# Biomass burning at Cape Grim: exploring photochemistry

# 2 using multi-scale modelling

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#### Abstract

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We have tested the ability of a high resolution chemical transport model (CTM) to reproduce biomass burning (BB) plume strikes and ozone (O<sub>3</sub>) enhancements observed at Cape Grim in Tasmania Australia from the Robbins Island fire. The CTM has also been used to explore the contribution of near-field BB emissions and background sources to O3 observations under conditions of complex meteorology. Using atmospheric observations, we have tested model sensitivity to meteorology, BB emission factors (EF) corresponding to low, medium and high modified combustion efficiency (MCE) and spatial variability. The use of two different meteorological models (TAPM-CTM and CCAM-CTM) varied the first (BB1) plume strike time by up to 15 hours, and duration of impact between 12 and 36 hours, and varied the second (BB2) plume duration between 50 and 57 hours. Meteorology also had a large impact on simulated O<sub>3</sub>, with one model (TAPM-CTM) simulating 4 periods of O<sub>3</sub> enhancement, while the other model (CCAM) simulating only one period. Varying the BB EFs, which in turn varied the non-methane organic compound (NMOC) / oxides of nitrogen (NOx) ratio, had a strongly non-linear impact on simulated O<sub>3</sub> concentration, with either destruction or production of O<sub>3</sub> predicted in different simulations. As shown in previous work (Lawson et al., 2015), minor rainfall events have the potential to significantly alter EF due to changes in combustion processes. Models which assume fixed EF for O<sub>3</sub> precursor species in an environment with

- 30 temporally or spatially variable EF may be unable to simulate the behaviour of important
- 31 species such as O<sub>3</sub>.
- 32 TAPM-CTM is used to further explore the contribution of the Robbins Island fire to the
- 33 observed O<sub>3</sub> enhancements during BB1 and BB2. Overall, TAPM-CTM suggests the dominant
- source of O<sub>3</sub> observed at Cape Grim was aged urban air (age = 2 days), with a contribution of
- 35 O<sub>3</sub> formed from local BB emissions.
- 36 This work shows the importance of assessing model sensitivity to meteorology and EF, and the
- 37 large impact these variables can have in particular on simulated destruction or production of
- 38 O<sub>3</sub> in regional atmospheric chemistry simulations. This work also shows the importance of
- 39 using models to elucidate the contribution from different sources to atmospheric composition,
- 40 where this is difficult using observations alone

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#### 1 Introduction

- 45 Biomass burning (BB) makes a major global contribution to atmospheric trace gases and
- 46 particles with ramifications for human health, air quality and climate. Directly emitted species
- 47 include carbon monoxide (CO), carbon dioxide (CO<sub>2</sub>), oxides of nitrogen (NO<sub>x</sub>), primary
- 48 organic aerosol (POA), non-methane organic compounds (NMOC) and black carbon (BC),
- 49 while chemical transformations occurring in the plume over time lead to formation of
- 50 secondary species such as O<sub>3</sub>, oxygenated NMOC and secondary aerosol. Depending on a
- 51 number of factors, including magnitude and duration of fire, plume rise and meteorology, the
- 52 impact of BB plumes on human health, air quality and climate may be local, regional or global.
- 53 BB plumes from wildfires, prescribed burning, agricultural and trash burning can have a major
- 54 impact on air quality in both urban and rural centres (Keywood et al., 2015; Luhar et al., 2008;
- Reisen et al., 2011; Emmons et al., 2010; Yokelson et al., 2011) and regional scale climate
- 56 impacts (Andreae et al., 2002; Keywood et al., 2011b; Artaxo et al., 2013; Anderson et al.,
- 57 2016). In Australia, BB from wild and prescibed fires impacts air quality in both rural and
- 58 urban areas (Keywood et al., 2015; Reisen et al., 2011; Luhar et al., 2008; Keywood et al.,
- 59 2011a) as well as indoor air quality (Reisen et al., 2011). More generally, as human population
- density increases, and as wildfires become more frequent (Flannigan et al., 2009; Keywood et
- al., 2011b), assessing the impact of BB on air quality and human health becomes more urgent

- (Keywood et al., 2011b; Reisen et al., 2015). In particular, particles emitted from BB frequently 62 lead to exceedances of air quality standards, and exposure to BB particles has been linked to 63 64 poor health outcomes including respiratory effects, cardiovascular disease and mortality 65 (Reisen et al., 2015; Reid et al., 2016; Dennekamp et al., 2015). There is also increasing evidence that mixing of BB emissions with urban emissions results in enhanced 66 67 photochemistry and production of secondary pollutants such as secondary aerosol and O<sub>3</sub> (Jaffe and Wigder, 2012; Akagi et al., 2013; Hecobian et al., 2012), which may result in more 68 significant health impacts than exposure to unmixed BB or urban emissions. 69 70 To be able to accurately predict and assess the impact of BB on human health, air quality and 71
- climate, models must be able to realistically simulate the chemical and microphysical processes 72 that occur in a plume as well as plume transport and dispersion. In the case of BB plumes close 73 to an urban centre or other sensitive receptor, models can be used to mitigate risks on 74 community by forecasting where and when a BB plume will impact, the concentrations of toxic 75 trace gases and particles in the plume, and potential impact of the BB plume mixing with other 76 sources. Models also allow investigation of the contributions from BB and other sources on 77 observed air quality when multiple sources are contributing. Understanding the relative 78 importance of different sources is required when formulating policy decisions to improve air 79 quality.
- Lagrangian parcel models are often used to investigate photochemical transformations in BB plumes as they are transported and diluted downwind (Jost et al., 2003; Trentmann et al., 2005; Mason et al., 2006; Alvarado and Prinn, 2009; Alvarado et al., 2015) while three-dimensional (3D) Eulerian grid models have been used to investigate transport and dispersion of plumes, plume age, as well as contributions from different sources. 3D Eulerian grid models vary from fine spatial resolution on order of a few kilometers (Luhar et al., 2008; Keywood et al., 2015; Alvarado et al., 2009; Lei et al., 2013) to a resolution of up to hundreds of kilometers in global

models (Arnold et al., 2015; Parrington et al., 2012).

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Sensitivity studies have allowed the influence of different model components (emissions, plume rise, transport, chemistry) on model output to be investigated. Such studies are particularly important in formation of secondary species such as O<sub>3</sub> which have a non-linear relationship with emissions. Studies have found that modelled O<sub>3</sub> concentration from BB emissions is highly dependant on a range of factors including a) meteorology (plume transport and dispersion) in global (Arnold et al., 2015) and high resolution (Lei et al., 2013) Eulerian grid models, b) absolute emissions/biomass burned (Pacifico et al., 2015; Parrington et al.,

96 2009), and oxidative photochemical reaction mechanisms in Lagrangian parcel models (Mason 97 et al., 2006). Broadly speaking, models used for simulating BB plumes comprise a) description of the 98 99 emissions source b) a determination of plume rise c) treatment of the vertical transport and 100 dispersion and d) a mechanism for simulating chemical transformations in the plume (Goodrick 101 et al., 2013). There are challenges associated with accurately representing each of these 102 components in BB modelling. The description of emissions source includes a spatial and 103 temporal description of the area burnt, the fuel load, combustion completeness, and trace gas 104 and aerosol emission factors (mass of species emitted per mass of fuel burned)... The area 105 burned is often determined by a combination of hotspot and fire scar data, determined from 106 retrievals from satellite (Kaiser et al., 2012; Reid et al., 2009; (Giglio et al., 2013)). Cloud cover 107 may lead to difficulties in obtaining area burnt data, while scars from small fires may be 108 difficult to discern against complex terrain, and low intensity fires may not correspond with a 109 detectable hotspot (Meyer et al., 2008). Emission factors are determined experimentally either 110 by field or laboratory measurements, and are typically grouped by biome type. In some regions, 111 such as SE Australia, biomes have been sparsely characterised (Lawson et al., 2015). 112 Furthermore, models use biome-averaged EF which do not account for complex intra-biome 113 variation in EF as a result of temporal and spatial differences in environmental variables. This 114 includes factors such as impact of vegetation structure, monthly average rainfall (van Leeuwen 115 and van der Werf, 2011) and the influence of short term rainfall events (Lawson et al., 2015). 116 For example, EFs have been shown to vary significantly with fuel moisture which can vary 117 seasonally (Korontzi et al., 2003; Urbanski, 2013). There may be significant spatial variability 118 in emission factors within a biome (Castellanos et al., 2014); taken along with temporal 119 variability, this has been shown to have a large impact on simulated concentrations of BB 120 species in global-scale modelling (van Leeuwen et al., 2013). 121 Finally, the very complex mixture of trace gases and aerosols in BB plumes creates analytical 122 challenges in quantifying EF, especially for semi and low volatility organics which are 123 challenging to measure and identify but contribute significantly to secondary aerosol formation and photochemistry within the plume (Alvarado and Prinn, 2009; Alvarado et al., 2015; Ortega 124 125 et al., 2013). 126 Plume rise is a description of how high the buoyant smoke plume rises above the fire, and

consequently the initial vertical distribution of trace gases and aerosols in the plume (Freitas

