</sub>, reactions (1) and (2) take place for a 'reaction time' calculated as the concentration-weighted average of the travel time from

the sources to a receptor. In the dilution and entrainment scheme, rather than full entrainment of the background at source, background pollutants are entrained into the plume at a rate determined by the rate of entrainment of ambient air into the instantaneous plume, as given by the concentration fluctuation module of ADMS (Davies *et al.*, 1998). It is to be anticipated that the dilution and entrainment scheme will better reflect the mixing processes in the plume and therefore more accurately predict concentrations of NO<sub>2</sub>; the standard scheme would be expected to be conservative in NO<sub>2</sub> since entrainment of ozone into the plume is effectively assumed to be instantaneous.

### VALIDATION CASES

The two validation sites that were used in this study are from Wainwright and Prudhoe Bay, both in Alaska. ADMS version 5.0.2.0 was used throughout.



Figure 1. Diagram of the study area for a) Wainwright and b) Prudhoe Bay

At Wainwright the  $NO_x$  emissions source is a power plant on edge of the small town of Wainwright (Hendrick *et al.*, 2013). It consists of five diesel generators with exhaust stacks located on two corners of the power plant building. Concentrations of NO,  $NO_2$  and  $O_3$  and the meteorological parameters of wind speed, wind direction, temperature and solar radiation were measured at a single location 500 m to the east, as shown in

Figure 1a. Modelling using both the standard and dilution and entrainment ADMS chemistry schemes was conducted for the period September 2009 to September 2010. At Prudhoe Bay the NO<sub>x</sub> emissions source consists of a drilling rig on an oil well; of the considerable number of sources only three were significant. Concentrations of NO, NO<sub>2</sub>, and O<sub>3</sub> and meteorological parameters including wind speed, wind direction, rms vertical velocity ( $\sigma_w$ ), temperature and solar radiation were measured at a single monitoring station approximately 60 m away from the rig, as shown in

Figure 1b. Modelling was conducted for the first 40 days of 2007 using only the standard ADMS chemistry scheme, as the dilution and entrainment scheme has not yet been implemented for multiple sources. As the drilling rig was large and close to the monitor, its effect on airflow and hence dispersion has been included in the modelling. Rather than use the ADMS meteorological pre-processor to estimate the Monin Obukhov length ( $L_{MO}$ ), which is likely to be subject to significant error in the very stable conditions prevailing at Prudhoe Bay in January and February, the measured  $\sigma_w$  was used to estimate  $L_{MO}$  using an approximate relationship for the wind speed in stable conditions:

$$u(z) = \frac{u_*}{\kappa} \left( \ln\left(\frac{z+z_0}{z_0}\right) + \frac{5z}{L_{MO}} \right)$$
(3)

where  $u_* \sim \frac{\sigma_w}{1.3}$ , z is the height above ground,  $z_0$  is the surface roughness and  $\kappa$  (=0.4) is von Karman's constant. As there were no measured upstream values of pollutant concentrations in either study, it was necessary to estimate background values of NO<sub>x</sub>, NO<sub>2</sub> and O<sub>3</sub> from the single receptor in each. NO<sub>x</sub> and NO<sub>2</sub> background concentrations were estimated from time periods that were not included in the model analysis. At Wainwright these values were found to be negligible so were set to zero. At Prudhoe Bay, an

average diurnal, wind direction dependent background was used. The  $O_3$  background was then estimated assuming conservation of oxidant (NO<sub>2</sub> +O<sub>3</sub>).

#### **RESULTS AND DISCUSSION**

Tables 1 and 2 show the model validation statistics for Wainwright and Prudhoe Bay respectively.

Figure 2 shows, for Wainwright, the quantile-quantile plots for  $NO_x$  (a) and  $NO_2$  (b), the scatter plots of modelled vs. observed ratios  $NO_2/NO_x$  for standard chemistry (c) and the dilution and entrainment chemistry (d), and the scatter plots of modelled to observed ratios of  $NO_2$  vs. modelled to observed ratios of  $NO_x$  for standard chemistry (e) and the dilution and entrainment chemistry (f). Figure 3 shows the equivalent plots for Prudhoe Bay, without those for dilution and entrainment chemistry which was not modelled at Prudhoe Bay.

