



Article

# Sources of Particulate Matter in the Hunter Valley, New South Wales, Australia

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Received: 29 October 2019; Accepted: 2 December 2019; Published: 18 December 2019



Abstract: Exposure to particulate matter results in adverse health outcomes, especially in sensitive members of the community. Many communities that co-exist with industry are concerned about the perceived impact of emissions from that industry on their health. Such concerns have resulted in two studies in the Hunter Valley of New South Wales, Australia. The chemical composition of samples of particulate matter, collected over two 12-month sampling periods (2012 and 2014–2015) at six sites in the Hunter Valley and across two size fractions (PM<sub>2.5</sub> and PM<sub>2.5-10</sub>) were input to a receptor model to determine the source of particulate matter influencing particle composition at the sites. Fourteen factors were found to contribute to particle mass. Of these, three source profiles common to all sites, size fractions, and sampling periods were sea salt, industry-aged sea salt and soil. Four source profiles were common across all sites for PM<sub>2.5</sub> including secondary sulphate, secondary nitrate, mixed industry/vehicles, and woodsmoke. One source profile (other biomass smoke) was only identified in PM<sub>2.5</sub> at Singleton and Muswellbrook, two source profiles (mixed industry/shipping and vehicles) were only identified in PM<sub>2.5</sub> at Newcastle, Beresfield, Mayfield, and Stockton, and one source (primary nitrate) was only identified at Stockton in  $PM_{2.5}$ . Three sources (bioaerosol, light absorbing particles (coal dust), and industry) were only identified in the PM<sub>2.5-10</sub> size fraction at Mayfield and Stockton. The contribution of the soil factor to PM<sub>2.5</sub> mass was consistent across the sites, while the fresh sea salt factor decreased with distance from the coast from 23% at Stockton to 3% at Muswellbrook, and smoke increased with distance from the coast. Primary industry was greatest at Stockton (due to the influence of ammonium nitrate emitted from a prilling tower) and lowest inland at Muswellbrook. In general, primary emissions across the sites accounted for 30% of the industry sources. The largest contribution to PM<sub>2.5</sub> was from secondary sources at all sites except at Muswellbrook, where woodsmoke and industry sources each made an equal contribution of 40%. In general, secondary reactions accounted for approximately 70% of the industry source, although at Stockton, with the presence of the prilling tower, this split was 50% primary and 50% secondary and at Muswellbrook, the split was 20% primary and 80% secondary. These findings add to the evidence base required to inform policies and programs that will improve air quality in the Hunter Valley.

Keywords: PMF; aerosol chemical composition; source apportionment

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#### 1. Introduction

Community concern about the perceived impact of industry on air pollution can be an important driver for research into the sources of air pollution. Atmospheric particles are one of the most significant air pollutants with respect to human mortality and morbidity [1], even at concentrations below the current air quality standards, and were responsible in 2015 for nine million premature deaths globally [2]. Exposure to atmospheric particles causes respiratory and circulation problems, particularly in elderly people, children, and people with existing health conditions. According to the World Health Organization [3], particulate matter affects more people than any other air pollutant and its effects on health occur at levels of exposure currently being experienced by most urban and rural populations in developed countries. Even chronic exposure to low concentrations of fine particulate matter have been found to be associated with detrimental health effects such as has been documented for Sydney [4].

Particles can be emitted directly into the atmosphere by both anthropogenic activities and from natural sources (known as primary particles) or can be produced in the atmosphere by oxidation of precursor gases (of anthropogenic and natural origins) to form volatile products that form new particles or condense onto existing particles (known as secondary particles). Particles in the atmosphere vary in size, with particles less than 10 microns ( $\mu$ m) in diameter (PM<sub>10</sub>) and fine particles less than 2.5 microns in diameter being the focus of air quality monitoring and management. PM<sub>10</sub> comprises fine particles (smaller than 2.5 microns, termed PM<sub>2.5</sub>) and coarse particles (ranging in size from 2.5 to 10 microns, termed PM<sub>2.5-10</sub>). The fact that particles are made up of a complex mixture of sizes and chemical compositions that are dependent on the source of the particles, means that the chemical composition as a function of particle diameter can tell us something about the sources of particles in an airshed.

In this paper, we report on two studies that were carried out in the Hunter Valley of New South Wales (NSW), Australia to determine the sources of particles contributing to PM<sub>2.5</sub> and PM<sub>2.5-10</sub> in the region. The Hunter Valley, often divided into the Upper Hunter Valley (inland) and Lower Hunter Valley (near the coast) is located approximately 120 km (at the coast Newcastle) to 310 km (inland) north of Sydney and is home to a number of moderately sized towns with a range of commercial and domestic emissions as well as activities such as open cut coal mining, the transportation of coal to the Newcastle Port, the loading of coal into ships at the port, and the combustion of coal for power generation. A significant proportion of NSW electricity is generated by coal-fired power stations located in the Hunter Valley and fuelled with locally mined coal. Two studies were initiated by the NSW Government to address community concerns about particle pollution from industrial activities in the region. This also improves our knowledge beyond that available from existing emissions inventories which include data on primary particles from anthropogenic sources but rely on modelling for estimating secondary particle concentrations.

This paper focuses on synthesizing the results from the following two studies into an assessment of the sources of fine and coarse particles and the relative importance of the sources influencing the region in a typical year:

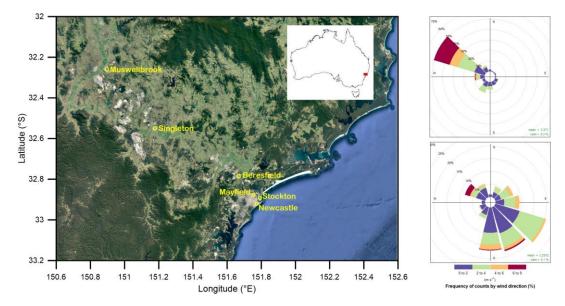
- 1. The Upper Hunter Fine Particle Characterization Study, which took place in 2012 and focused on  $PM_{2.5}$  sampled at two towns in the Upper Hunter Valley [5]; and
- 2. The Lower Hunter Particle Characterization Study that took place in 2014–2015 and focused on  $PM_{2.5}$  and  $PM_{2.5-10}$  sampled at four locations in the Lower Hunter Valley [6].

# 2. Methods

#### 2.1. Sampling Locations

Samples were collected at six locations in the Hunter Valley NSW, Australia (Figure 1). Two sampling sites were located in the Upper Hunter Region in the towns of Singleton and Muswellbrook. Many open-cut coal mines are close to the towns and there are two major coal-fired power stations situated between the two towns with a total installed generating capacity of 5.6 GW.

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**Figure 1.** Map showing the study location and sampling locations in the Hunter Valley and wind directions in June, July, August (**top** windrose) and December, January, February (**bottom** windrose). Large open-cut coal mining areas are visible in the vicinity of Muswellbrook and Singleton.

Four sampling sites were located in the Lower Hunter Region at Beresfield, Mayfield, Stockton, and Newcastle. The Lower Hunter Region is where the Hunter River valley opens out to a coastal plain along the NSW east coast. Major urban areas include the city of Newcastle and the Maitland regional centre. The Newcastle–Maitland urban area has a population of 430,000, with the highest population density of 2900 km<sup>-2</sup> in the city of Newcastle [7]. The Port of Newcastle is the largest bulk shipping port on the east coast of Australia and an internationally significant coal export port.

Wind directions at each site are generally aligned along the valley on a north-west to south-east axis. During the winter (June-August) off-shore, west-north-westerly airflow prevails over the region while during the summer (December-February), south-easterly (on-shore) airflow dominates the region (Figure 1). Spring and autumn seasons are characterised by more varied airflow patterns, with wind from the north-western and south-eastern quadrants prevalent across much of the region. On a daily basis, the land-sea breeze circulation results in on-shore (easterly component) sea breezes during the daytime and off-shore land breezes at the surface during the night time.

#### 2.2. Sample Collection

Samples of particulate matter were collected over two measurement campaigns. The Upper Hunter Study was carried out in 2012 at two locations (Singleton and Muswellbrook) using  $PM_{2.5}$  samplers. The Lower Hunter Study was carried out in 2014–2015 at four locations (Newcastle, Beresfield, Mayfield, and Stockton) and included the collection of  $PM_{2.5}$  and  $PM_{2.5-10}$  samples. The instruments used to collect the samples at each location are shown in Table 1.

The filter substrate used to collect particulate matter samples was dependent on the analysis to be performed on the filters. Table 1 also lists the filter substrates used in each sampler and the parameters analysed on each substrate.

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**Table 1.** Sampling location, instrumentation, size fractions, filter types and parameters analysed on the different filter types. (OEH – Office of Environment & Heritage; AQM—Air Quality Monitoring; OC—organic carbon; EC—elemental carbon; BC—black carbon).