2012), c) model grid size resulting in different degrees of plume dilution (Alvarado et al.,

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132 uncertainty is the complexity of fire behaviour resulting in high spatial and temporal 133 variability of pollutant and heat release, which drives variability in plume rise behaviour, 134 such as multiple updraft cores (Goodrick et al., 2013). 135 Transport and dilution in models is driven by meteorology, particularly wind speed and 136 direction, wind shear and atmospheric stability. Meteorology has a large impact on the ability 137 of models to simulate the timing and magnitude and even composition of BB plume impacts in 138 both local and regional scale models (Lei et al., 2013; Luhar et al., 2008; Arnold et al., 2015). 139 For example, too-high wind speeds can lead to modelled pollutant levels which are lower than 140 observed (e.g. Lei et al., 2013) while small deviations in wind direction lead to large 141 concentration differences between modelled and observed, particularly when modelling 142 emissions of multiple spatially diverse fires (Luhar et al., 2008). Dilution of BB emissions in 143 large grid boxes in global models may also lead to discrepancies between modelled and 144 observed NO<sub>x</sub>, O<sub>3</sub> and aerosols (Alvarado et al., 2009). 145 Finally, models use a variety of gas-phase and aerosol-phase physical and chemical schemes, 146 which vary in their ability to accurately represent chemical transformations, including 147 formation of O<sub>3</sub> and organic aerosol (Alvarado and Prinn, 2009; Alvarado et al., 2015). 148 Validating and constraining chemical transformations in models requires high quality, high 149 time resolution BB observations of a wide range of trace gas and aerosol species, including 150 important but infrequently measured species such as OH and semi volatile and low volatility 151 NMOC. Field observations, whilst often temporally and spatially scarce, are particularly 152 valuable because the processes and products of BB plume processing are dependent on long 153 range transport, cloud processing, varying meteorological conditions and heterogeneous 154 reactions. 155 In this work we test the ability of CSIRO's high resolution 3D Eulerian grid chemical transport 156 model (CTM) to reproduce BB plume observations of the Robbins Island fire reported in 157 Lawson et al., (2015) with a focus on CO, BC and O<sub>3</sub>. We undertake sensitivity studies using 158 varying emission factors associated with a low, medium and high Modified Combustion 159 Efficiency (MCE), which in turn changes the NMOC / NO<sub>x</sub> ratio, in contrast to other sensitivity 160 studies which typically vary scale emissions of all species linearly by a constant factor (Pacifico

et al., 2007). This is still a large area of uncertainty in BB models, with a generalised plume

rise approach typically used which may include either homogenous mixing, prescribed

finally plume rise calculated according to atmospheric dynamics. A key driver of this

fractions of emissions distributed according to mixing height, use of parametisations, and

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161 et al., 2015; Lei et al., 2013). We also test sensitivity to meteorology by coupling the CTM with two different meteorological models, TAPM and CCAM. The fire and fixed observation 162 163 site (Cape Grim) were only 20 km apart, and so simulation of the plume strikes is a stringent test of TAPM and CCAM's ability to reproduce windspeed and direction. Plume rise and 164 165 chemical mechanism are held constant. Finally, we use TAPM-CTM to separate the 166 contribution of the Robbins Island fire emissions and urban emissions to the observed O<sub>3</sub> 167 enhancements at Cape Grim reported in Lawson et al., (2015), and to determine the age of the 168 O<sub>3</sub>-enhanced air parcels.

Details of the fire and measurements are given in Lawson et al (2015). Briefly, biomass burning

#### 2 Methods

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## 2.1 Fire and measurement details

172 (BB) plumes were measured at the Cape Grim Baseline Air Pollution Station during the 2006 173 Precursors to Particles campaign, when emissions from a fire on nearby Robbins Island 174 impacted the station. Fire burned through native heathland and pasture grass on Robbins Island 175 some 20 km to the east of Cape Grim for two weeks in February 2006. On two occasions an 176 easterly wind advected the BB plume directly to the Cape Grim Station. The first plume strike 177 (BB1) occured from 02:00 - 06:00 (Australian Eastern Standard Time - AEST) on the 16th 178 February, with light easterly winds of 3 m s<sup>-1</sup> and temperature of 13 °C and RH of 96 %. The 179 second, more prolonged plume strike (BB2) occurred from 23:00 on 23rd February to 05:00 180 on the 25th February, with strong easterly winds ranging from 10-16 m s<sup>-1</sup>, temperatures of 16-181 22 °C and RH in the range of 75-95 %. Under a northerly wind direction, urban air from the 182 city of Melbourne (population 4.2 million) some 300 km away is transported across the ocean 183 (Bass Strait) to Cape Grim. 184 A wide variety of trace gas and aerosol measurements were made during the fire event (Lawson 185 et al., 2015). In this work, measurements of black carbon (BC), carbon monoxide (CO) and 186 ozone (O<sub>3</sub>) are compared with model output. BC measurements were made using an 187 aethelometer (Gras, 2007), CO measurements were made using an AGAGE gas 188 chromatography system with a multi-detector (Krummel et al., 2007) and O<sub>3</sub> measurements 189 were made using a TECO analyser (Galbally et al., 2007). For further details see Lawson et al., 190 (2015).

#### 2.2 Chemical transport models

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with two meteorological models (see below). The CSIRO CTM is a three-dimensional Eulerian chemical transport model with the capability of modelling the emission, transport, chemical transformation, wet and dry deposition of a coupled gas and aerosol phase atmospheric system. The CTM was initially developed for air quality forecasting (Cope et al., 2004) and has had extensive use with shipping emission simulations (Broome et al., 2016), urban air quality (Cope

Simulations were undertaken with CSIRO's chemical transport model (CTM), coupled offline

- et al., 2014; Galbally et al., 2008), biogenic (Emmerson et al., 2016) and biomass burning
- 199 studies (Keywood et al., 2015; Meyer et al., 2008; Luhar et al., 2008).
- 200 The chemical transformation of gas-phase species was modelled using an extended version of
- the Carbon Bond 5 mechanism (Sarwar et al., 2008) with updated toluene chemistry (Sarwar
- 202 et al., 2011). The mechanism was also extended to include the gas phase precursors for
- 203 secondary (gas and aqueous phase) inorganic and organic aerosols. Secondary inorganic
- aerosols were assumed to exist in thermodynamic equilibrium with gas phase precursors and
- were modelled using the ISORROPIA-II model (Fountoukis and Nenes, 2007). Secondary
- organic aerosol (SOA) was modelled using the Volatility Basis Set (VBS) approach (Donahue
- et al., 2006). The VBS configuration is similar to that described in Tsimpidi et al., (2010). The
- 208 production of S-VI in cloud water was modelled using the approach described in Seinfeld and
- 209 Pandis (1998). The boundary concentrations in the models for different wind directions were
- 210 informed by Cape Grim observations of atmospheric constituents during non BB periods
- 211 (Lawson et al., 2015). In this work the modelled elemental carbon (EC) output was considered
- 212 equivalent to the BC measured with aethalometer at Cape Grim.
- 213 Horizontal diffusion is simulated according to equations detailed in Cope et al (2009) according
- 214 to principles of Smagorinsky et al., (1963) and Hess (1989). Vertical diffusion is simulated
- according to equations detailed in Cope et al., (2009) according to principles of Draxler and
- Hess (1997). Horizontal and vertical advection uses the approach of Walcek et al., (2000).

# 2.2.1 Meteorological models

- 218 Prognostic meteorological modelling was used for the prediction of meteorological fields
- 219 including wind velocity, temperature, water vapour mixing ratio and clouds, radiation and
- 220 turbulence. The meteorological fields force key components of the emissions and the chemical
- 221 transport model. Two meteorological models were used in this work. CSIRO's (The) Air
- 222 Pollution Model (TAPM) (Hurley, 2008b), a limited area, nest-able, three-dimensional

223	Eulerian num	iericai w	eatner and a	ur q	[uanty]	prediction	systen	i, and CSIRO	s Conformal	Cubic
224	Atmospheric	Model	(CCAM)	a	global	stretched	grid	atmospheric	simulation	model
225	(McGregor	(2015)	and refere	nca	c thor	oin) The	mode	de represent	two unique	(and

(McGregor, (2015) and references therein). The models represent two unique (and

226 independent) approaches for generating the meteorological fields required by the chemical

227 transport model.