The focus of this validation is on the performance of the chemical reaction schemes, so the discussion highlights the insight that the tables and graphs provide about this. We first note for Wainwright that NO<sub>x</sub> is underestimated although the correlation is high, and both the standard and dilution and entrainment schemes underestimate NO<sub>2</sub>, with a greater underestimate for the dilution and entrainment chemistry; ratios of NO<sub>2</sub> to NO<sub>x</sub> are overpredicted for the standard scheme but well predicted for the dilution and entrainment scheme. At Prudhoe Bay both NO<sub>x</sub> and NO<sub>2</sub> are underestimated for low observed concentrations but well predicted for higher levels; there is wide scatter in the ratios of NO<sub>2</sub> to NO<sub>x</sub>. However, to assess the performance of the reaction schemes it is necessary to distinguish the errors in NO<sub>x</sub> from errors in NO to NO<sub>2</sub> conversion. This is achieved by the scatter plots of ratios of modelled to observed NO<sub>2</sub> to NO<sub>x</sub> underpredicted as it must decrease with increasing NO<sub>x</sub>, and conversely for underprediction of NO<sub>x</sub>; when NO<sub>x</sub> is well predicted then NO<sub>2</sub> should also be well predicted. This means that the points should lie between the diagonal and horizontal blue lines on the plots and the line of best fit should pass through (1,1). This is indeed, in the main, the case for the dilution and entrainment scheme for Wainwright (

Figure 2(e)), which therefore has very good performance and somewhat better performance than the standard scheme. In the case of Prudhoe Bay, Figure 3 (d) shows that the standard chemistry performs well, just slightly overestimating the conversion to NO<sub>2</sub>. Such good performance may be a consequence of the large buildings resulting in rapid mixing into the plume so that the instantaneous mixing assumption is good in this case.

Run summary		Statistical summary								
Pollutant	NO <sub>x</sub> chemistry method	Obs Mean	Mod Mean	R	Fac2	Fb	Obs Max	Mod Max		
NO <sub>x</sub>	N/A	43.2	27.4	0.780	0.423	-0.447	369	145		
$NO_2$	Standard chemistry	12.7	10.9	0.671	0.517	-0.148	72.5	66.7		
NO <sub>2</sub>	Dilution and entrainment chemistry	12.7	8.68	0.682	0.520	-0.374	72.5	49.1		

 Table 1. Statistics for modelled NOx and NO2 concentrations for Wainwright. Includes observed and modelled means, correlation coefficient, fraction of modelled values within a factor of 2 of the observed values, fractional bias, and observed and modelled maximum values.

Table 2. Statistics for modelled NO<sub>x</sub> and NO<sub>2</sub> concentrations for Prudhoe Bay. Same statistics as shown in Table 1.

Kun summary		Statistical summary								
Pollutant	NO <sub>x</sub> chemistry method	Obs Mean	Mod Mean	R	Fac2	Fb	Obs Max	Mod Max		
NOx	N/A	192	145	0.688	0.515	-0.279	845	498		



**Figure 2.** Quantile-quantile plots of modelled against observed a) NO<sub>x</sub> concentrations and b) NO<sub>2</sub> concentrations. Scatter plots of NO<sub>2</sub>/NO<sub>x</sub> ratio for c) standard chemistry and d) dilution & entrainment. Scatter plots of





**Figure 3.** Quantile-quantile plots of modelled against observed a) NO<sub>x</sub> concentrations and b) NO<sub>2</sub> concentrations. Scatter plots of c) NO<sub>2</sub>/NO<sub>x</sub> ratio and d) modelled/observed ratio of NO<sub>2</sub> against the ratio for NO<sub>x</sub> for standard chemistry with a dashed line of best fit. Points in c) and d) are coloured by NO<sub>x</sub> concentration. All at Prudhoe Bay.

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