Sampling Site and Time	Equipment, Size Fraction and Filter Type	Analysis
OEH Singleton AQM Station 1 January to 31 December 2012	One Ecotech HiVol 3000 high volume sampler with a PM <sub>2.5</sub> size selective inlet with quartz tissue filters One ANSTO ASP (Aerosol Sampling Program) PM <sub>2.5</sub> particulate Cyclone samplers with 25 mm stretched Teflon filters	OC & EC (quartz) Gravimetric mass, elements, BC & soluble ions (Teflon)
OEH Muswellbrook AQM Station 1 January to 31 December 2012	One Ecotech HiVol 3000 high volume sampler with a PM <sub>2.5</sub> size selective inlet with quartz tissue filters One ANSTO ASP PM <sub>2.5</sub> particulate cyclone sampler with 25 mm stretched Teflon filters	OC & EC (quartz) Gravimetric mass, elements, BC & soluble ions
OEH Newcastle AQM Station 1 March 2014 to 28 February 2015	Two ANSTO ASP PM <sub>2.5</sub> cyclone samplers—one collecting on a Teflon filter and one on a quartz filter	OC & EC (quartz) Gravimetric mass, elements, BC & soluble ion (Teflon)
OEH Beresfield AQM Station 1 March 2014 to 28 February 2015	Two ANSTO ASP PM <sub>2.5</sub> cyclone samplers—one collecting on a Teflon filter and one on a quartz filter	OC & EC (quartz) Gravimetric mass, elements, BC & soluble ion (Teflon)
OEH Mayfield AQM Station 1 March 2014 to 28 February 2015	One GENT stacked filter unit (SFU) sampling 'coarse' (PM <sub>2.5-10</sub> ) particles on a Nuclepore filter and 'fine' (PM <sub>2.5</sub> ) particles on a quartz filter One ANSTO ASP PM <sub>2.5</sub> cyclone sampler collecting fine particles on a Teflon filter	Gravimetric mass, elements, BC & soluble ion (Nuclepore) OC&EC (quartz) Gravimetric mass, elements, BC & soluble ion (Teflon)
OEH Stockton AQM Station 1 March 2014 to 28 February 2015	One GENT SFU sampling 'coarse' (PM <sub>2.5-10</sub> ) particles on a Nuclepore filter and 'fine' (PM <sub>2.5</sub> ) particles on a quartz filter One ANSTO ASP PM <sub>2.5</sub> cyclone sampler collecting fine particles on a Teflon filter	Gravimetric mass, elements, BC & soluble ion (Nuclepore) OC&EC (quartz) Gravimetric mass, elements, BC & soluble ion (Teflon)

## 2.3. Analysis

#### 2.3.1. Mass Measurement

The mass of particulate matter on the samples was determined gravimetrically. The filters were weighed before and after the sampling period to determine the particulate mass collected and then divided by the total volume of air that passed through the filter to obtain the particulate mass concentration. The weighing was performed under controlled conditions of 22  $\pm$  2 °C and 50  $\pm$  10% relative humidity.

# 2.3.2. Chemical Composition

Elemental composition was analysed on the  $PM_{2.5}$  Teflon filters and the  $PM_{2.5-10}$  nucleopore filters non-destructively using nuclear ion-beam analysis (IBA) techniques including proton induced x-ray emission (PIXE) [8], proton induced gamma-ray emission PIGE) [9], and proton elastic scattering analysis (PESA) [10]. The elements analysed were hydrogen (H), sodium (Na), aluminium (Al), silicon (Si), phosphorous (P), sulphur (S), chlorine (Cl), potassium (K), calcium (Ca), titanium (Ti), vanadium (V), chromium (Cr), manganese (Mn), iron (Fe), cobalt (Co), nickel (Ni), copper (Cu), zinc (Zn), bromine (Br), and lead (Pb).

The concentration of soluble ions was determined on PM samples by ion chromatography. The  $PM_{2.5}$  Teflon filters and the  $PM_{2.5-10}$  Nucleopore filters were analysed for major water-soluble ions by suppressed ion chromatography (IC) and for anhydrous sugars including levoglucosan by high-performance anion-exchange chromatography with pulsed amperometric detection.

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These methods are described in detail elsewhere [11]. The species whose concentrations were determined were chloride (Cl $^-$ ), nitrate (NO $_3$  $^-$ ), sulphate (SO $_4$  $^2$  $^-$ ), oxalate (C $_2$ O $_4$  $^-$ ), formate (HCOO $^-$ ), acetate (CH $_3$ COO $^-$ ), phosphate (PO $_4$  $^3$  $^-$ ), methanosulphonate (MSA $^-$ ), sodium (Na $^+$ ), ammonium (NH $_4$  $^+$ ), magnesium (Mg $^2$ +), calcium (Ca $^2$ +), potassium (K $^+$ ), levoglucosan (C $_6$ H $_{10}$ O $_5$ , an anhydrous sugar–woodsmoke tracer), arabitol, and mannitol.

Elemental and organic carbon analysis was performed on the quartz filters using a DRI Model 2001A Thermal-Optical Carbon Analyzer following the IMPROVE-A temperature protocol [12]. Details of the method used in this study can be found [11]. The IMPROVE-A carbon method measures four organic carbon (OC) fractions at four non-oxidizing heat ramps (OC1 at 140  $^{\circ}$ C, OC2 at 280  $^{\circ}$ C, OC3 at 480  $^{\circ}$ C, and OC4 at 580  $^{\circ}$ C) and three elemental carbon (EC) fractions at three oxidizing heat ramps (EC1 at 580  $^{\circ}$ C, EC2 at 740  $^{\circ}$ C, and EC3 at 840  $^{\circ}$ C).

Black carbon (BC) was measured on the 25 mm Teflon filters by the laser integrated plate method (LIPM). Full details can be found in [13].

## 2.3.3. Receptor Modelling using Positive Matrix Factorisation (PMF)

Positive matrix factorisation (PMF) is a mathematical method that relies on internal correlations between species in the dataset to identify both the factors contributing to the samples and the amount that each factor contributes to the composition measured on the filter [14,15]. Sources are identified from the factors using the species that contribute to the factor, knowledge of atmospheric chemistry, and other information such as meteorological data. In some instances, a single source dominates the factor and in others, sources that are co-located or otherwise correlated can appear together in a single factor or across several factors. PMF can identify factors representing species or groups of species that are directly emitted (primary particles) and those formed by chemical reactions in the atmosphere and gas-to-particle conversions (secondary particles).

In this work, the chemical composition data of all the samples was analysed using the U.S. Environmental Protection Agency's EPA PMF 3.0 [16] and EPA PMF 5.0 software [17]. The uncertainty in the factor contributions was derived from the bootstrapping and displacement methods. Note that the uncertainties are not symmetric about the best fit and are not standard deviations, but rather represent confidence intervals that with a high probability contain the (unknown) true values. Some factor contributions have relatively little uncertainty (e.g., the fresh sea-salt factor) whereas others are much more uncertain (e.g., the mixed industry/vehicle factor).

Forty-five species were produced by the analytical methods used in these studies, however, not all were used in the PMF analysis. Species were removed for the following reasons:

- Duplication of the species between the two methods (e.g.,  $SO_4^{2-}$  by IC and S by PIXE, EC by thermal desorption and BC by laser integrated plate method);
- Negative biases for some species in a method (e.g., IBA data for Na, S, Cl, K, and Ca);
- Poor fit between PMF and measured concentrations ( $r^2 < 0.4$ ) to remove noise from PMF (e.g., Br and PO<sub>4</sub><sup>3-</sup>);
- Species with more than 95% of measured concentrations less than the minimum detection limit as recommended in the EPA PMF 5.0 User Guide [17] (e.g., Co, P, Se, CH<sub>3</sub>COO<sup>-</sup>, and HCOO<sup>-</sup>).

In addition, the signal-to-noise (S/N) ratio calculated by EPA PMF was used to assign an uncertainty weighting to the species with species with S/N ratios less than 0.5 being removed from the analysis. Species with S/N ratios between 0.5 and 1 were considered weak variables so that their estimated uncertainties were increased by a factor of three to reduce their weight in the solution. The mass variable, as a totalizing variable, was also assigned to be weak.

The list of species included in each study, their uncertainty rating (weak or strong), and their S/N ratio are presented in the Supplementary Materials (Tables S1–S3). At Singleton and Muswellbrook, a total of 123  $PM_{2.5}$  samples from each site, each with 25 species were included in the PMF analysis.

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At Newcastle, Beresfield, Mayfield, and Stockton, a total of 122  $PM_{2.5}$  samples from each site, each with 30 species were included in the PMF analysis, and at Stockton and Mayfield, a total of 123  $PM_{2.5-10}$  samples from each site, each with 25 species, were included in the PMF analysis.

Of note is that for the  $PM_{2.5}$  samples measured in Newcastle, Beresfield, Mayfield, and Stockton, EC data were used instead of BC, while for the  $PM_{10}$ – $PM_{2.5}$  samples from Mayfield and Stockton, BC was used since EC was not determined on these filters. For the Singleton and Muswellbrook  $PM_{2.5}$  samples, an artefact in the EC thermal desorption measurements resulted in poor data quality for EC, which meant that BC was used instead.

PMF models were run separately for data for each site and each size fraction. For the Singleton and Muswellbrook  $PM_{2.5}$  datasets, PMF 3.0 was executed with 40 runs, a random seed, and an extra modelling uncertainty of 5% to account for errors not considered in calculating measurement or analytical errors. For the other datasets, PMF 5.0 was executed with 100 base runs, a random seed, and various numbers of factors, and an extra modelling uncertainty of 10%. For all datasets, the model was executed with various numbers of factors until the final solution was found by examining the scaled residuals and the ability of the model solution to simulate the observed time series of the species concentrations. The G-space plots showed little rotation and Fpeak was not used. All runs converged and the Q values were stable, indicating little influence from outliers.

#### 3. Results

#### 3.1. PM Mass

The highest average  $PM_{2.5}$  concentrations were measured at Stockton and Muswellbrook, and concentrations of  $PM_{2.5-10}$  were over two times greater at Stockton than at Mayfield. Stockton also measured the greatest maximum concentration in  $PM_{2.5}$  and  $PM_{2.5-10}$  concentrations. Average, minimum, and maximum  $PM_{2.5}$  concentrations were consistent across the other sites. The average concentrations shown in Table 2 were much lower than the National Environment Protection Measure (NEPM) for  $PM_{2.5}$  of 25  $\mu g$  m<sup>-3</sup> over 24 h, however the maximum concentrations approached this standard value at several of the sampling sites.