228 For CCAM, 20 km spaced simulations over Australia were used by the CTM (with the same 229 grid spacing) to model large scale processes on the continent including the emission and 230 transport of windblown dust, sea salt aerosol and smoke from wildfires. Note that the governing 231 equations for TAPM do not enable this model to simulate spatial scales greater than 1000 km 232 in the horizontal and thus only the CCAM meteorology was available for the continental-scale 233 simulations. TAPM and CCAM 12 km spaced simulations were then used to model the 234 transport of the Melbourne plume to Cape Grim by the CTM (at 12 km grid spacing) with 235 boundary conditions provided by the continental simulation. Nested grid simulations by the 236 CTM at 3 km and 1 km grid spacing utilised TAPM and CCAM meteorology simulated at 237 matching grid spacing. The 1 km spaced meteorological fields were also used to drive a 400 m 238 spaced CTM domain which encompassed Robbin's Island and Cape Grim. This domain was 239 included in the nested grid system because we wanted to better numerically resolve the spatial 240 extent of the fire and the process of plume advection between Robbin's Island and Cape Grim.

- 241 Figure 1 shows the five nested computational domains used in TAPM-CTM and CCAM-CTM.
- In this work the CTM coupled with CCAM meteorological model is referred to as CTM-
- 243 CCAM, while the CTM coupled with the TAPM meteorological model is referred to as TAPM-
- 244 CTM.

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#### 245 2.2.2 Emission inventories

#### Anthropogenic emissions

- 247 Anthropogenic emissions for Victoria were based on the work of Delaney et al., (2011). No
- 248 anthropogenic emissions were included for Tasmania. The north-west section of Tasmania has
- 249 limited habitation and is mainly farmland, and so the influence of Tasmanian anthropogenic
- 250 emissions on Cape Grim are expected to be negligible.

# Natural and Biogenic emissions

- 252 The modelling framework includes methodologies for estimating emissions of sea salt aerosol
- 253 (Gong, 2003) emissions of windblown dust (Lu and Shao, 1999); gaseous and aerosol

emissions from managed and unmanaged wild fires (Meyer et al., 2008); emissions of NMOC

from vegetation (Azzi et al., 2012) and emissions of nitric oxide and ammonia from vegetation

and soils. Emissions from all but the wildfires are calculated inline in the CTM at each time

step using the current meteorological fields. There were no other major fires burning in Victoria

and Tasmania during the study period.

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#### Emissions - Robbins Island fire

260 The area burnt by the fire was determined from hotspots from the Sentinel product

(Geosciences Australia) which were derived from MODIS imagery. The hotspots were

buffered to give polygon spots at a resolution of 400ha spot<sup>-1</sup>, then merged into a single

polgygon for each fire day (Meyer et al., 2008). The fire burnt 2000 ha over the two week

period, and the direction of fire spread was unknown. As such, the fire scar was divided up

into 250m grids and the hourly areas burnt calculated using a normalised version of the

Macarthur Fire Danger Index (FDI) (Meyer et al., 2008). The models assumed that an equal

proportion of each grid burned simultaneously over the two week period. The fuel density used

was estimated to be 18.7 t C ha<sup>-1</sup>, based on mean mass loads of coarse and fine fuels taken from

the biogeochemical production model (VAST 1.2, Barrett 2002) and converted into carbon

270 mass (Meyer et al., 2008).

271 The hourly diurnal emissions of all gases and particles from the fire were calculated using the

FDI in which the presence of strong winds will result in faster fire spread and enhanced

emissions, compared to periods of lower wind speeds. The effect of wind speed on the fire

behaviour and emissions is particularly important during the second BB event in which the

winds ranged from 10 to 15 m s<sup>-1</sup>. This is evident from Figure 2 where hourly emission profiles

based on an average diurnal FDI calculated by Meyer et al., (2008) (which peaks early

afternoon) is compared with profiles based on hourly FDI generated by TAPM and CCAM

meteorology. It can be seen that the use of the dynamic FDI approach during the BB2 period

increases the Base emissions by 70% for TAPM meteorology and by 45% for the CCAM

meteorology. It is also notable that the use of the dynamic approach with TAPM meteorology

leads to the peak emissions occurring overnight on the 24th Feb which is when the Base

emissions are at a minimum.

Savanna category EF were used as base case EFs in this work from Andreae and Merlet (2001).

Three different sets of fire emission factors, corresponding to low, medium and high MCE

were used to test the sensitivity of the models, where MCE =  $\Delta CO_2 / \Delta CO + \Delta CO_2$  (Ferek et

287 to calculate a typical range of MCEs for temperate fires, including an average (best estimate) 288 of 0.92, a lower (0.89) and upper estimate (0.95). Fires with MCEs of approximately 0.90 289 consume biomass with approximately equal amounts of smouldering and flaming, while MCEs 290 of 0.99 indicate complete flaming combustion (Akagi et al., 2011). Therefore the calculated 291 range of MCEs (0.89 - 0.95) correspond to fires in which both smouldering and flaming is 292 occurring, with a tendency for more flaming combustion in the upper estimate (0.95) compared 293 to a tendency of more smouldering in the lower estimate (0.89). 294 In previous smoke modelling work, CCAM-CTM and TAPM-CTM used savannah EF from 295 Andreae and Merlet (2001). However, as Robbins Island is in a temperate region, the Andreae 296 and Merlet (2001) savannah EF used in the models were adjusted to reflect temperate EF based on the following methodology. Minimum, mean and maximum CO EF for temperate forests 297 298 from Agaki et al., (2011) were used for lower-(0.89), best estimate (0.92) and upper MCE 299 (0.95). For all other species, savannah EF (corresponding to MCE 0.94) were adjusted to EF 300 for the lower, best estimate and upper MCEs=0.89, 0.92 and 0.95 using published relationships 301 between MCE and EF (Meyer et al., 2012; Yokelson et al., 2007; Yokelson et al., 2003; 302 Yokelson et al., 2011). 303 For example to adjust the Andreae and Merlet (2001) savannah EF (corresponding to an MCE 304 of 0.94) to our temperate 'best estimate' EF (corresponding to MCE of 0.92) the Andreae and 305 Merlet (2001) NO EF was reduced by 30%, the NMOC EFs were increased by 30%, the BC 306 EF was reduced by 30% and the OC EF was increased by 20%. Table 1 gives emission factors 307 for the original savannah EF (Andreae and Merlet, 2001) and the adjusted EF used in this work. The NO<sub>x</sub>/NMOC ratios used are also shown, and vary by a factor of 3 between the low and 308 309 high MCE scenarios, mainly driven by the variability in NO emissions with MCE. The EF 310 calculated from observations for this fire are shown for comparison (Lawson et al., 2015). 311 We recognise calculating EF in this way is approximate, however the purpose of including a 312 range of EF was to explore the model's sensitivity to EF. While EFs were calculated for the 313 Robbins Island fire for several species (Lawson et al., 2015), these are only available for a 314 subset of species required by the CB05 chemical mechanism. The adjustment of the Andreae 315 and Merlet (2001) Savannah EF to a lower MCE (0.89) resulted in good (± 20%) agreement 316 with the calculated EF for CO, BC and several NMOC from Lawson et al., (2015), in which 317 the MCE was calculated as 0.88. This provides confidence in using published relationships

al., 1998). We used published EF of CO and CO<sub>2</sub> from temperate forests (Akagi et al., 2011),

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between MCE and EF to estimate EF in this work.

With respect to plume rise, the Robbin's Island fire was a relatively low energy burn (Lawson et al., 2015), and as noted by Paugam et al., (2016) the smoke from such fires is largely contained within the planetary boundary layer (PBL). Given that ground-based images of the Robbin's Island smoke plume support this hypothesis, in this work we adopted a simple approach of mixing the emitted smoke uniformly into the model's layers contained within the PBL. The plume was well mixed between the maximum of the PBL height and 200 m above the ground, with the latter included to account for some vertical mixing of the buoyant smoke plume even under conditions of very low PBL height. The high wind speeds particularly during the second BB event, also suggest that the plume was not likely to be sufficiently buoyant to penetrate the PBL.

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#### 3 Results and Discussion

#### 3.1 Modelling Sensitivity Study

- The ability of the models to reproduce the two plume strikes (BB1 and BB2, described in
- 333 Lawson et al (2015)) was tested. The period examined was the 13 February 2006 to the 28
- February 2006. The sensitivity of the models to meteorology, emission factors and spatial
- 335 variability was also investigated and is discussed below. Observation and model data shown
- are hourly averages. Table 2 summarizes the main findings of the model sensitivity study. A
- 337 MODIS Truecolour Aqua image of the Robbins Island fire plume is shown in Figure 3 from
- 338 23 February 2006, with the modelled plume during the same period.

#### 3.1.1 Sensitivity of modelled BB species to meteorology

- 340 Qualitative and quantitative assessment of model performance for meteorological parameters
- 341 were undertaken for both TAPM and CCAM. Hourly observed and modelled winds,
- 342 temperature, humidity and PBL are compared and discussed in the Supplementary section
- 343 (Figures S2-S8). Briefly, both TAPM and CCAM demonstrated reasonable skill in modelling
- the meteorological conditions, with the TAPM simulations slightly better than the CCAM with
- 345 respect to the low level wind, temperatures and relative humidity and CCAM simulations
- 346 slightly better in terms of PBL height.

