

Transported Probability Density Function Based Modelling of Soot Particle Size Distributions in Non-Premixed Turbulent Jet Flames

M. A. Schiener, R. P. Lindstedt*

*Department of Mechanical Engineering, Imperial College,
Exhibition Road, London SW7 2AZ, UK*

Abstract

The need to establish actual particle size distributions (PSDs) of soot emissions from the nanoscale upwards, along with the current global indicators based on soot mass, stems from increasingly strict regulatory demands. In the current work, a mass and number density preserving sectional model is coupled with a transported probability density function (PDF) method to study the evolution of soot PSDs in two non-premixed turbulent jet flames at Reynolds numbers of 10,000 and 20,000. The transported PDF approach is closed at joint-scalar level and includes mass fractions of gas phase species, soot sections, as well as enthalpy, leading to a fully coupled 78-dimensional joint-scalar space, treating interactions between turbulence and gas phase/soot chemistry as well as radiation without further approximation. The gas phase chemistry features 144 reactions, 15 solved and 14 steady-state species and an acetylene-based soot inception model is calibrated using comprehensive detailed chemistry up to pyrene and applied to

*Corresponding author:

Email address: `p.lindstedt@imperial.ac.uk` (R. P. Lindstedt)

a well-stirred/plug flow reactor configuration. The derived nucleation rate is subsequently applied in the turbulent flame calculations. Soot surface growth is treated via a PAH analogy and oxidation via O, OH and O₂ is accounted for. The sectional model features 62 sections covering particle sizes in the range $0.38 \text{ nm} \leq d_p \leq 4.4 \text{ }\mu\text{m}$ and includes a model for the collision efficiency of small particles ($\leq 10 \text{ nm}$) based on the Lennard–Jones potential. The computed results reproduce the evolution of the PSDs with encouraging accuracy. It is also shown that the distribution of soot in mixture fraction space is affected by local extinction events.

Keywords:

Particle size distributions, Turbulent flames, Transported PDF methods, Nucleation rates, Soot surface chemistry

Supplemental Material is available.

1 1. Introduction

2 The ability to model the dynamic evolution of soot particle size distribu-
3 tions (PSDs) from the soot inception limit in premixed systems to diffusion
4 flame conditions is of fundamental importance in the light of increasingly
5 stringent regulations on particulate emissions. This stems from the need to
6 establish actual PSDs from the nanoscale upwards along with the current
7 global indicators based on soot mass. Sectional models allow the solution
8 of population balance equations (PBEs) and there is a corresponding need
9 to formulate mass and number density conserving models. To date, such
10 models have been developed and evaluated for laminar flames and simplified
11 reactor geometries. A mass conserving sectional approach was developed by

12 Smooke et al. [1], and Wen et al. [2] used a moving sectional approach. Bhatt
13 and Lindstedt [3] developed a fixed sectional method and studied soot in the
14 combined well-stirred (WSR) and plug flow (PFR) reactor configuration of
15 Manzello et al. [4]. The model was further applied to the PFR system of Kro-
16 nholm and Howard [5, 6]. The WSR/PFR setup was studied by Lindstedt
17 et al. [7] considering further experimental work [8] and introducing updated
18 thermodynamical data for polyaromatic hydrocarbons (PAHs). The method
19 was extended [9] in a study of the premixed laminar stagnation flow flames of
20 Abid et al. [10–12] to include a model for the coagulation efficiency of small
21 (< 10 nm) particles [13] based on the Lennard–Jones potential.

22 Moment methods [14] transport a finite set of moments of the particle size
23 distribution function, rather than attempting a direct solution of the discre-
24 tised PSD. Such approaches are computationally less expensive, making them
25 the choice for turbulent flame calculations to date. Lindstedt and Louloudi
26 [15] used a transported probability density function (PDF) approach [16] and
27 the method of moments with interpolative closure (MOMIC) [17] to study
28 soot formation in the turbulent diffusion flames by Kent and Honnery [18]
29 and Coppalle and Joyeux [19]. A number of alternative strategies for the re-
30 construction of the PSD in the context of moment methods have been devel-
31 oped, leading to the quadrature [20], direct quadrature [21], hybrid [22, 23],
32 conditional quadrature [24] and the extended conditional quadrature method
33 of moments [25].

34 By contrast, sectional methods that provide the full PSD have not been
35 evaluated in terms of their ability to reproduce experimental data from tur-
36 bulent flames. The current work removes this limitation by the inclusion of

37 the sectional model of Lindstedt and Waldheim [9] into a transported prob-
38 ability density function approach that permits the inclusion of direct chem-
39 istry effects. The overall model is fully coupled to the gas phase chemistry
40 and evaluated against the data sets of Boyette et al. [26] and Chowdhury et
41 al. [27].