**Table 2.** Number of samples, average, minimum, and maximum daily gravimetric mass concentrations for  $PM_{2.5}$  and  $PM_{2.5-10}$  measured at each sampling site (see Table 1 for sampling periods). Bold values highlight the highest values.

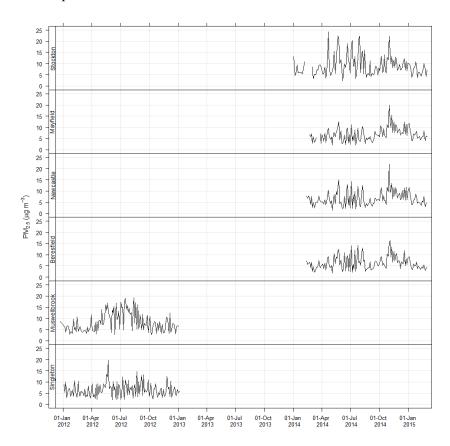
Location.	Number of Samples	Size Fraction	Average $\mu g \ m^{-3}$	Min $\mu g m^{-3}$	Max $\mu g m^{-3}$
Singleton	123	PM <sub>2.5</sub>	6.50	2.05	19.64
Muswellbrook	123	$PM_{2.5}$	8.11	2.69	19.25
Beresfield	128	$PM_{2.5}$	6.37	1.78	16.32
Newcastle	128	$PM_{2.5}$	6.68	1.51	22.06
Mayfield	122	$PM_{2.5}$	6.85	2.11	19.97
Mayfield	122	$PM_{2.5-10}$	10.72	0.85	43.02
Stockton	133	$PM_{2.5}$	9.15	2.31	24.30
Stockton	123	$PM_{2.5-10}$	26.46	2.32	84.93

The time series of gravimetric mass measured on the filters at the six locations is shown in Figure 2.  $PM_{2.5}$  at Muswellbrook and Singleton in 2012 showed the highest concentrations between May and October 2012. Elevated concentrations of  $PM_{2.5}$  at Stockton, Mayfield, Newcastle, and Beresfield occurred between May and August 2014 and November and December 2014 when the peak concentrations occurred. A similar pattern was observed for  $PM_{2.5-10}$  at Stockton and Mayfield during 2014.

 $PM_{2.5}$  concentrations at Stockton, Mayfield, Newcastle, and Beresfield in 2014–2015 were similar on most days, suggesting that the regional transport and dispersion of fine particles significantly influences concentration levels at each site. Significantly higher  $PM_{2.5}$  levels were recorded at Stockton on many occasions from mid-April to mid-August.

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At Beresfield,  $PM_{2.5}$  concentrations measured during winter 2014 (June–August) were higher than those measured at Newcastle and Mayfield, but lower than measured at Muswellbrook and Singleton in 2012, while in summer (December–February), higher  $PM_{2.5}$  concentrations were measured at Mayfield when compared to Beresfield.



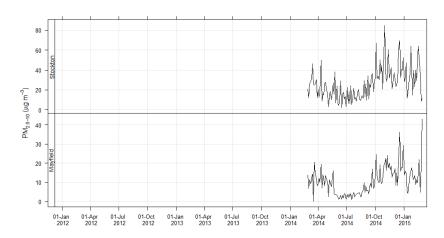


Figure 2. PM<sub>2.5</sub> (top) and PM<sub>2.5-10</sub> (bottom) gravimetric mass time series.

## 3.2. Chemical Speciation

The average, standard deviation, and maximum concentration of chemical species measured on  $PM_{2.5}$  samples are listed in Table 3. At most of the sites, the species with the highest concentrations were organic carbon, sulphate, elemental carbon, and sodium. The exception was Stockton, where nitrate was also present in very high concentrations.

**Table 3.** Concentrations of measured species in the PM<sub>2.5</sub> samples from both studies. Values listed (in ng m<sup>-3</sup>) of average ( $c_{avg}$ ), standard deviation ( $\sigma$ ), and maximum ( $c_{max}$ ) at each site.

Species (ng m <sup>-3</sup> )	Muswellbrook PM <sub>2.5</sub>		Singleton PM <sub>2.5</sub>		Newcastle	Newcastle PM <sub>2.5</sub>		Beresfield PM <sub>2.5</sub>		Mayfield PM <sub>2.5</sub>		Stockton PM <sub>2.5</sub>	
	cavg ± σ	cmax	cavg ± σ	cmax	cavg ± σ	cmax	cavg ± σ	cmax	cavg ± σ	cmax	cavg ± σ	cmax	
Sulphate	957 ± 707	3894	907 ± 711	4453	966 ± 660	3924	871 ± 646	3516	953 ± 647	3696	1197 ± 613	3599	
Organic carbon	$3794 \pm 2182$	9404	$2713 \pm 1745$	10,510	$642 \pm 631$	2815	$864 \pm 688$	3226	$1338 \pm 1054$	4878	$1219 \pm 1003$	6190	
Sodium	$205 \pm 181$	1012	$212 \pm 163$	810	$717 \pm 514$	2346	$448 \pm 380$	2079	$614 \pm 476$	2263	$862 \pm 586$	2383	
Chloride	$169 \pm 163$	1010	$145 \pm 142$	685	$730 \pm 717$	3882	$374 \pm 481$	2442	$584 \pm 643$	3060	$1003 \pm 883$	3821	
Elemental carbon	$1559 \pm 818$	3881	$1428 \pm 1037$	5660	$320 \pm 328$	1586	$414 \pm 337$	1548	$615 \pm 535$	2268	$518 \pm 466$	2250	
Nitrate	$272 \pm 180$	1206	$223 \pm 133$	850	$271 \pm 154$	758	$230 \pm 149$	856	$274 \pm 178$	954	$1393 \pm 2166$	11,777	
Ammonium	$318 \pm 231$	1354	$268 \pm 236$	1462	$143 \pm 114$	669	$164 \pm 141$	793	$151 \pm 117$	681	$545 \pm 753$	3742	
Silicon	$124 \pm 62$	304	$169 \pm 152$	980	$66 \pm 83$	666	$107 \pm 98$	519	$99 \pm 89$	580	$85 \pm 98$	605	
Magnesium	$34 \pm 26$	125	$34 \pm 28$	146	$79 \pm 57$	265	$50 \pm 42$	234	$70 \pm 54$	253	$96 \pm 65$	268	
Iron	$58 \pm 41$	212	$66 \pm 52$	356	$55 \pm 66$	352	$100 \pm 72$	442	$100 \pm 86$	511	$66 \pm 77$	421	
Potassium	$49 \pm 32$	203	$41 \pm 31$	167	$51 \pm 30$	163	$44 \pm 30$	184	$47 \pm 26$	131	$60 \pm 28$	169	
Calcium	$74 \pm 45$	281	$69 \pm 54$	387	$40 \pm 25$	155	$35 \pm 24$	142	$46 \pm 27$	132	$49 \pm 24$	118	
Levoglucosan	$682 \pm 974$	3333	$247 \pm 380$	1691	$130 \pm 250$	1424	$181 \pm 304$	1279	$81 \pm 129$	681	$63 \pm 108$	795	
Methanesulphonic acid	$24 \pm 19$	92	$28 \pm 23$	110	$26 \pm 26$	151	$23 \pm 21$	118	$25 \pm 23$	145	$25 \pm 24$	150	
Aluminium	$36 \pm 20$	89	$52 \pm 51$	322	$18 \pm 25$	157	$30 \pm 32$	155	$30 \pm 30$	186	$32 \pm 45$	200	
Zinc	$4 \pm 5$	43	$4 \pm 2$	14	$8.9 \pm 13$	77	$7.2 \pm 6.4$	25	$18 \pm 30$	151	$12 \pm 24$	226	
Phosphate	$17 \pm 12$	62	$11 \pm 6$	30	$4.7 \pm 5.3$	47	$4.6 \pm 3.6$	25	$5.9 \pm 5.3$	46	$5.2 \pm 4.9$	44	
Lead	$2.2 \pm 2.6$	20.1	$1.9 \pm 1.8$	9.5	$4.7 \pm 6.8$	32	$3.9 \pm 4.7$	28	$4.3 \pm 4.7$	23	$3.8 \pm 4.5$	21	
Vanadium	$0.2 \pm 0.2$	0.9	$0.3 \pm 0.3$	1.4	$4.0 \pm 4.4$	21	$0.9 \pm 0.9$	6.8	$3.4 \pm 3.8$	20	$8.7 \pm 9.3$	46	
Bromide	$2.6 \pm 2.0$	20.1	$2.2 \pm 1.2$	8.8	$2.0 \pm 1.3$	6.4	$1.4 \pm 1.3$	10	$1.7 \pm 1.4$	9	$5.0 \pm 4.6$	29	
Titanium	$3.1 \pm 1.7$	8.7	$4.1 \pm 3.6$	22.0	$2.3 \pm 2.4$	16	$2.9 \pm 2.7$	15	$3.0 \pm 2.4$	15	$2.1 \pm 2.3$	13	
Manganese	$1.4 \pm 1.1$	8.1	$1.3 \pm 1.1$	7.0	$1.8 \pm 2.3$	12	$2.3 \pm 2.2$	14	$4.0 \pm 5.9$	38	$1.9 \pm 2.4$	20	
Copper	$0.9 \pm 0.9$	7.5	$0.9 \pm 0.7$	3.8	$1.9 \pm 2$	8.4	$1.2 \pm 1.0$	5.8	$2.5 \pm 1.9$	11	$1.2 \pm 1.3$	8.6	
Nickel	$0.4 \pm 0.8$	4.5	$0.4 \pm 0.6$	2.9	$1.5 \pm 1.4$	6.9	$0.54 \pm 0.6$	3	$1.2 \pm 1.1$	5.3	$2.8 \pm 2.7$	12	
Mannosan	$19 \pm 27$	99	$7 \pm 10$	58	$4.6 \pm 9.6$	63	$5.9 \pm 10$	44	$3.0 \pm 5.1$	34	$2.5 \pm 4.8$	41	
Chromium	$0.2 \pm 0.1$	0.6	$0.2 \pm 0.2$	0.9	$0.36 \pm 0.4$	1.9	$0.88 \pm 1.6$	12	$0.59 \pm 0.6$	3	$0.40 \pm 0.4$	2	

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The average, standard deviation, and maximum concentration of chemical species measured in  $PM_{2.5-10}$  samples at Mayfield and Stockton are listed in Table 4. At both sites, the species with the highest concentrations was chloride, followed by sodium, and black carbon.