#### Primary species- CO and BC

CCAM-CTM for BB1 and BB2 respectively. The simulated and observed time series concentrations of CO and BC for the two different models (TAPM-CTM and CCAM-CTM) and for 3 different sets of EF (discussed in Section 3.1.2) are shown in Figure 6. TAPM-CTM and CCAM-CTM both reproduce the observed plume strikes (BB1 and BB2). The impact of meteorology on the plume strike timing and duration is discussed below. Both models overestimate the duration of BB1 and are a few hours out in the timing of the plume strike. TAPM-CTM predicts the timing of BB1 is 3 hours later than occurred (BC data) and predicts that BB1persists for 12 hours (observed duration 5 hours). CCAM-CTM predicts that BB1 occurs 12 hours prior to the observed plume strike and predicts that the plume intermittently sweeps across Cape Grim for up to 36 hours (Figure 4). Both models indicate that the plume is narrow and meandering. Both models overestimate the duration of BB2 and simulate the plume strike occurring earlier than observed. TAPM-CTM predicts BB2 is 26 hours earlier than observed and that BB2 persists for 50 hours (observed duration 29 hours). CCAM-CTM predicts BB2 is 26 hours earlier than observed and that BB2 persists for 57 hours. It should be noted that there is a brief observed enhancement of BB species which correspond with the beginning of the modelled BB2 plume strike, some 24 hours prior to the prolonged observed event. This was likely due to the edge of the plume impacting the station briefly. In both observed BB1 and BB2 the plume strike at Cape Grim occurred just prior to a wind direction change from easterly (fire direction), to south-westerly. The timing of the wind direction change in the models is therefore crucial to correctly predicting plume strike time and duration. In BB1 CCAM predicts an earlier wind direction change with higher windspeeds which advects the plume directly over Cape Grim while TAPM predicts a later wind change, lower windspeeds and advection of only the edge of the plume over Cape Grim. The higher concentrations CO and BC in BB1 by CCAM-CTM is are likely due to the direct advection of the plume over the site compared to only the plume edge in TAPM-CTM. In BB2, both TAPM-CTM and CCAM-CTM predict direct strikes of the Robbin's Island smoke plume on Cape Grim, because the wind direction is modelled to be predominantly easterly for the duration of the event (Figure 5Fig S18). Both models simulate some backing

and veering of the wind direction for the duration of BB2 due to gravity waves processes which

Figure 4 and Figure 5 show concentration isopleths for BC generated by TAPM-CTM and

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- lead to intermittent strikes on Cape Grim as the Robbin's Island smoke plume sweeps to the
- 381 north and south of Cape Grim. The gravity wave oscillations are more pronounced in CCAM-
- 382 CTM than TAPM-CTM (and thus the plume strikes are more pronounced from the former) due
- 383 to differences in how the models are coupled to large scale synoptic forcing. The event is
- eventually curtailed by the passage of a south-westerly change.
- Figure 5Fig. S18 shows that TAPM-CTM predicts the onset of the change to occur about six
- 386 hours ahead of the observed change and thus the BB2 event ends too early for this
- 387 meteorological simulation. CCAM-CTM models the south-westerly change to occur one hour
- 388 after the observed, leading to the modelled BB2 event extending beyond the observed duration
- 389 for this meteorological simulation.
- 390 Differences in the magnitude of the modelled CO and BC peaks for TAPM-CTM and CCAM-
- 391 CTM have two principal cause: a), the coupling of the smoke emissions to the TAPM and
- 392 CCAM meteorology via the FDI scaling leads to approximately 20% higher emissions in the
- 393 case of the TAPM-CTM simulations; b), the CCAM wind speeds are 20-50% higher than the
- 394 TAPM wind speeds during BB2, which in combination with the emission differences, leads to
- 395 TAPM-CTM generating near-surface smoke concentrations which are up to 80% higher than
- 396 CCAM-CTM. Mixing depth can also play an important role in plume dispersion, however the
- 397 PBL heights generated by both models are similar and generally low during BB2 due to the
- 398 easterly wind direction and the mainly maritime upwind fetch.
- 399 **Secondary species O**<sub>3</sub>
- 400 Figure 6 e-f shows the simulated and actual O<sub>3</sub> concentration time series for TAPM-CTM and
- 401 CCAM-CTM for 3 different sets of EF (discussed in Section 3.1.2). The two observed O<sub>3</sub> peaks
- which followed BB1 and BB2 can clearly be seen in the time series of observations. Figure
- 403 7Figure 7 shows the TAPM-CTM and CCAM-CTM concentration isopleths of O<sub>3</sub>
- 404 enhancement downwind of the fire during BB1 at 11:00 and 13:00 on the 16 February.
- 405 Again the simulated meteorology has a major impact on the ability of the models to reproduce
- 406 the magnitude and timing of the observed O<sub>3</sub> peaks. TAPM-CTM reproduces the major O<sub>3</sub> peak
- 407 observed following BB2, and captures part of the O<sub>3</sub> peak following BB1. For the peak
- 408 following BB1 it under predicts the peak duration and fails to capture the subsequent observed
- 409 peaks on the 19th and 19th February. TAPM-CTM also shows 2 additional O<sub>3</sub> peaks about
- 410 24 hours prior to the BB1 and BB2 peaks respectively, which were not observed. The
- 411 magnitude of these additional peaks shows a strong dependency on the EF suggesting an

- 412 influence of fire emissions. This is discussed further below and in Section 3.2.1.Compared to
- 413 TAPM-CTM, CCAM-CTM predicts fewer distinct peaks of ozone above the background
- 414 (where background is 15-17 ppb) throughout the entire period. Both TAPM-CTM and CCAM-
- 415 CTM show depletion of O<sub>3</sub> below background levels which was not observed, and this is
- 416 discussed further in Section 3.1.2.
- Figure 7 Figure 7 shows that there are differences in wind fields between TAPM-CTM and
- 418 CCAM-CTM as well as different simulated concentrations of O<sub>3</sub> generated from the fire. This
- 419 is discussed further in Section 3.1.2.\_To summarise, the impact of using two different
- 420 meteorological models for a primary species such as BC was to vary the modelled time of
- 421 impact of the BB1 plume strike by up to 15 hours (CCAM-CTM -12 and TAPM-CTM +3
- 422 hours, where actual plume strike time = 0 hours) and to vary the plume duration between 12
- and 36 hours (actual duration 5 hours). For BB2, different meteorological models predicted the
- same impact time (TAPM-CTM and CCAM-CTM both -26 hours where actual plume strike
- 425 time = 0 hours and to vary the plume duration between 47 and 60 hours (actual duration 29
- 426 hours).
- 427 For O<sub>3</sub>, the use of different meteorological models lead to one model (TAPM-CTM)
- 428 reproducing both observed peaks plus two additional peaks, while the other model (CCAM-
- 429 CTM) captured only one defined O<sub>3</sub> peak over the time series of 2 weeks.

# 430 3.1.2 Sensitivity of modelled BB species to Emission Factors

#### 431 Primary species – CO and BC

- 432 Figure 6 and shows the simulated and observed concentrations of BC and CO for MCE=0.89,
- 433 MCE=0.92 and MCE=0.95 (see Section 2.2.2). Because CO has a negative relationship with
- 434 MCE, and BC has a positive relationship with MCE, the modelled BC concentrations are
- 435 highest for model runs using the highest MCE, while the modelled CO concentrations are
- highest for model runs using the lowest MCE (Figure 6).
- 437 Changing the EF from low to high MCE varies the modelled BC concentrations during BB1
- 438 and BB2 by a factor of ~3 for BC and a factor of ~2 for CO, and increases the EF ratio of
- 439 BC/CO by a factor of ~6, in proportion to the difference in EF input to the models.
- 440 Quantile-quantile plots of observed and modelled ratios of BC/CO during BB1 and BB2 for
- the different EF scenarios are shown in Figure 8Fig S11. The use of BC/CO ratios were used
- 442 to minimise uncertainty resulting from errors in modelling transport, dilution (and mixing

height), thus enabling a focus on the impact of EF variability. A period incorporating both the modelled and observed BB1 and BB2 was used for the analysis. The TAPM-CTM simulation with MCE=0.89 performed best with greater than 60% of the model percentiles falling within a factor of two of the observed. The CCAM-CTM simulation with MCE = 0.89 was the second best performer with 50% of the modelled percentiles falling within a factor of two of the observed. Overestimates of the EC/CO ratio by up to a factor of 8 occur for some percentiles for the MCE=0.95 scenarios, while the scenarios with no fire significantly underestimated the observed ratio. Plots of mean fractional bias and mean fractional error (Fig. S121 and S123) show that TAPM-CTM simulation with MCE=0.89 has the smallest bias and error, followed by the CCAM-CTM simulation with MCE=0.89. As discussed previously there is uncertainty in the derivation of EF as a function of MCE, as these were based on relationships from a small number of studies. Nevertheless, the percentile, bias and error analysis indicates that using emission factors corresponding to an MCE of 0.89 gives the best agreement with the observations for the BC/CO ratio. This is in agreement with the calculated MCE of 0.88 for this fire (Lawson et al., 2015)

# Secondary species - O<sub>3</sub>

For secondary species such as O<sub>3</sub> ( Figure 6e-f), the relationship between EF precursor gases and model output is more complex than for primary species such as CO and BC, because the balance between O<sub>3</sub> formation and destruction is dependent on the degree of dilution of the BB emissions and also factors such as the NMOC composition and the NMOC/NO<sub>x</sub> ratio.