42 2. Model

43 2.1. Sectional Soot Model

44 The current mass and number density preserving sectional approach has
45 been used in previous studies to compute soot particle size distributions in
46 WSR/PFR configurations [3, 5, 7] and laminar flames [9]. Here, a size range
47 up to 4.4 μm was covered by using a mass-based distribution of 62 soot
48 sections with a geometric spacing factor $f_s = 1.5$ for particles in the range
49 0.48–100 nm that is gradually relaxed to 2.0 for larger particles. The upper
50 particle size limit was selected to go beyond the experimental particle size
51 range (2–225 nm). The rates of soot nucleation, growth and oxidation are
52 shown in Table 1. Schiener and Lindstedt [28] explored the sensitivity to
53 the soot nucleation rate by combining transported PDF and moment-based
54 methods to calculate a turbulent non-premixed natural gas flame. A scaling
55 factor of 3.75 was derived to provide consistency between simplified acety-
56 lene [15, 34] and pyrene-based (A_4 , $d_{p,A_4} = 0.38$ nm) nucleation featuring a
57 first order reaction in the acetylene concentration as for Eqs. (1)–(2).



$$R_N = k_N(T) [\text{C}_2\text{H}_2] \quad (2)$$

58 The thermochemical properties of pyrene, determined at the G4MP2 and
 59 G3MP2B3 levels of theory [9], were assigned to the incipient soot particles.
 60 The rate of nucleation was derived by comparing the predicted PSDs obtained
 61 in a WSR/PFR configuration with comprehensive PAH chemistry and with
 62 the above simplified expression as discussed in Sec. 2.3. The acetylene-based
 63 nucleation model allows removal of gas phase PAH reactions with the number
 64 of solved species reduced from 359 [9, 29] to 15 [15] and a three order of
 65 magnitude reduction in computational cost.

66 The rate of soot growth is modelled via Eq. (3), where A_s is the soot
 67 surface area per unit volume.

$$R_G = k_G(T)\chi_s A_s [\text{C}_2\text{H}_2] \quad (3)$$

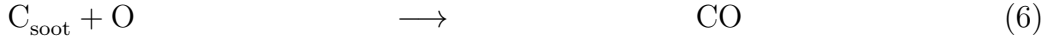
$$\chi_s = \alpha_s \Psi(T, \phi_k) \frac{\chi_{s-h}}{N_A} \quad (4)$$

68 Lindstedt and Louloudi [15] derived the naphthalene-based analogy for soot
 69 surface growth shown in Eq. (4), where $\Psi(T, \phi_k)$ is obtained as a function
 70 of temperature (T) and gas composition (ϕ_k) from truncated steady-state
 71 approximations (see supplemental material), $\chi_{s-h} = 2.32 \times 10^{19} \text{ m}^{-2}$ is the
 72 number of hydrogen sites per unit surface area and $N_A = 6.022 \times 10^{26} \text{ kmol}^{-1}$
 73 is Avogadro’s number. The parameter α_s in Eq. (4) denotes the fraction
 74 of sites available for hydrogen abstraction. It varies as a function of the
 75 reaction history and models based on the thermal age of soot particles in
 76 laminar flames have been proposed [30–32]. The choice of a constant mean
 77 value is common and depends on other model aspects as well as the flame
 78 configuration [15, 33–36]. The approach has been adopted in the current
 79 work with $\alpha_s = 0.50$, higher than that used by Lindstedt and Waldheim [9]
 80 ($\alpha_s = 0.20$), but within the range proposed by Kazakov et al. [35] ($0.35 \leq$

Table 1: Rate constants for soot nucleation ($k_N = k_{N,3}/3.75$ [28]), growth (k_G) and oxidation via OH (k_{OH}), O (k_O) and O₂ (k_{O_2}) in the form $A_i \alpha_i T^{\beta_i} \exp(-E_i/RT)$ [37–39]. Units are in K, kmol, m³ and s.

k_i	A_i	α_i	β_i	E_i/R
k_N	1.68×10^1	1	0	21,000
k_G	3.57×10^{21}	1	-3.176	7,471
k_{OH}	8.82	0.10	1/2	0
k_O	9.09	0.20	1/2	0
k_{O_2}	6.43	116	1/2	19,680

81 $\alpha_s \leq 0.60$) in the context of a method of moments approach for premixed
 82 laminar flames. A sensitivity analysis covering the range $\alpha_s = 0.50 \pm 0.20$
 83 was accordingly performed. Soot oxidation is modelled via Eqs. (5)–(8).