**Table 4.** Concentrations of measured species in the  $PM_{2.5-10}$  samples. Values listed (in ng m<sup>-3</sup>) of average ( $c_{avg}$ ), standard deviation ( $\sigma$ ), and maximum ( $c_{max}$ ) at each site.

Species (ng m <sup>-3</sup> )	Stockton P	M <sub>2.5–10</sub>	Mayfield P	M <sub>2.5–10</sub>
Species (fig fit ')	$c_{avg} \pm \sigma$	c <sub>max</sub>	$c_{avg} \pm \sigma$	c <sub>max</sub>
Chloride	$6945 \pm 4985$	20,406	$1943 \pm 1565$	8074
Sodium	$4200 \pm 2795$	11,782	$1246 \pm 952$	4769
Black carbon	$2278 \pm 1388$	6532	$1101 \pm 916$	4892
Sulphate	$1197 \pm 771$	3299	$382 \pm 281$	1463
Nitrate	$543 \pm 390$	1856	$269 \pm 277$	1369
Silicon	$404 \pm 398$	2252	$320 \pm 265$	1631
Magnesium	$481 \pm 339$	1382	$137 \pm 110$	550
Calcium	$228 \pm 139$	653	$110 \pm 92$	489
Iron	$125 \pm 121$	550	$134 \pm 108$	724
Aluminium	$119 \pm 150$	897	$103 \pm 82$	543
Potassium	$148 \pm 102$	420	$43 \pm 31$	159
Oxalate	$29 \pm 29$	261	$18 \pm 16$	101
Phosphate	$13 \pm 15$	128	$7.5 \pm 8.6$	52
Mannitol	$10 \pm 11$	71	$12 \pm 17$	94
Fluoride	$18 \pm 29$	132	$7.2 \pm 9.5$	57
Bromine	$14 \pm 10$	46	$3 \pm 2.3$	9
Titanium	$6.7 \pm 8.6$	44	$5.8 \pm 6.4$	36
Zinc	$6.1 \pm 6.5$	34	$6.6 \pm 7.1$	39
Arabitol	$5.7 \pm 6.5$	37	$6.7 \pm 8.8$	50
Manganese	$4.6 \pm 4.5$	34	$6 \pm 6.8$	46
Copper	$3.4 \pm 2.4$	14	$4.2 \pm 2.5$	13
Chromium	$2.0 \pm 1.7$	10	$2.3 \pm 1.7$	10
Ammonium	$3.0 \pm 3.9$	24	$2.3 \pm 2.3$	14
Lead	$1.13 \pm 1.2$	9.0	$0.92 \pm 0.7$	3.2
Nickel	$0.83 \pm 0.6$	3.2	$0.59 \pm 0.4$	1.8
Cobalt	$0.54 \pm 0.4$	2.7	$0.57 \pm 0.5$	3.7
Vanadium	$1.50 \pm 1.5$	6.3	$0.39 \pm 0.4$	1.4

#### 3.3. PMF Receptor Modelling Results

Eight factors were identified in the PMF analysis of the  $PM_{2.5}$  data at Muswellbrook and Singleton (using EPA PMF 3.0); nine factors were identified in the PMF analysis of the PM<sub>2.5</sub> data at Newcastle, Beresfield, Mayfield, and Stockton; and six factors were identified in the PMF analysis of the  $PM_{2.5-10}$  data at Mayfield and Stockton (using EPA PMF 5.0 which was not available for the Upper Hunter analysis). Table 5 lists the factors identified, the main species used to identify the factor and the contribution of each factor to the PM mass. Additionally, listed is the uncertainty in the factor contributions derived from the bootstrapping and displacement methods in the EPA PMF 5.0 software [18]. The uncertainties represent confidence intervals that with a high probability contain the (unknown) true values. The factor fingerprints obtained by PMF analysis at each site are available in the Supplementary Materials (Figures S1–S8).

Table 5. Summary of the PMF factors (from the EPA PMF 3.0 and 5.0 analyses), main species, contributions of these factors at each site and potential sources.

	Main Consis		Con	tribution of th	e Factor to Tot	al Annual Pa	rticulate Mass	<b>i</b>		
Factor	Main Species (Drivers Bold)		PM <sub>2.5</sub>						2.5–10	Potential Sources
		Singleton	Muswellbrook	Newcastle	Beresfield	Mayfield	Stockton	Mayfield	Stockton	_
Fresh sea salt	Cl <sup>-</sup> :Na <sup>+</sup> :SO <sub>4</sub> <sup>2-</sup> :Mg <sup>2+</sup>	8% (7–9%)	3% (2–4%)	24% (20–27%)	13% (12–16%)	20% (18–22%)	23% (19–25%)	40% (33–45%)	63% (50–66%)	Primary particles. Fresh sea salt aerosol from wave-breaking. Contribution decreases with increasing distance from the coast.
Pollutant-aged sea salt	Na <sup>+</sup> :Mg <sup>2+</sup> , non-sea-salt SO <sub>4</sub> , OC, EC, almost no Cl <sup>-</sup>	18% (16–18%)	13% (12–14%)	23% (9–38%)	23% (15–34%)	25% (15–40%)	22% (13–28%)	16% (7–17%)	6% (4–11%)	Sea salt reacted with industrial, commercial, road & non-road transport emission from local & regional sources, esp. $SO_2$
Soil	Si:Al:Ti, Fe, Ca <sup>2+</sup> , OC, EC	12% (11–13%)	11% (9–15%)	8% (2–14%)	10% (9–14%)	11% (5–16%)	8% (5–10%)	14% (10–27%)	11% (6–14%)	Primary particles. Soil dust. Potential industrial contributions of organic & black carbon at Mayfield & Stockton. Possibly coal particles and/or soot contribute.
Bioaerosols	Arabitol, mannitol, Cl <sup>-</sup> , SO <sub>4</sub> <sup>2-</sup> , Fe, Mg <sup>2+</sup>							6% (5–15%)	5% (2–9%)	Bioaerosol such as fungal spores and pollens combined with industrial emissions and sea salt
Wood smoke	Levoglucosan, mannosan, OC, EC, NO <sub>3</sub> <sup>-</sup> , SO <sub>4</sub> <sup>2-</sup> , Cl <sup>-</sup> K <sup>+</sup>	14% (13–15%)	30% (27–34%)	10% (6–18%)	15% (8–24%)	11% (7–15%)	6% (5–9%)			Primary aerosol. Domestic wood heaters at Singleton and Muswellbrook. Domestic wood heaters, bushfires, and hazard reduction burns at Lower Hunter sites
Biomass Smoke	<b>OC2, OC3, OC4, K</b> , SO <sub>4</sub> <sup>2-</sup> , Al, Si, Ti, BC	8% (7–10%)	12% (9–15%)							Wildfires, hazard reduction burns
Industry	<b>F</b> -, <b>Fe</b> , <b>SO</b> <sub>4</sub> <sup>2-</sup> , Si, Cl <sup>-</sup> , Al,							12% (3–19%)	5% (3–10%)	Industry
Vehicle	EC, OC, Fe, Cu, Mn, Cr, Pb, NO <sub>3</sub> <sup>-</sup> , SO <sub>4</sub> <sup>2-</sup> ,			10% (3–15%)	11% (6–13%)	9% (5–15%)	5% (4–7%)			Primary (EC, metals, OC) & secondary (NO <sub>3-</sub> , OC) particles. Vehicles, non-diesel road equipment
Light Absorbing Carbon	Cl <sup>-</sup> :Na <sup>+</sup> , BC, SO <sub>4</sub> <sup>2-</sup> , Mg <sup>2+</sup>							10% (8–26%)	10% (7–19%)	Light-absorbing carbon (LAC) with some sea salt. Coal particles are conjectured to contribute to this factor.
Mixed industry/ vehicle (a)	<b>Zn, Mn</b> , Fe, Cu, Cr, SO <sub>4</sub> <sup>2-</sup> , NH <sub>4</sub> <sup>+</sup> , NO <sub>3</sub>	17% (16–18%	8 (6–7%)	3% (2–9%)	9% (3–13%)	1% (1-3%)	5% (4–10%)			Primary (metals) & secondary particles. Industry, vehicles, non-diesel road equipment
Mixed shipping/ industry	V:Ni, SO <sub>4</sub> <sup>2-</sup> , NH <sub>4</sub> <sup>-</sup> , EC OC, NO <sub>3</sub> <sup>-</sup>			2% (1–6%)	3% (3–10%)	4% (3–7%)	3% (2–9%)			Secondary & primary (V, Ni) particles. Shipping, sulphate, ammonium
Secondary ammonium sulphate	NH <sub>4</sub> <sup>+</sup> :nssSO <sub>4</sub> <sup>2-</sup> , OC, EC	20% (18–22%)	17% (16–19%)	12% (6–16%)	10% (9–17%)	8% (7–16%)	9% (7–13%)			Secondary aerosol-ammonium sulphate. Local & regional sources of SO <sub>2</sub> (e.g., fossil fuel burning) and ammonia (agriculture, industry, vehicles, non-road diesel equipment, soils, ocean)
Primary or secondary nitrate	NO <sub>3</sub> <sup>-</sup> , Na <sup>+</sup> , SO <sub>4</sub> <sup>2-</sup> , Cl <sup>-</sup> , OC NH <sub>4</sub> , NO <sub>3</sub> at Stockton	3% (2–4%)	6% (5–7%)	8% (5–14%)	6% (4–13%)	11% (7–16%)	19% (17–22%)			Secondary sodium nitrate at Mayfield, Newcastle, and Beresfield. Primary ammonium nitrate at Stockton-industry. NO <sub>x</sub> from vehicles, non-road diesel equipment, industry.