TAPM-CTM (Figure 6e) reproduces the magnitude of both observed peaks following BB1 and BB2 (BB1 max observed = 33 ppb, modelled = 31 ppb, BB2 max observed = 34 ppb, modelled = 30ppb). Interestingly the magnitude of  $O_3$  for these two peaks is the same for different EF inputs of  $O_3$  precursors from the Robbins Island fire, suggesting that the BB emissions are not responsible for these enhancements as demonstrated in Section 3.2. In contrast, the two additional peaks modelled but not seen in the observations are heavily dependent on the input EF. For the first additional modelled peak which was predicted at the time of BB1observations on the  $16^{th}$  February, all EF scenarios result in an  $O_3$  peak, with the MCE=0.92 model scenario resulting in highest predicted  $O_3$ . For the second additional modelled peak just prior to the BB2 observations on the  $23^{rd}$  February, only the MCE=0.89

476 O<sub>3</sub> destruction. 477 This differing response to EF for the TAPM-CTM runs suggests the importance of the NO EF 478 on O<sub>3</sub> production in BB plumes. Unfortunately there were no oxides of nitrogen measurements 479 made during the fire to test the models. For the first simulated additional peak prior to BB1, 480 while the medium NO EF (MCE=0.92) resulted in the highest O<sub>3</sub> peak (with corresponding 481 NO of 3.7 ppb, NO<sub>2</sub> 4.5 ppb) the lower NO EF in the 0.89 MCE run perhaps indicates 482 insufficient NO was present to drive O<sub>3</sub> production (corresponding NO 0.5 ppb, NO<sub>2</sub> 1.5 ppb), 483 which is in line with studies which have shown that BB plumes are generally NO<sub>x</sub> limited 484 (Akagi et al., 2013; Jaffe and Wigder, 2012; Wigder et al., 2013). Conversely the highest input 485 NO EF (MCE=0.95) lead to net destruction of O<sub>3</sub> (NO 9 ppb, NO<sub>2</sub> 7 ppb), which is due to titration of O<sub>3</sub> with the larger amounts of NO emitted from the fire in these runs as indicated 486 487 by excess NO (NO/NO2 ratio > 1) at Cape Grim (where NO has a positive relationship with 488 MCE). For the second additional peak prior to BB2, only the lowest NO EF run (MCE=0.89) 489 resulted in net production of O<sub>3</sub> (NO 1.5 ppb NO<sub>2</sub> 2.6 ppb) in the medium and high MCE runs 490 the background O<sub>3</sub> concentration is completely titrated (0 ppb) with NO concentrations of 10 491 and 20 ppb and NO/NO<sub>2</sub> ratios of 1.3 and 2.6 respectively. 492 In contrast, the CCAM-CTM model (Figure 6f) simulations reproduce only the first observed 493 O<sub>3</sub> peak associated with BB1 (modelled = 27 ppb, measured = 34 ppb). This modelled O<sub>3</sub> peak 494 does not show an influence of MCE on O<sub>3</sub> concentration, in agreement with TAPM, again 495 suggesting no influence from fire emissions as later demonstrated in Section 3.2. The CCAM 496 model runs also show significant titration of O<sub>3</sub> during BB1 and BB2 for the medium and high MCE model runs, with ~24 and ~48 hours of significant O<sub>3</sub> depletion below background 497 498 concentrations being modelled for each event, which was not observed 499 Quantile-quantile plots of modelled and observed concentrations of O<sub>3</sub> for all EF scenarios are 500 shown in Figure 9Figure 8Fig. S14 and S135. Model performance was assessed for both the 501 BB and the background periods in order to test the ability of the models to reproduce O<sub>3</sub> from 502 both the fire and other sources, including urban sources. The modelled O<sub>3</sub> concentrations from 503 the TAPM-CTM simulation with MCE=0.89 are close to the 1:1 line with observations for all 504 of the sampled percentiles, and demonstrates that this scenario is in best agreement with

observations, and as stated previously, in agreement with the calculated MCE of 0.88 for BB2

(Lawson et al., 2015). Ozone titration in the MCE=0.92 and MCE=0.95 scenarios, which was

not observed, is visible as a significant deviation from the 1:1 line in Figure 9Fig S14. With

scenario results in a net O<sub>3</sub> production, while MCE=0.92 and MCE=0.95 scenarios lead to net

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508	the exception of these titration events, all of the sampled model concentration percentiles fall
509	well within a factor of two of the observations. Plots of mean fractional error and mean
510	fractional bias (Figs $S1\underline{46}$ and $S1\underline{57}$ ) show that the error and bias are very low for all runs and
511	fall within performance guidelines.
512	The different EF scenarios presented here suggest that varying model EF has a major impact
513	on whether the models simulate production or destruction of O <sub>3</sub> , particularly important at a
514	receptor site in close proximity to the BB emissions. In the previous work (Lawson et al., 2015)
515	the MCE for the first 10 hours of BB2 was calculated as 0.88, however later in BB2, a rainfal
516	event led to changes in the NMOC/CO and BC/CO ratios. This suggests that during the course
517	of BB2 the MCE decreased and thus EFs changed. As such, the used of fixed BB EF in thi
518	work and in other models, may lead to incorrect prediction of important species such as $O_3$
519	3.1.3 Sensitivity of modelled concentrations to spatial variability
520	The near-field proximity of the Robbins Island fire (20 km) to Cape Grim, the narrowness o
521	the BB plume and the spatial complexity of the modelled wind fields around north Tasmania
522	are likely to result in strong heterogeneity in the modelled concentrations surrounding Cape
523	Grim. We investigated how much model spatial gradients vary by sampling TAPM-CTM
524	output with MCE=0.89 at 4 grid points sited 1 km to the north, east, south and west of Cape
525	Grim.
526	Primary species - CO
527	Figure 10a shows a time series of the modelled CO output of the difference between Cape
528	Grim and each grid point 1km either side.
529	Where plotted CO concentration is other location [CO] (N,S,E,W) –Cape Grim [CO].
530	The figure clearly shows that there are some large differences in the modelled concentrations
531	of CO between grid points for both BB1 and BB2. Particularly large differences were seen fo
532	BB2 with the north gridpoint modelled concentrations in BB2 over 500 ppb lower than at Cape
533	Grim grid point, while at the Southerly grid point the modelled CO was up to 350 ppb higher
534	Smaller differences of up to 250 ppb between the east and Cape Grim grid points were observed
535	for BB1. This indicates the plume from the fire was narrow and had a highly variably impact
536	on the area immediately surrounding Cape Grim.
537	Figure 10 <del>Figure 8</del> b shows the observed cumulative concentration of CO over the 29 hou

duration of BB2 at Cape Grim, as well as the modelled cumulative concentration at Cape Grim

539 and at the four gridpoints either side. This figure shows both the variability in concentration with location, but also with time. TAPM-CTM's underestimation of the observed CO by is 540 541 visible by hour 20. TAPM-CTM begins to show differences in modelled cumulative CO 542 concentrations between the 5 gridpoints (including Cape Grim) by hour 10. At the end of BB2 543 TAPM-CTM predicts that there are differences of 5 - 30% between the cumulative modelled 544 CO concentration at Cape Grim and the gridpoints to the north, east, south and west. his 545 variability modelled between sites which are closely located highlights the challenges with 546 modelling the impact of a near field fire at a fixed single point location. This also highlights 547 the high spatial variability which may be missed in similar situations by using a coarser 548 resolution model which would dilute emissions in a larger gridbox.