$$84 \quad R_O = (k_{OH}(T) [\text{OH}] + k_O(T) [\text{O}] + k_{O_2}(T) [\text{O}_2]) A_s \quad (8)$$

85 The molecular oxygen rate used in previous work [3, 15] was based on a study
 86 of carbon black oxidation by Roth et al. [38]. A rate with an increased barrier
 87 of 164 kJ/mol [34] for O₂, approaching the 195 kJ/mol proposed by Guo et
 88 al. [39], was used along with collision efficiencies for OH of 0.10 [38, 39] and
 89 0.20 for O [38]. Oxidation and surface growth in the 0th bin can be treated as
 90 for pyrene (A₄), but is here neglected for simplicity. Particles are considered
 91 spherical, and coagulation in the free molecular, continuum and transition
 92 regimes is modelled as a function of the Knudsen number ($\text{Kn} = 2\lambda/d_p$),

93 based on the mean free path (λ) and the soot particle diameter (d_p) [3].

94 Lindstedt and Waldheim [9] modelled the size dependent particle collision
 95 efficiency following Narsimhan and Ruckenstein [13], where the lower limit
 96 was derived based on the Lennard–Jones potential, assuming friction with the
 97 surrounding medium to be negligible. The corresponding collision efficiency
 98 (α_e^l) in the free-molecular regime is,

$$\alpha_e^l = 1 - \left(1 + \frac{\Phi_0}{k_b T \theta}\right) \exp\left(-\frac{\Phi_0}{k_b T \theta}\right) \quad (9)$$

$$\theta = 1 + \frac{2\Phi_0}{3k_b T} \quad (10)$$

99 where Φ_0 denotes the potential well depth, k_b is the Boltzmann constant and
 100 θ is the dimensionless surface temperature given by Eq. (10). The upper
 101 limit (α_e^u) for sufficiently large particles is set to unity [9]. The coagulation
 102 rate in the free-molecular regime is,

$$\begin{aligned} \beta_{i,j}^{C,f} = C_a \alpha_e & \left(\frac{3}{4\pi}\right)^{1/6} \left(\frac{6k_b T}{\rho_s}\right)^{1/2} \left(\frac{1}{v_i} + \frac{1}{v_j}\right)^{1/2} \\ & \times \left(v_i^{1/3} + v_j^{1/3}\right)^2 \end{aligned} \quad (11)$$

103 where $C_a = 3.0$ [9] is the van der Waals enhancement factor, v_i denotes the
 104 volume of particles in the i th soot section and $\rho_s = 1800 \text{ kg/m}^3$ is the soot
 105 density. The parameter α_e denotes the collision efficiency, calculated from
 106 the lower and upper bounds using a blending function (f_i),

$$\alpha_e = (f_i f_j)^{1/2} \alpha_e^u + (1 - (f_i f_j)^{1/2}) \alpha_e^l \quad (12)$$

$$f_i = \frac{1}{2} (\tanh A^* (d_{p,i} - D) + 1) \quad (13)$$

107 where D is the particle diameter at which the lower bound starts becoming
 108 insignificant and $A^* = \ln(\alpha_{e,A_4}/(100 - \alpha_{e,A_4}))/ (2d_{p,A_4} - 2D)$ is defined so that

109 the influence of the upper bound on pyrene is negligible [9]. Lindstedt and
 110 Waldheim [9] proposed a functional form for the upper bound D , based on
 111 the maximum flame temperature in laminar premixed C_2H_4 flames [10–12],
 112 resulting in values in the range $2.5 \leq D \leq 6$ nm. Narsimhan and Ruck-
 113 enstein [13] and D’Alessio et al. [40] suggest the upper bound to be close
 114 to or above 6 nm. A condition dependent increase of the rate of internal
 115 carbonisation with temperature was proposed as a possible explanation for
 116 discrepancies between different studies [9]. In the current work, the sensitiv-
 117 ity to D is explored for the range $2 \leq D \leq 6$ nm (see Sec. 3). The Hamaker
 118 constant determines the potential energy well-depth Φ_0 , and a lower limit
 119 value of 7.0×10^{-20} J for non-carbonised particles is used [9]. This is some-
 120 what higher than the value for benzene (5.0×10^{-20} J) applied by D’Anna and
 121 Kent [41] and the lower limit value of 3.0×10^{-20} J by D’Alessio et al. [40].
 122 A sensitivity analysis for values in the range 3.0×10^{-20} to 7.0×10^{-20} J was
 123 performed (see Sec. 3).