Notes: Al—aluminium; BC—black carbon; Ca—calcium; Cl<sup>-</sup>—chloride; Cu—copper; Fe—iron; K—potassium;  $Mg^{2+}$ —magnesium; Mn—manganese; Na<sup>+</sup>—sodium; NH<sub>4</sub><sup>+</sup>—ammonium; NO<sub>3</sub><sup>-</sup>—nitrate; OC1–OC4—fractions of organic carbon distinguished by the volatility of the organic compounds, OC1 is the most volatile, as organic aerosol ages its OC becomes less volatile; Si—silicon; SO<sub>4</sub><sup>2-</sup>—sulphate; Ti—titanium; Zn—zinc. (a) Factor contributions do not sum to 100% due to the rounding of values.

Across the six sites and two size fractions over the two sampling periods, 14 factors were found to contribute to particle mass. Of these, three source profiles common to all sites, size fractions, and sampling period were fresh sea salt, pollutant-aged sea salt and soil. Four source profiles were common across all sites for  $PM_{2.5}$  including secondary sulphate, nitrate (primary and secondary), mixed industry/vehicles, and woodsmoke. One source profile (other biomass smoke) was only identified in  $PM_{2.5}$  at Singleton and Muswellbrook, and two source profiles (mixed industry/shipping and vehicles) were only identified in  $PM_{2.5}$  at Newcastle, Beresfield, Mayfield, and Stockton. Three sources (bioaerosol, light absorbing particles (coal dust), and industry) were only identified in the  $PM_{2.5-10}$  size fraction at Mayfield and Stockton.

The following description groups the factors into several sets:

- Fresh sea salt, pollutant-aged sea salt, soil, and bioaerosol factors—mechanically derived primary
  aerosol from natural sources. Pollutant-aged sea salt includes secondary components in addition
  to sea salt;
- Woodsmoke and biomass smoke factors, combustion of biomass sources;
- Industry and vehicle factors including all sources with an industry origin, directly emitted to the atmosphere, and hence primary sources;
- Sulphate and nitrate (secondary ammonium sulphate and nitrate formed by reactions in the atmosphere from precursor gases of anthropogenic origin) and primary nitrate at Stockton.

The following discussion presents the results in terms of the percentage that each factor makes to the  $PM_{2.5}$  and  $PM_{2.5-10}$  mass at each site. Noting that the annual averaged  $PM_{2.5}$  across most of the sites was consistent, the percentage contribution of each factor can also be considered equivalent to the relative concentration contribution of each factor at the sites.

#### 3.3.1. Sea Salt and Soil Factors

## Fresh Sea Salt

The fresh sea salt factor contributed to both the  $PM_{2.5}$  and  $PM_{2.5-10}$  size fractions at all sites and is characterized by the presence of sea water elements sodium, chloride, magnesium, and sulphate. The average contribution of this factor to  $PM_{2.5}$  was greatest at Stockton (closest site to the coast at 0.2 km from the coast) and lowest at Muswellbrook (furthest site from the coast at 100 km from the coast). The annual average contribution of this factor to the  $PM_{2.5-10}$  at Mayfield and Stockton was greater than the contribution to  $PM_{2.5}$  at these sites, which is expected since the sea salt aerosol mass size distribution is dominated by particles greater than 2.5  $\mu$ m in diameter.

This factor was identifiable as fresh sea salt aerosol since the ratios of the sea water elements (Table 6) were generally within 10% of the ratios found in standard sea water [18]. The lower [Cl $^-$ /Na $^+$ ] ratios at Singleton and Muswellbrook may be attributed to some loss of chloride, as indicated by the presence of both non sea salt sulphate (note the high  $SO_4^{2-}$ /Na $^+$  ratio at Singleton) and nitrate in the source profile at these sites.

### Pollutant-Aged Sea Salt

The pollutant-aged sea salt factor occurred across all sites in the  $PM_{2.5}$  and  $PM_{2.5-10}$  size fractions and was dominated by the presence of sulphate and sodium. The annual average contribution of this factor to  $PM_{2.5}$  was greatest at Beresfield and lowest at Singleton. The annual average contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of this factor to  $PM_{2.5-10}$  was lower than the contribution of  $PM_{2.5-10}$  was lower than the  $PM_{2.5-10}$  where  $PM_{2.5-10}$  was lower than the  $PM_{2.5-10}$  where P

This factor was identifiable as the pollutant-aged sea salt source since the ratios of the elements magnesium, calcium and potassium to sodium were the same or close to those of sea water (Table 6 shows the magnesium/sodium ratio). However, chloride was absent (in the  $PM_{2.5}$  samples) or very low (in the  $PM_{2.5-10}$  samples), indicating that chloride had been displaced by sulphuric acid, nitric acid, and possibly oxalic acid [19]. In this process, sulphuric acid is neutralized by the weak base of the sea

salt particles, resulting in the replacement of chloride by sulphate, thus enhancing the ratio of sulphate to sodium ratio relative to seawater. The  $PM_{2.5-10}$  factor was less 'aged' than the corresponding factor for  $PM_{2.5}$  (i.e., still retains significant chloride) because the smaller surface-area-to-volume ratio for the coarse particles meant that the timescale of the reactions replacing the chloride was longer than for  $PM_{2.5}$ .

The sources of these acids are industrial and transport emissions. Sulphuric and nitric acids are produced from the oxidation of sulphur and nitrogen oxides from fossil fuel combustion. Oxalate can be produced through the oxidation of oxygenated volatile organic compounds (e.g., [19,20]).

**Table 6.** Comparison of the constituents of the fresh sea salt factor and the pollutant-aged sea salt factor with standard sea water [18]. Mg is magnesium, Na is sodium, Cl is chloride, and SO<sub>4</sub> is sulphate.

Ratios	Mg/Na	Cl/Na	SO <sub>4</sub> /Na	Distance from the Coast (km)						
Standard sea water	0.12	1.8	0.252							
Fresh Sea Salt Factor PM <sub>2.5</sub>										
Muswellbrook	0.12	1.34	0.3	100						
Singleton	0.115	1.13	0.47	70						
Beresfield	0.108	1.6	0.28	16						
Newcastle	0.11	1.69	0.27	1						
Mayfield	0.112	1.66	0.33	6						
Stockton	0.112	1.67	0.26	0.2						
	Fresh Sea Salt Factor PM <sub>2.5-10</sub>									
Mayfield	0.11	1.72	0.25	6						
Stockton	0.115	1.75	0.25	0.2						
	Polluta	int-Aged Sea	Salt Factor I	PM <sub>2.5</sub>						
Muswellbrook	0.117	0	1.993	100						
Singleton	0.119	0	1.47	70						
Beresfield	0.11	0.04	2.32	16						
Mayfield	0.111	0	2.41	6						
Newcastle	0.121	0.08	2.32	1						
Stockton	0.106	0.18	1.51	0.2						
	Pollutar	t-Aged Sea	Salt Factor Pl	M <sub>2.5-10</sub>						
Mayfield	0.12	0.99	0.4	6						
Stockton	0.09	0.74	0.39	1						

Soil

The soil factor occurred across all sites in the  $PM_{2.5}$  and  $PM_{2.5-10}$  size fractions and was characterized by the presence of crustal dust elements aluminium, silicon, and titanium. Generally, the soil factor accounted for the greatest proportion of these species (65–80% for all sites and size fractions). The average contribution of this factor to  $PM_{2.5}$  was relatively consistent across the sites (around 10%).

The factor was identifiable as fresh soil dust since the ratios of the aluminium to silicon generally matched those for crustal composition for  $PM_{2.5}$  at all of the sites (Table 7), with the exception of Stockton, where the ratio was more than twice that of crustal composition [21] and Australian dust [22], suggesting an additional source of aluminium at Stockton for  $PM_{2.5}$ . The aluminium to silicon ratios in the soil factor for  $PM_{2.5-10}$  at Mayfield and Stockton were also slightly higher than the crustal composition, again indicating an additional aluminium source to  $PM_{2.5-10}$ .

The elevated ratios of aluminium to titanium relative to crustal ratios for both size fractions at Stockton and  $PM_{2.5-10}$  at Mayfield indicated the presence of an additional aluminium source that is low in titanium. The soil factor for  $PM_{2.5-10}$  at Mayfield and Stockton also included small amounts of iron, manganese and zinc, so may indicate some road and/or industrial dust in this factor.

 $PM_{2.5}$  at several sites also showed elevated iron relative to crustal soil (Muswellbrook, Singleton, Mayfield, and Stockton), which may indicate an industrial origin for part of the dust. The soil factor

also included varying amounts of organic and elemental carbon across the sites and size fractions, consistent with soil dust being of a more local origin than some of the other factors.

**Table 7.** Comparison of the constituents of the soil factor with crustal composition [21] and some typical Australian dust [22].