# 549 **Ozone** (O<sub>3</sub>)

- Figure 10Figure 8c shows a time series of the modelled O<sub>3</sub> output of the difference between
- Cape Grim and each gridpoint 1km either side, where plotted  $O_3$  concentration is other location
- 552 [O<sub>3</sub>] (N,S,E,W) Cape Grim [O<sub>3</sub>].
- 553 The modelled TAPM-CTM concentrations are very similar at all grid points when BB
- emissions are not impacting. The variability increases at the time of BB1 and BB2, with
- differences mostly within 2-3 ppb, but up to 15 and 10 ppb at east and west sites for BB1. This
- 556 largest difference corresponds to the additional modelled O<sub>3</sub> peak which was not observed
- 557 which showed strong dependency on EF (see Section 3.1.2), and provides further evidence that
- local BB emissions are driving this enhancement.
- The TAPM-CTM output for O<sub>3</sub> for BB1(Figure 7Figure 7) shows O<sub>3</sub> enhancement downwind
- of the fire at 11:00 and 13:00 on the 16 February. The very localised and narrow O<sub>3</sub> plume is
- dispersed by the light (2 m s<sup>-1</sup>) and variable winds, and Cape Grim is on the edge of the O<sub>3</sub>
- plume for much of this period, explaining the high variability seen in Figure 6c.
- 563 In summary there is a large amount of spatial variability in TAPM-CTM for primary species
- such as CO during the BB events, with differences of > 500 ppb in grid points 1 km apart. This
- is due to the close proximity of the fire to the observation site and narrow plume non-stationary
- meteorology. For O<sub>3</sub>, there is up to 15 ppb difference between grid points for a narrow O<sub>3</sub>
- 567 plume which is formed downwind of the fire.
- 568 The highly localised nature of the primary and in some cases secondary species seen here
- highlights the benefits of assessing spatial variability in situations with a close proximity point
- 570 source and a fixed receptor (measurement) site.

#### 3.2 Exploring plume chemistry and contribution from different sources

#### 572 3.2.1 Drivers of O<sub>3</sub> production

- 573 In previous work on the Robbins Island fire, it was noted that the increases in O<sub>3</sub> observed after
- both BB1 and BB2 were correlated with increased concentration of HFC134a (Lawson et al.,
- 575 2015). This indicated that transport of photochemically processed air from urban areas to Cape
- 576 Grim was likely the main driver of the O<sub>3</sub> observed, rather than BB emissions (Lawson et al.,
- 577 2015). However, during BB1 in a calm sunny period with minimal urban influence, an increase
- 578 in O<sub>3</sub> was observed alongside a period of particle growth and elevated BC, suggesting possible
- 579 biomass burning influnce. Normalised Excess Mixing Ratios (NEMR) observed during BB2
- 580 were also in the range of those observed elsewhere in young BB plumes (Lawson et al., 2015)
- 581 (where NEMR is an excess mixing ratio normalised to a non-reactive co-emitted tracer, in this
- 582 case CO, see Akagi et al., 2011).
- 583 To explore this further, TAPM-CTM was used to determine the degree to which the local fire
- 584 emissions, and urban emissions from mainland Australia, were driving the observed O<sub>3</sub>
- 585 enhancements. The scenario with EF corresponding to MCE=0.89 was used, as discussed
- 586 previously

- Figure 11Figure 9 shows the simulated ozone for all sources (With BB) and all sources
- 588 excluding the Robbins Island fire (No BB). There are two additional distinct ozone peaks in
- the 'With BB' simulation (Figure 11 Figure 9). These occured\_during, or close to the plume
- 590 strikes, and are short lived (3 and 5 hour) events. These same two peaks showed a strong
- dependance on model EF in Section 3.1.2. In contrast, the two peaks attributed to transport of
- 592 air from mainland Australia are of longer duration, and occur after the plume strikes.
- Of the 2 modelled fire-derived  $O_3$  peaks, the first modelled peak (33 ppb) corresponds with a
- 594 small (21 ppb) observed peak during BB1 (Period B in Lawson et al., 2015), but the second
- 595 modelled fire-derived O₃ peak is not observed. As shown in Figure 7 Figure 7 and discussed in
- Section 3.1.3, according to TAPM-CTM the O<sub>3</sub> plumes generated from fire emissions were
- narrow and showed a strong spatial variability. Given this, it is challenging for TAPM-CTM
- 598 to predict the exact timing and magnitude of these highly variable BB generated  $O_3$  peaks
- 599 impacting Cape Grim. This is likely why there is good agreement in timing and magnitude
- 600 between model and observations for the large scale, spatially homogeneous O<sub>3</sub> plumes
- transported from mainland Australia, but a lesser agreement for the locally formed, spatially
- ovariable O<sub>3</sub> formed from local fire emissions.

In summary, TAPM-CTM suggests that the two largest observed O<sub>3</sub> peaks followng BB1 and BB2 were urban air transported from mainland Australia, and suggests some O<sub>3</sub> formation was driven by emissions from the local fire event. TAPM-CTM captures the magnitude and timing of the larger scale urban-derived peaks well, but is challenged by the timing and magnitude of O<sub>3</sub> from local BB emissions.

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## 3.2.2 Plume age

TAPM-CTM was used to estimate the physical age of air parcels reaching Cape Grim over the two week period of the Robbins Island fire. The method is similar to the Eulerian effective physical age of emissions metric, accounting for mixing and chemical decay from Finch et al (2014) and has been described previously in Keywood et al., (2015). Briefly, two model simulations were run for scenarios which included all sources of nitric oxide (NO) in Australia; the first treated NO as an unreactive tracer, the second with NO decaying at a constant first order rate. The relative fraction of the emitted NO molecules remaining after 96 hours was then inverted to give a molar-weighted plume age. As urban emissions are a larger NO source than BB, this approach would weight the age in the favour of the urban emissions if air masses from these two sources were mixed. However as shown in Figure 11Figure 9, there are distinct periods where BB or urban sources dominate. As there is little mixing of air from the two sources, there are unlikely to be issues with the calculated age being weighted towards one source. Figure 12 Figure 10 shows a time series of the modelled NO tracer (decayed version), modelled plume age (hours) and the observed O<sub>3</sub>. Direct BB1 and BB2 plume strikes can be clearly seen with increases in NO corresponding with a plume age of 0-2 hours. The plume age then gradually increases over 24 hours in both cases, peaking at 15:00 on the 17th February during BB1 (aged of plume 40 hours) and peaking at 17:00 on the 25th February during BB2 (age of plume 49 hours). The peak observed O<sub>3</sub> enhancements correspond with the simulated plume age in both BB1 and BB2 (with an offset of 2 hours for BB1), and the observed HFC-134a, suggesting that the plume which transported O<sub>3</sub> from Mebourne to Cape Grim was approximately 2 days old. TAPM-CTM also simulates a smaller NO peak alongside the maximum plume age, indicating transport of decayed NO from the mainland to Cape Grim.

As reported in Lawson et al., (2015), during BB2 NEMRs of  $\Delta O_3/\Delta CO$  ranged from 0.001-0.074, in agreement with  $O_3$  enhancements observed in young BB plumes elsewhere (Yokelson et al., 2003; Yokelson et al., 2009). However, the modelling reported here suggests that almost

all of the  $O_3$  observed during BB2 was of urban, not BB origin. This suggests NEMRs should not be used in isolation to identify the source of observed  $O_3$  enhancements, and highlights the value of utilising air mass back trajectories and modelling to interpret the source of  $O_3$  enhancements where there are multiple emission sources.

#### 4 Summary and conclusions

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- In this work we have used a unique set of opportunistic BB observations at Cape Grim Baseline
- 641 Air Pollution Station to test the ability of CSIRO's high resolution (400m grid cell) CTM to
- 642 reproduce primary (CO, BC) and secondary (O<sub>3</sub>) BB species in challenging non-stationary,
- inhomogeneous, and near field conditions. We tested the sensitivity of the CTM to three
- 644 different parameters (meteorology, MCE and spatial variability) while holding the plume rise
- and the chemical mechanisms constant.
- We found meteorology, EF and spatial variability have a large influence on the modelled output
- mainly due to the close proximity of the fire to the receptor site (Cape Grim). The lower MCE
  - (MCE=0.89) TAPM-CTM model simulation provided the best agreement with the observed
- 649 concentrations, in agreement with the MCE calculated from observations of 0.88 (Lawson et
- al., 2015). The changing EFs, in particular NO dependency on MCE, had a major influence on
- the simulated O<sub>3</sub> concentrations, with a tendency of the models in some configurations to both
- fail to simulate observed O<sub>3</sub> peaks, and to simulate complete titration of O<sub>3</sub> which was not
- observed. As shown in the previous work (Lawson et al., 2015), minor rainfall events have the
- potential to significantly alter EF due to changes in combustion processes. This work suggests
- 655 that varying model EF has a major impact on whether the models predict production or
- destruction of O<sub>3</sub>, particularly important at a receptor site in close proximity to the BB
- emissions. Models which assume a fixed EF for O<sub>3</sub> precursor species in an environment with
- 658 temporally and spatially variable EF may therefore be challenged to correctly predict the
- 659 behaviour of important species such as O<sub>3</sub>.
- There were significant differences in model output between Cape Grim and grid points 1 km
- away highlighting the narrowness of the plume and the challenge of predicting when the plume
- 662 would impact the station. This also highlights the high spatial variability which may be missed
- in similar situations by using a coarser resolution model which would dilute emissions in a
- 664 larger gridbox.
- TAPM-CTM was used to distinguish the influence of the two sources on the observed O<sub>3</sub>
- enhancements which followed BB1 and BB2. Transport of a 2 day old urban plume some

- 667 300km away from Melbourne was the main source of the O<sub>3</sub> enhancement observed at Cape
- 668 Grim over the two week period of the fire. Despite NEMRs of ΔO<sub>3</sub>/ΔCO during BB2 being
- 669 similar to that observed in young BB plumes elsewhere, this work suggests NEMRs should not
- 670 be used in isolation to identify the source of observed O<sub>3</sub> enhancements, and highlights the
- 671 value of utilising air mass back trajectories and modelling to interpret the source of O<sub>3</sub>
- enhancements where there are multiple emission sources.