Species Ratio	Crust	Australian Dust	Muswellbrook	Singleton	Newcastle	Beresfield	Mayfield	Stockton	Mayfield	Stockton
	PM <sub>2.5</sub>							$PM_2$	1.5–10	
Al/Si	0.29	0.27-0.29	0.33	0.31	0.32	0.32	0.30	0.86	0.38	0.38
Al/Ti	14	11.5-15.1	12.7	12.7	14.2	14.6	13.9	36	23	25
Ti/Si	0.020	0.018-0.026	0.026	0.025	0.022	0.022	0.021	0.023	0.016	0.015
Fe/Si	0.200	0.22 - 0.23	0.29	0.30	0.15	0.11	0.27	0.34	0.15	0.14

Al is aluminium, Si is silicon, Ti is titanium, and Fe is iron.

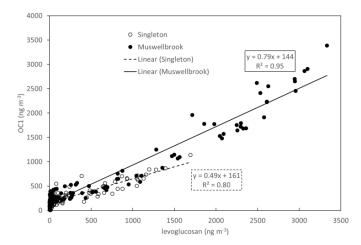
#### Bioaerosols

The bioaerosols factor was only observed in the  $PM_{2.5-10}$  samples. The annual average contribution of this factor to  $PM_{2.5-10}$  was 6% at Mayfield and 5% at Stockton. This factor was identifiable as bioaerosols since it included 80–90% of the arabitol and mannitol, which are biomarkers for fungal spores and have been used to assess the abundance of bioaerosols in the atmosphere [23,24].

#### 3.3.2. Woodsmoke and Biomass Smoke

The woodsmoke factor occurred across all sites in the  $PM_{2.5}$  fraction and was characterized by the presence of levoglucosan and mannosan. The average contribution of the woodsmoke factor to  $PM_{2.5}$  mass was greatest at Muswellbrook and lowest at Stockton.

The woodsmoke factor was clearly identifiable as woodsmoke because it contained 85–90% of the levoglucosan and mannosan, both unique tracers for the combustion of cellulose found in trees and plants [25]. This factor also included about 20–30% of the organic carbon at all sites except Singleton, where it included 8% of organic carbon. The amount of black/elemental carbon sites varied from 20% at Muswellbrook, Beresfield, Stockton, and Mayfield to less than 5% at Singleton and Newcastle. Figure 3 shows a clear linear relationship between the volatile organic carbon fraction (OC1) measured by the IMPROVE-A method and levoglucosan, indicating that the woodsmoke was fresh, which is expected considering the proximity of the sampling sites to houses. Note that in the NSW 2008 emissions inventory, residential wood heater emissions were estimated to be 900 tonnes of  $PM_{2.5}$  and about 35 tonnes of  $PM_{2.5-10}$  in 2008 across regions of the Hunter, accounting for 94% of  $PM_{2.5}$  emissions from the residential sector during 2008.

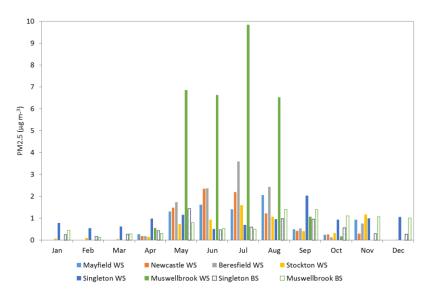


**Figure 3.** Relationship between levoglucosan (tracer of woodsmoke) and OC1 (the most volatile organic carbon fraction measured using the IMPROVE-A method) for each site.

The biomass smoke factor was only identified in  $PM_{2.5}$  at Singleton (8%) and Muswellbrook (12%) and included potassium and organic carbon with the contribution of the least volatile organic carbon

fraction measured by the IMPROVE-A method (OC4) as having the greatest contribution and the least volatile fraction (OC1) was the lowest. This factor was identifiable as biomass smoke because of the presence of potassium, which can be produced by the combustion of cellulose. The absence of the woodsmoke tracer levoglucosan indicated that the smoke may have resulted from the combustion of material other than wood (e.g., grasses) or that the biomass burning smoke source was aged. For example, Hennigan et al. (2010) showed the decay of levoglucosan after reaction with hydroxyl radicals under experimental conditions. The high concentration of OC4 (the least volatile OC group) may also indicate that the smoke was aged in the biomass smoke factor

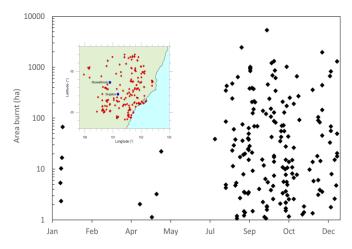
The biomass smoke factor and the woodsmoke factor at Singleton and Muswellbrook clearly divide the smoke sources into bushfire/hazard reduction smoke and domestic woodheaters. On the other hand, at Beresfield, Newcastle, Stockton, and Mayfield, the PMF did not separate these smoke sources and both are included in the Woodsmoke Factor. The seasonal patterns in the two smoke factors provide information on the contribution of each source to the different sites (Figure 4).



**Figure 4.** Monthly averaged PM2.5 concentrations attributed to the woodsmoke (WS) and the biomass smoke (BS) factors.

The contribution of the woodsmoke factor to all sites is greatest during winter (June–August) 66% at Muswellbrook, 41% at Beresfield, 31% at Newcastle and Mayfield, 30% at and Singleton 11% at Stockton. At Muswellbrook and Singleton, the factor was only present during the cooler months of the year with significant contributions from May to August in both towns, while in Newcastle, Beresfield, Mayfield, and Stockton, this factor contributes to PM<sub>2.5</sub> mass from May to November. The seasonal pattern in the contribution of the woodsmoke factor at Newcastle, Beresfield, Mayfield, and Stockton correspond to the use of domestic woodheaters from May to August and emissions from bushfire/hazard reduction burns that take place in autumn (March, April, and May) and early spring (September and October).

The contribution of the biomass smoke factor to  $PM_{2.5}$  at Singleton and Muswellbrook was elevated from September to January and showed slightly elevated levels during May and June (more distinct at Muswellbrook). Data from the NSW Rural Fire Service in Figure 5 shows that there were many wildfires and hazard reduction burns from August to December 2012.



**Figure 5.** Occurrence of wildfires and hazard reduction burns in the Hunter region during 2012 (data from the Rural Fire Service). The vertical axis shows the area burnt, which is representative of the amount of smoke generated. The inset shows the location of the fires in 2012.

Back trajectory analysis was undertaken using the National Oceanic and Atmospheric Administration (NOAA) Hybrid Single-Particle Lagrangian Integrated Trajectory (HYSPLIT) model [26] to investigate the likely contribution of bushfire/hazard reduction burning to the woodsmoke factor at the Lower Hunter locations. Findings indicated that bushfires may have contributed to some extent on about a quarter of all smoke-affected days (10% in winter, 25% in autumn, and 50% in spring), with the most dominant contributions likely to have occurred on days in late October, early November (spring).

#### 3.3.3. Industry and Vehicles

## Industry

The industry factor was only present in the  $PM_{2.5-10}$  samples from Stockton and Mayfield and included most of the zinc, iron, and manganese (50–75%) in the samples. The annual average contribution of this factor to the  $PM_{2.5-10}$  mass at Mayfield was 12% and 5% at Stockton. Other species contributing to this factor included calcium and fluoride. Aluminium, silicon, and titanium were also present, but with ratios very different from those found in soils. This factor makes the greatest contribution to  $PM_{2.5-10}$  mass during early summer (December) at Mayfield and late autumn to winter (May to August) at Stockton.

## Light Absorbing Carbon

The light absorbing carbon factor was only observed in the  $PM_{2.5-10}$  samples from Stockton and Mayfield and included 90% of the light-absorbing carbon. The annual average contribution of this factor to  $PM_{2.5-10}$  was 10% at Mayfield and Stockton. The light absorbing carbon factor also included some sea salt elements, with lower chloride suggesting some chloride loss compared to the fresh sea salt factor.

Analysis of the  $PM_{2.5-10}$  samples from Stockton using the advanced optical reflected light imaging and analysis system, described in [27] suggested that all or most of the light-absorbing carbon identified in the Stockton  $PM_{2.5-10}$  mass consisted of coal particles. Several coal works facilities are located in the Port of Newcastle. Sources of coal dust emissions from coal terminal operations include fugitive emissions from rail receival stations, conveyors and transfer points, wind erosion of stockpiles, stacking and reclaiming, ship loading, and dozer and front-end loader operations [28]. Coal works in the Newcastle region were estimated to emit 90 tonnes/year of  $PM_{2.5}$  and 750 tonnes/year of  $PM_{10}$  based on the 2008 Greater Metropolitan Region air emissions inventory [29].

#### Vehicles

The vehicle factor was only present in the  $PM_{2.5}$  samples from Newcastle, Beresfield, Stockton, and Mayfield and was characterized by the presence of iron, manganese, chromium, and copper. The annual average contribution of this vehicle factor to  $PM_{2.5}$  mass was consistent at around 10% at Newcastle, Beresfield, and Mayfield and lowest (at 5%) at Stockton. Note that the vehicle factor was not identified in the  $PM_{2.5}$  Muswellbrook and Stockton datasets. Instead, vehicles were captured in the mixed industry/vehicle factor (described below).

The vehicle factor could include direct vehicle emissions from the combustion of petrol and diesel as well as emissions from brake and tyre wear and can incorporate non-road vehicles and equipment running on automotive petrol and diesel. This factor included about half the iron, manganese, chromium, and copper at all sites. Zinc was mostly absent from this factor (most of the zinc (>70%) was in the mixed industry/vehicle factor). However, the presence of 60% of zinc in this factor for the Stockton samples suggested the presence of industry sources mixed in the vehicle factor at Stockton.

Copper has been identified as a marker for brake wear since the wear of brakes results in the emission of iron and copper [30]. Manganese may be indicative of the fuel additive methylcyclopentadienyl manganese tricarbonyl (MMT), which has been used as a fuel additive in Australia since 2000 [31]. During combustion, MMT releases inorganic manganese species [32] and its presence of up to 5 ng  $\,\mathrm{m}^{-3}$  in PM<sub>2.5</sub> in Sydney was attributed to vehicle emissions [33].

On-road vehicles were estimated to emit 230 tonnes of  $PM_{2.5}$  in 2008 across the regions of the Hunter Valley [29], comprising exhaust emissions from diesel (55.2%), petrol (8.3%), and other vehicles (0.4%), and non-exhaust emissions from brake, tyre, and road surface wear (36.1%).

## Mixed Industry/Vehicles

The mixed industry/vehicle factor occurred at all sites but only in the  $PM_{2.5}$  fraction. The annual average contribution of this factor to  $PM_{2.5}$  mass was greatest at Singleton and lowest at Mayfield.

The mixed industry/vehicle factor explained more than 60–70% of zinc across all sites except Singleton (<5%) and Muswellbrook (30%). The National Pollutant Inventory (NPI) lists the zinc sources in the region as 65% industry, 26% vehicles, 5% wind-blown dust, and 4% other (bushfires, wood heaters) [34]. Other species contributing to this factor included manganese, chromium, copper, lead, and iron as well as sulphate, organic carbon, and black/elemental carbon. There was more zinc and manganese relative to iron in the mixed industry/vehicle factor than in the vehicle factor, while the ratios of chromium, copper, and calcium to iron were similar across the two factors.

The vehicle component of this mixed factor could include direct vehicle emissions from the combustion of petrol and diesel as well as emissions from brakes and tyre wear or resuspension of paved road dust. The latter is not likely to be significant, however, since silica and aluminium were absent from the factor.

#### Mixed Shipping/Industry

The mixed shipping/industry factor was only present in the  $PM_{2.5}$  fraction from Newcastle, Beresfield, Stockton, and Mayfield. The annual average contribution of this factor to  $PM_{2.5}$  mass was consistently low (less than 5%) across each site.

The mixed shipping/industry factor included most of the vanadium and a significant fraction of the nickel. The ratio of vanadium to nickel of 3–3.5 at all sites is representative of heavy oil combustion from shipping [35,36]. The vanadium concentration was the maximum at Stockton (near the port) and lowest inland at Beresfield, indicating the influence of shipping on the vanadium concentrations at sites closer to the port. Shipping related factors were not identified at the inland Muswellbrook and Singleton sites in the Upper Hunter. The factor also included sulphate, organic carbon, and elemental carbon. While shipping emissions include sulphate and elemental carbon relative to vanadium to nickel ratio, and the increase in the sulphate and elemental carbon relative to vanadium

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with increasing distance from the coast suggest the contribution from industry (the main source of sulphate) across these sites.

#### 3.3.4. Secondary Sulphate and Nitrate

## Secondary Ammonium Sulphate

The secondary ammonium sulphate factor occurred across all sites in the  $PM_{2.5}$  fraction. The annual average contribution to  $PM_{2.5}$  was greatest at Muswellbrook and least at Mayfield and Stockton.

This secondary ammonium sulphate factor was dominated by the presence of ammonium (55–85%) and sulphate (30–60%), except at Stockton where it only accounted for 20% of ammonium. Note that primary nitrate factor accounted for most of the ammonium at Stockton.

Ammonium and sulphate occur in atmospheric particles because of photochemical reactions in the atmosphere. Gaseous sulphur dioxide is emitted to the atmosphere during the combustion of fossil fuels (e.g., in power stations or motor vehicles) and in the presence of sunlight will oxidize to form sulphuric acid. The seasonal cycle displayed by the secondary ammonium sulphate factor of higher contributions during the summer months represents the greater number of daylight hours for photochemical reactions to occur. Sources of ammonia include agriculture (mostly from animal excrement and fertilizer application), industrial processes, vehicular emissions, and volatilization from soils and oceans [37]. Ammonia plays an important role in neutralizing acids in the atmosphere, hence readily neutralizes the sulphuric acid to produce ammonium sulphate aerosol.

Local and regional sources may contribute to secondary ammonium sulphate concentrations. The contribution of inter-regional transport to airborne particle concentrations within NSW metropolitan areas has been addressed in several studies [38,39]. For example, the contribution of sulphur dioxide emissions from coal-fired power stations located in the Upper Hunter, Central Coast, and Lithgow to secondary sulphate concentrations measured in parts of the Sydney basin have been estimated [40].

#### Nitrate (Primary or Secondary)

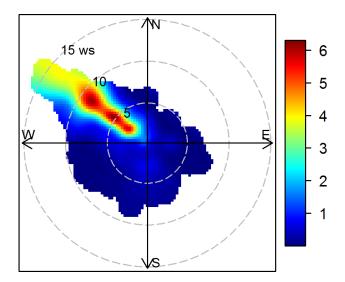
The nitrate factor occurred across all sites in the  $PM_{2.5}$  fraction. At all sites except Stockton, it is a secondary nitrate (sodium nitrate) factor but at Stockton, it is a primary nitrate (ammonium nitrate) factor. The annual contribution of the nitrate (primary and secondary) factor to  $PM_{2.5}$  mass was greatest at Stockton and lowest at Singleton.

The secondary nitrate factor contained most of the nitrate (60%) and included some ammonium, chloride, sodium, sulphate, and OC. At Stockton, however, the primary nitrate factor accounted for 80% of nitrate and 60% of ammonium with negligible contributions from other species.

Generally, nitrate occurs in atmospheric particles because of photochemical reactions in the atmosphere. Nitrogen dioxide produced from the oxidation of nitrogen oxide that is emitted to the atmosphere during combustion of fossil fuels (e.g., in power stations or motor vehicles) is further oxidized to form nitric acid. Nitric acid can be neutralized by gaseous base ammonia or alkaline aerosols such as sea salt. However, at Stockton, a nearby industry contributed primary nitrate emissions to the  $PM_{2.5}$  mass. The Stockton site is situated about 700 m to the south-east of the Orica Australia Pty. Ltd. ammonium nitrate manufacturing facility on Kooragang Island. Emissions from this facility include particulate matter, ammonia, oxides of nitrogen and nitric acid [41], with particulate matter emissions from ammonium nitrate production (via a prilling tower) largely comprised of  $PM_{2.5}$  ammonium nitrate as reported in monitoring results [42]. Emissions from the prilling tower result from carry-over of fine particles and fume by the prilling cooling air flowing through the tower. Emissions from low-density prilling towers have been documented by the US EPA as comprising predominantly small particles, 56% of which are below 2.5  $\mu$ m, 73% below 5  $\mu$ m, and 83% below 10  $\mu$ m [43].

There is little evidence of a seasonal pattern in the contribution of the secondary nitrate factor. However, at Stockton, the primary nitrate factor is only present in the second half of autumn and winter (May to August). This corresponds to the time of year when north-westerly winds prevail at Stockton

that transport the emissions from Kooragang Island towards the Stockton site. The direction of the source from the monitoring site is clearly indicated by the bivariate pollution rose in Figure 6. The plot indicates that high ammonium nitrate concentrations at Stockton occurred when the winds were from the northwest when the prilling tower was directly upwind of the Stockton site. The narrowness of the red sector ('upwind footprint') is indicative of the direct emission of ammonium nitrate.



**Figure 6.** Pollution increase at Stockton of primary nitrate (factor contributions (colour scale units  $\mu g$  m<sup>-3</sup>) versus wind direction and speed (m s<sup>-1</sup>).

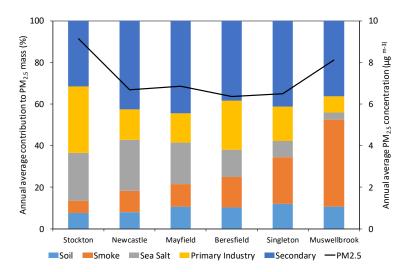
#### 4. Discussion

Figure 7 shows the annual average percentage contribution of the source profiles for sea salt, soil, smoke (woodsmoke and other biomass smoke), primary industry (industry, mixed industry/vehicles, mixed industry/shipping, vehicles, light absorbing carbon) and secondary industry (pollutant-aged sea salt, secondary ammonium sulphate, and primary and secondary nitrate) for  $PM_{2.5}$ . Note that for Stockton, the nitrate factor was included in the primary industry group. The sites were plotted as increasing distance from the coast, with Stockton being nearest to the coast (200 m) and Muswellbrook being further from the coast (100 km).

The contribution of the soil factor to  $PM_{2.5}$  mass is reasonably consistent at about 10% across the all sites (<1  $\mu g$  m<sup>-3</sup>), while the fresh sea salt decreases with distance from the coast from 23% (2.1  $\mu g$  m<sup>-3</sup>) at Stockton to 3% (0.3  $\mu g$  m<sup>-3</sup>) at Muswellbrook, and smoke increased with distance from the coast.

Primary industry was greatest at Stockton (due to the influence of ammonium nitrate from the prill plant) at 32% (2.9  $\mu g$  m<sup>-3</sup>) and lowest inland at Muswellbrook (8% or 0.6  $\mu g$  m<sup>-3</sup>). Except for Muswellbrook and Stockton, primary emissions across the sites accounted for 30% (3  $\mu g$  m<sup>-3</sup>) of the industry sources.