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Table 1. EF used in model sensitivity studies, corresponding to low (MCE=0.89), medium (MCE=0.92) and high (MCE = 0.95) MCEs. A subset of the total species included in the CB05 lumped chemical mechanism are shown. Also shown are savannah EF from Andreae and Merlet (2001) (A&M) and EF calculated from BB2 in previous work (Lawson et al., 2015). NO = nitric oxide, CO = carbon monoxide, PAR=paraffin carbon bond, OLE= terminal olefin carbon bond, TOL=toluene and other monoalkyl aromatics, XYL=xylene and other polyalkyl aromatics, BNZ = benzene, FORM=formaldehyde, ALD2=acetaldehyde, EC=elemental carbon <10  $\mu$ m, OC=primary organic carbon < 10  $\mu$ m

		EF g kg <sup>-1</sup>				
	A&M (2001)	Lawson et al., (2015)	Used in this work			
	MCE 0.94	MCE 0.88	MCE 0.89	MCE 0.92	MCE 0.95	
NO	3.9	n/a	0.8	2.7	4.7	
CO	65	127	121	89	57	
PAR	1.55	n/a	2.33	2.02	1.40	
OLE	0.54	n/a	0.81	0.7	0.49	
TOL	0.2	0.30	0.3	0.26	0.18	
XYL	0.045	0.26	0.07	0.06	0.04	
BNZ	0.23	0.69	0.35	0.3	0.21	
FORM	0.42	1.64	0.63	0.55	0.38	
ALD2	0.5	0.92	0.75	0.65	0.45	
EC	0.48	0.16	0.19	0.34	0.53	
OC	3.40	n/a	5.10	4.08	3.06	
NMOC/NO <sub>x</sub>	1.60	n/a	11.99	2.97	1.20	

# Table 2. Summary of sensitivity study results, including Meteorology, Emission Factors and Spatial Variability.

Sensitivity study	Species	TAPM-CTM simulation	CCAM-CTM simulation	Comments/drivers of model outputs
Meteorology (Section 3.1.1)	BC and CO	BB1 plume strike +3 hr Duration 12 hr (actual 5 hr)	BB1 plume strike -12 hr Duration 36 hr intermittent (actual 5 hr)	Narrow BB plume. Differences in plume strike due to timing of wind direction change; windspeeds; direct or indirect advection of plume over Cape Grim
		BB2 plume strike -26 hr Duration 50 hr (actual 29 hr)	BB2 plume strike -26 hr Duration 57 hr (actual 29 hr)	Wind direction differences driven by gravity wave oscillations; timing of wind direction change; different wind speeds driving absolute BB emissions and plume dispersion
	O <sub>3</sub>	4 O <sub>3</sub> peaks simulated (2 observed, 2 not)	1 O₃ peak simulated (observed)	Differences in simulated wind speed and direction (and EF – see below)
Emission Factors (Section 3.1.2)	BC and CO	BC peak magnitude varies by factor 3, CO factor 2 with different EF runs	As for TAPM -CTM	Concentrations vary according to EF input ratios.
,	O <sub>3</sub>	2 peaks with high EF sensitivity, 2 peaks with no EF sensitivity	1 peak with no EF sensitivity	Different NMOC/NO₂ emission ratios (varies with MCE) drives destruction or production of O₃ in fire related peaks.  MCE 0.89 TAPM-CTM simulation gives best agreement with observations
Spatial Variability (Section 3.1.3)	СО	Differences of up to > 500 ppb in grid points 1 km apart (BB2)	n/a	Narrow BB plume
	O <sub>3</sub>	Differences of up to 15 ppb in grid points 1 km apart (BB1)	n/a	Narrow ozone plume generated downwind of fire

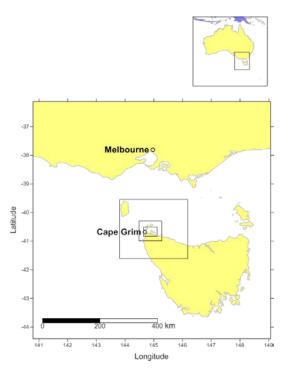
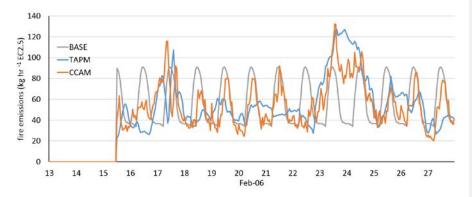


Figure 1. The five nested computational domains used in TAPM-CTM and CCAM-CTM, showing cell spacings of  $20~\rm{km}$ ,  $12~\rm{km}$ ,  $3~\rm{km}$ ,  $1~\rm{km}$  and  $400~\rm{m}$ .



Figure~2~Base~hourly~diurnal~emissions~and~revised~Macarthur~Fire~Danger~Index~(FDI)-scale~emissions~generated~using~TAPM~and~CCAM~meteorology.



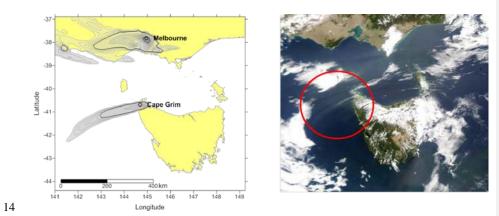
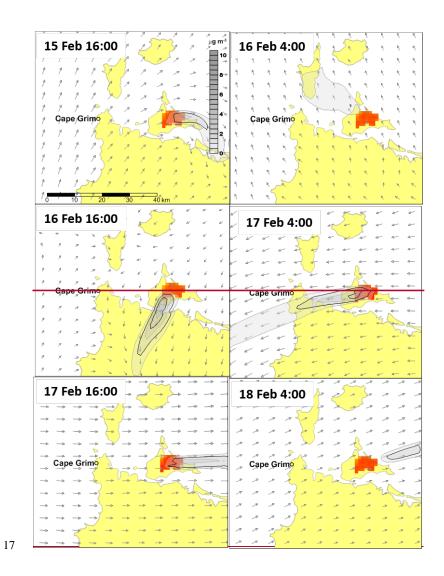


Figure 3. Model output of BC (left) on the 23rd February, with a MODIS Truecolour image of the same period.



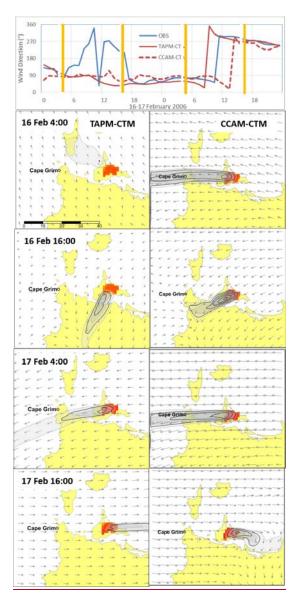


Figure 4. Model concentration isopleth of BC for TAPM-CTM (left panels) and CCAM-CTM (right panels). Panels show Model output of BC for TAPM-CTM at 12 hour time intervals during BB1, showing including the Robbins Island BB plume intermittently striking Cape Grim, and then the change in plume direction with wind direction change. Arrows are wind vectors. The time series of observed and modelled wind direction for BB1 is shown above with orange bands highlighting the periods corresponding to the panels.

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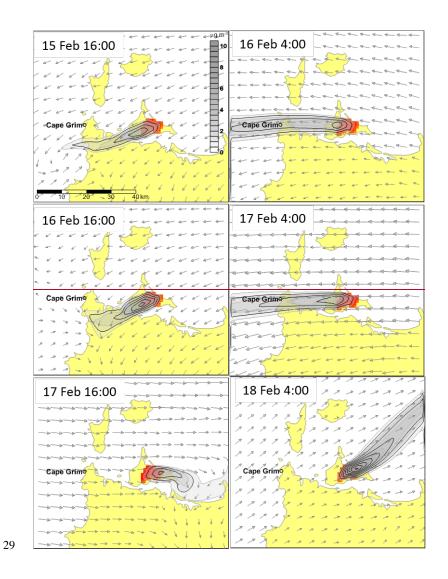
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Model output of BC for CCAM-CTM at 12 hour time intervals during BB1, showing the Robbins Island
 BB plume intermittently striking Cape Grim, and then the change in plume direction with wind direction
 change. Arrows are wind vectors.