The largest contribution to  $PM_{2.5}$  was from secondary sources (32–44% or 2.1–3  $\mu g$  m<sup>-3</sup>) at all sites except at Muswellbrook, where woodsmoke and industry sources each contributed about 40% (3.4  $\mu g$  m<sup>-3</sup>). Except for Stockton and Muswellbrook, secondary reactions accounted for approximately 70% of the industry source, while at Stockton, with the presence of the prilling tower this split was 50% primary and 50% secondary while at Muswellbrook, the split was 20% primary and 80% secondary. Secondary industry contributions were lowest at Stockton and highest at Mayfield.



**Figure 7.** Annual average percent contribution shows the annual average percentage contribution of the source profiles for sea salt, soil, smoke (woodsmoke and other biomass smoke), primary industry (industry, mixed industry/vehicles, mixed industry/shipping, vehicles, primary nitrate), and secondary industry (pollutant-aged sea salt, secondary ammonium sulphate, and secondary nitrate) for  $PM_{2.5}$  on the left axis and annual average  $PM_{2.5}$  concentration (solid line) on the right axis. The sites were plotted in order of increasing distance from the coast with Stockton closest to the coast (0.2 km) and Muswellbrook furthest from the coast (100 km).

Comparison with Previous Studies in the Region

The long-term trend in sources influencing  $PM_{2.5}$  measured at the Mayfield site between 2008 and 2013 using IBA techniques and PMF analysis have been investigated [44] and nine source fingerprints identified: soil, secondary sulphate, seaspray, smoke, industrial processes (specifically related to calcium, manganese, and iron), and two different automobile sources. Anthropogenic sources comprised motor vehicles, smoke from biomass burning, and secondary sulphate from industrial processes contributed 70% of ambient  $PM_{2.5}$  in the Mayfield local area over the 15-year period. Over this 15-year period, there have been major changes in sources with the closure of the major iron and steel works in 1999, phasing out of leaded petrol in 2001, and the closure of a magnesium dioxide production plant in 2008.

It is difficult to directly compare the source fingerprints identified in the 15-year study [44] with those identified in this study because of the differences in species included in the PMF analysis and the closure of industries discussed above. However, in general there are important similarities in the sources identified in the 15-year analysis and the more recent analysis, with natural sources of sea salt and soil contributing to approximately 20-30% of the  $PM_{2.5}$  mass in both studies. In line with the phasing out of leaded petrol, the vehicle source identified in the recent study was significantly lower than the 15-year study. The lower woodsmoke contribution in the recent study resulted from the use of the unique tracer for biomass burning that separates out the woodsmoke component of the more generic 'smoke' factor identified in the 15-year study. The secondary sulphate source identified in the 15-year study was greater than that identified in the recent study since the addition of nitrate and ammonium concentrations in the recent study allows for the division of secondary sulphate into secondary ammonium nitrate. Despite these differences, both studies identified a contribution of 70-80% of anthropogenic aerosol to  $PM_{2.5}$  at Mayfield.

#### 5. Conclusions

Across the six sites and two size fractions over the two 12-month sampling periods, 14 factors were found to contribute to particle mass. Of these, three source profiles that were common to all sites, size fractions, and sampling periods included fresh sea salt, industry-aged sea salt, and soil.

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Four source profiles were common across all sites for  $PM_{2.5}$  including secondary sulphate, secondary and primary nitrate, mixed industry/vehicles, and woodsmoke. One source profile (other biomass smoke) was only identified in  $PM_{2.5}$  at Singleton and Muswellbrook and two source profiles (mixed industry/shipping and vehicles) were only identified in  $PM_{2.5}$  at Newcastle, Beresfield, Mayfield, and Stockton. Three sources (bioaerosol, light absorbing particles, and industry) were only identified in the  $PM_{2.5-10}$  size fraction at Mayfield and Stockton.

Industry was identified to contribute to seven of the factors: pollutant-aged sea salt (all sites and size fractions), mixed industry/vehicle, secondary ammonium sulphate, and secondary nitrate ( $PM_{2.5}$  at all sites), primary nitrate ( $PM_{2.5}$  at Stockton), industry shipping ( $PM_{2.5}$  at Newcastle, Beresfield, Mayfield, and Stockton), industry and light absorbing carbon (all sites with  $PM_{2.5-10}$ ).

Vehicles/transportation was identified to contribute to three factors: vehicles and mixed industry/shipping (PM<sub>2.5</sub> at Newcastle, Beresfield, Mayfield, and Stockton), mixed industry/vehicles (PM<sub>2.5</sub> all sites).

Anthropogenic primary emissions contributed to six source profiles (woodsmoke, industry, mixed industry/vehicles, mixed industry/shipping, vehicles, light absorbing carbon). Natural primary emissions contributed to four source profiles (sea salt, soil, bioaerosols, and other biomass smoke).

Secondary formation contributed to three of the source profiles (pollutant-aged sea salt, secondary ammonium sulphate, and primary/secondary nitrate.

Exposure to fine particles over long periods of time is known to have a greater impact on health than shorter term exposures and exposure to coarse particles. These studies identified that up to 40% of the fine particle mass resulted from direct anthropogenic emissions from industry or vehicles. The studies also provided information on the sources that contributed to elevated particle concentrations of fine particles at certain times of the year such as woodsmoke during winter at the inland sites and the prilling tower at Stockton between May and September when offshore winds direct the emissions from the plant to the sampling location. By identifying and quantifying the contribution of the different sources that add to particle loadings in the Hunter Valley of NSW, this study contributes to evidence-based policy and programs that aim to reduce the exposure of communities to particulate matter.

**Supplementary Materials:** The following are available online at <a href="http://www.mdpi.com/2073-4433/11/1/4/s1">http://www.mdpi.com/2073-4433/11/1/4/s1</a>, Figure S1: PMF factor fingerprints for PM $_{2.5}$  at Beresfield, Figure S2: PMF factor fingerprints for PM $_{2.5}$  at Mayfield, Figure S3: PMF factor fingerprints for PM $_{2.5}$  at Mayfield, Figure S4: PMF factor fingerprints for PM $_{2.5}$  at Muswellbrook, Figure S5: PMF factor fingerprints for PM $_{2.5}$  at Newcastle, Figure S6: PMF factor fingerprints for PM $_{2.5}$  at Stockton, Figure S8: PMF factor fingerprints for PM $_{2.5}$  at Stockton, Figure S8: PMF factor fingerprints for PM $_{2.5}$  at Stockton, Figure S8: PMF factor fingerprints for PM $_{2.5}$  at Stockton, Figure S8: PMF factor fingerprints for PM $_{2.5}$  at Stockton, Figure S8: PMF factor fingerprints for PM $_{2.5}$  at Stockton, Figure S8: PMF factor fingerprints for PM $_{2.5}$  at Stockton, Figure S8: PMF factor fingerprints for PM $_{2.5}$  at Stockton, Figure S8: PMF factor fingerprints for PM $_{2.5}$  at Stockton, Figure S8: PMF factor fingerprints for PM $_{2.5}$  at Stockton, Figure S8: PMF factor fingerprints for PM $_{2.5}$  at Stockton, Figure S8: PMF factor fingerprints for PM $_{2.5}$  at Stockton, Figure S8: PMF factor fingerprints for PM $_{2.5}$  at Stockton, Figure S8: PMF factor fingerprints for PM $_{2.5}$  at Stockton, Figure S8: PMF factor fingerprints for PM $_{2.5}$  at Stockton, Figure S8: PMF factor fingerprints for PM $_{2.5}$  at Stockton, Figure S8: PMF factor fingerprints for PM $_{2.5}$  at Stockton, Figure S8: PMF factor fingerprints for PM $_{2.5}$  at Stockton listing PMF category, and the median concentration and signal-to-noise ratio calculated by EPA PMF at each site, Table S3: Species included in PMF analysis of PM $_{2.5}$  data from Singleton and Muswellbrook listing PMF category, and the median concentration and signal-to-noise ratio calculated by EPA PMF at each site.

**Author Contributions:** Conceptualization, Y.S., M.F.H., D.D.C., and M.K.; Data curation P.W.S., E.S., and A.J.A.; Formal analysis M.F.H., A.J.A., D.D.C., and P.W.S.; Investigation, P.W.S., M.F.H., M.K., D.D.C., E.S., A.J.A., Y.S., and L.T.-C.C.; Writing-original draft preparation, M.K., M.F.H., P.S., M.D., E.S., and A.J.A.; Writing-review and editing, M.K., M.F.H., P.W.S., M.D., A.J.A., and Y.S.; Project administration, Y.S.; Funding acquisition, Y.S. All authors have read and agreed to the published version of the manuscript.

**Funding:** This research was funded by the NSW Environment Protection Authority (EPA), NSW Office of Environment and Heritage (OEH), NSW Ministry of Health, CSIRO Oceans & Atmosphere (O&A), and Australian Nuclear Science and Technology Organisation (ANSTO).

Acknowledgments: The authors acknowledge contributions from project support teams including Kate Boast at CSIRO, David Garton, Peter Drewer, and Craig Thompson at ANSTO, and the OEH project support and field staff Peter Crabbe, Scott Thompson, Gareth James, Upma Dutt, Stuart Masson, Chris Eiser, Melinda Hale, Matt Flack, and John Kirkwood. We also acknowledge inputs by Matt Riley of OEH, Ben Scalley of the NSW Ministry of Health, and Judy Greenwood and Leanne Graham from the NSW EPA. Access to the Stockton sampling site was enabled by Orica Limited and to the Mayfield site by CSIRO Energy. Nada Derek, Bronwyn Dunse, and Max Desservettaz assisted with the preparation of some of the figures. Descriptive and statistical analyses were carried

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out using R statistical analysis version 3.5.1 (R Core Team, 2016). The main package used in R statistical analysis is known as "openair" version 2.4 [45].

Conflicts of Interest: The authors declare no conflicts of interest.

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