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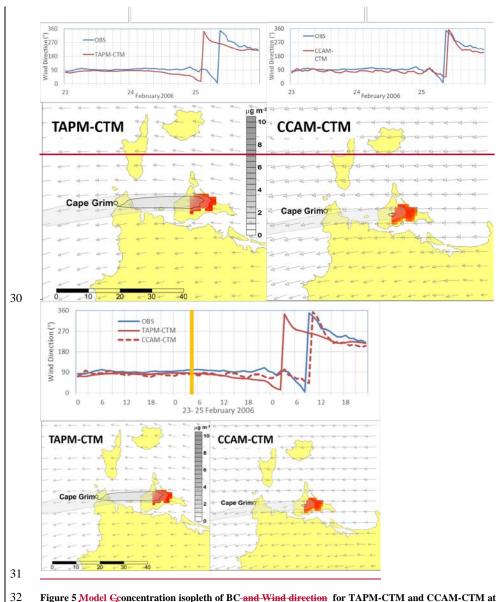


Figure 5 <u>Model Concentration</u> isopleth of BC and Wind direction for TAPM-CTM and CCAM-CTM at 05:00 on the 24 February during BB2. <u>Arrows are wind vectors. The time series of observed and modelled wind direction for BB2 is shown above with an orange band highlighting the period corresponding to the <u>panels</u>.</u>

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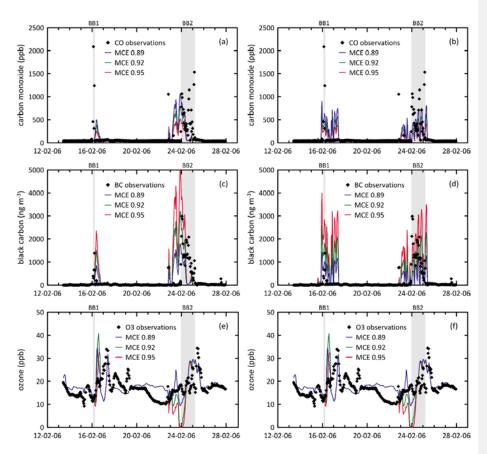


Figure 6. Simulated CO using a) TAPM-CTM and b) CCAM-CTM, simulated BC using c) TAPM-CTM and d) CCAM-CTM, and simulated O<sub>3</sub> using e) TAPM-CTM and f) CCAM-CTM. Coloured lines represent different MCE EF simulations, black symbols are observations

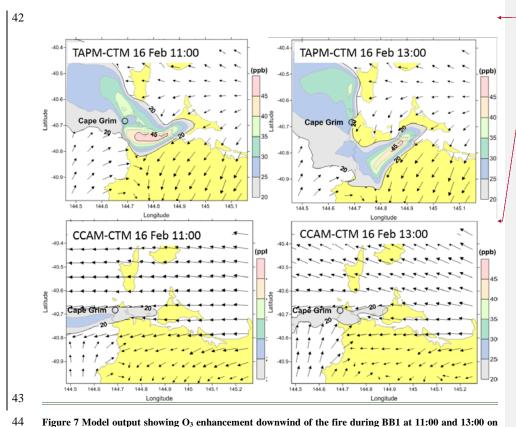


Figure 7 Model output showing  $O_3$  enhancement downwind of the fire during BB1 at 11:00 and 13:00 on the 16 February for TAPM-CTM (top) and CCAM-CTM (bottom). The spatially variable plume and complex wind fields are shown. Arrows are wind vectors.

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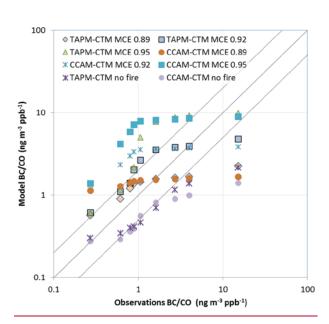


Figure 8 Quantile-quantile plots of observed and modelled BC/CO ratios for the TAPM-CTM and CCAM-CTM simulations. For each scenario, the model-data pairs correspond to the following percentiles- 0.2, 0.3, 0.4, 0.5, 0.6, 0.7, 0.8, 0.9 and 1. Note log scale on both axes. Solid line is 1:1 and dotted lines show performance within a factor of two.

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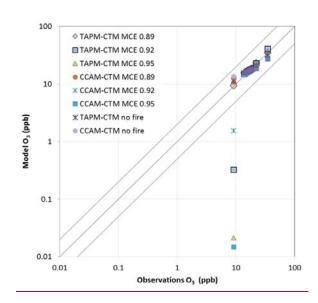
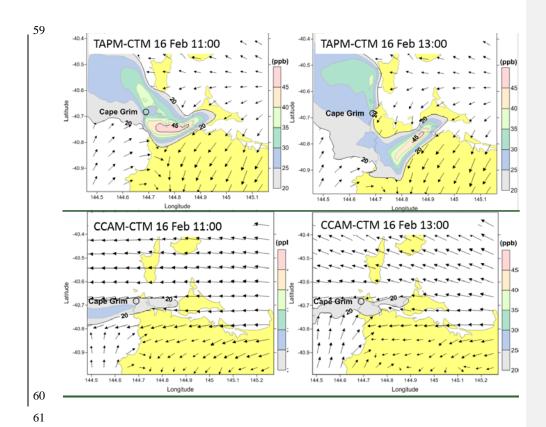


Figure 9 Quantile-quantile plots of observed and modelled  $O_3$  for the TAPM-CTM and CCAM-CTM simulations. For each scenario, the model-data pairs correspond to the following percentiles- 0.2, 0.3, 0.4, 0.5, 0.6, 0.7, 0.8, 0.9 and 1. Note log scale on both axes. Solid line is 1:1 and dotted lines show performance within a factor of two.

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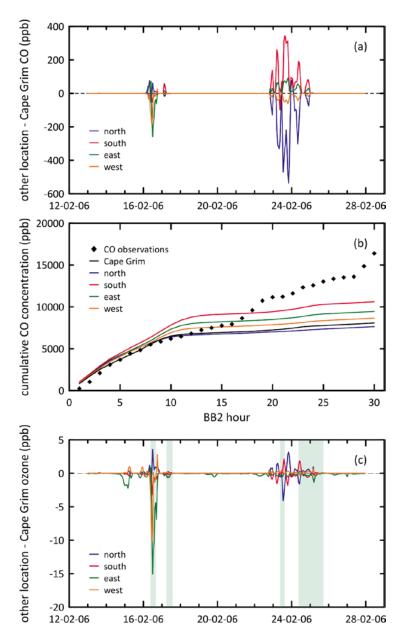


Figure 10 Simulated spatial variability using TAPM-CTM with MCE=0.89 showing a) time series of CO over two weeks of fire (BB1 and BB2 shown), b) the observed and modelled cumulative concentration of CO over the 29 hour duration of BB2 and c) time series of  $O_3$  over the two weeks of fire. The four modelled  $O_3$  peaks in the Cape Grim gridpoint are shaded. Figs a and c show the difference between simulated

concentrations at Cape Grim and at 4 surrounding grid points 1km north, south, east and west of Cape Grim.Fig b shows simulated cumulative CO at Cape Grim and at 4 surrounding grid points. . Observations are black symbols.



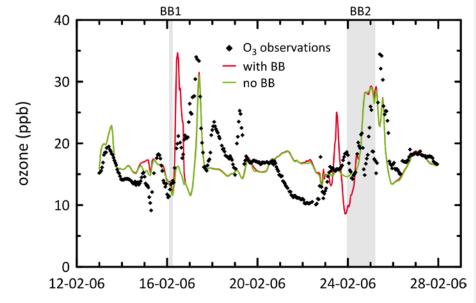


Figure 11 Simulated O<sub>3</sub> concentration at Cape Grim with the Robbins Island fire emissions (red line) and without the fire emissions (green line). Observations are black symbols. Model used was TAPM-CTM with EF corresponding to MCE=0.89. The periods corresponding to observed BB1 and BB2 are shaded.

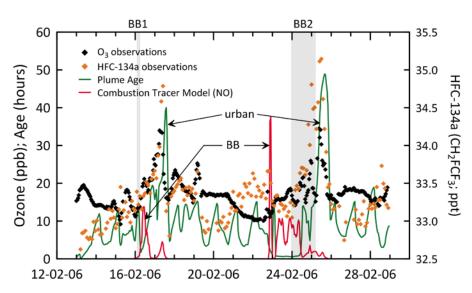


Figure 12 Simulated plume age (green line), simulated combustion tracer (NO) (red line), observed  $O_3$  (black symbols) and observed HFC-134a (orange symbols) over 2 week duration of the fire. The modelled BB periods (red peaks) and impact of urban air from mainland Australia (green peaks) are labelled. The periods corresponding to observed BB1 and BB2 are shaded.

End