124 2.2. Transported PDF Method Implementation

125 Lindstedt et al. [15, 42, 43] coupled a two-dimensional implicit Reynolds-
 126 averaged Navier-Stokes (RANS) solution algorithm for parabolic velocity
 127 fields with turbulence properties obtained using the SSG second order clo-
 128 sure [44] to a transported PDF approach closed at joint-scalar level [16]. The
 129 latter is here extended to include the full sectional soot model, such that the
 130 joint-scalar PDF can be expressed as $\tilde{f}_{\underline{\phi}} = (\underline{\psi}; \underline{x}, t)$ where $\underline{\psi}$ expresses the
 131 fully coupled joint-scalar sample space of a random vector $\underline{\phi} = (Y_i, N_j, H)$,
 132 where Y_i are the species mass fractions, N_j denotes the number density of
 133 particles for each soot section (the mass of each soot section is defined) and

134 H the mixture enthalpy. The transport equation of the joint-scalar proba-
 135 bility density function is solved using moving Lagrangian particles. Scalar
 136 mixing, including soot sections, is treated via the modified Curl’s model by
 137 Janicka et al. [45], with a constant ratio of turbulent and scalar time-scale of
 138 $C_\phi = 2.3$ [37].

139 The method allows the inclusion of turbulence-chemistry interactions in
 140 closed form. The coupling of turbulence to radiation is facilitated via the
 141 inclusion of enthalpy as a solved scalar and an optically thin model [46] for
 142 radiative heat losses from gas phase species (H_2O , CO , CO_2 and CH_4) and
 143 soot [15]. The applied systematically reduced gas phase chemistry [15, 37]
 144 features 144 reactions, 15 solved (H , O , OH , HO_2 , H_2O , H_2 , O_2 , CO , CO_2 ,
 145 CH_3 , CH_4 , C_2H_2 , C_2H_4 , C_2H_6 , and N_2) and 14 steady-state species (C , CH ,
 146 $^1\text{CH}_2$, $^3\text{CH}_2$, CHO , CH_2OH , CH_3O , C_2 , C_2H , C_2H_3 , C_2H_5 , C_2HO , $\text{C}_2\text{H}_2\text{O}$,

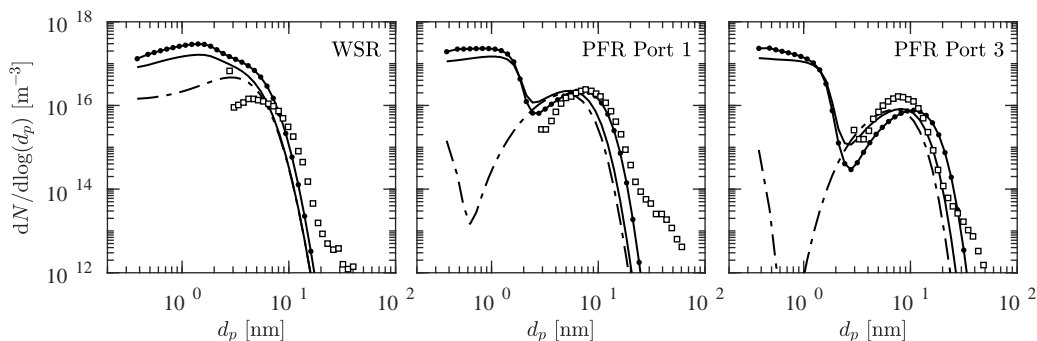


Figure 1: Soot PSDs in the WSR and at PFR Port 1 and 3 of the WSR/PFR setup of Manzello et al. [4]. Measurements by Lenhert et al. [8] shown with open squares (\square), calculations using pyrene-based nucleation with dots/lines (\bullet), and the acetylene-based nucleation model with solid lines (—). Dashed lines (-- --) show calculations with the lower limit collision efficiency model replaced with $\alpha_e = 1$ for acetylene-based nucleation.

147 and CH_2O) leading to a fully coupled solved joint-scalar space featuring 15
 148 chemical species, 62 soot sections and enthalpy. The WSR/PFR calculations
 149 featured the detailed gas phase chemistry by Waldheim [29] comprising 359
 150 species and 1789 reactions.

151 A fine grid with 500 cells in radial direction was used, with 61 cells located
 152 in the half-width of the fuel jet in the exit plane, 18 cells in the pilot zone of
 153 the burner, and the rest initially located in the co-flow. The axial grid reso-
 154 lution was determined at run-time according to a restrictive CFL criterion,
 155 with cells radially re-distributed in physical space as the flow develops, while

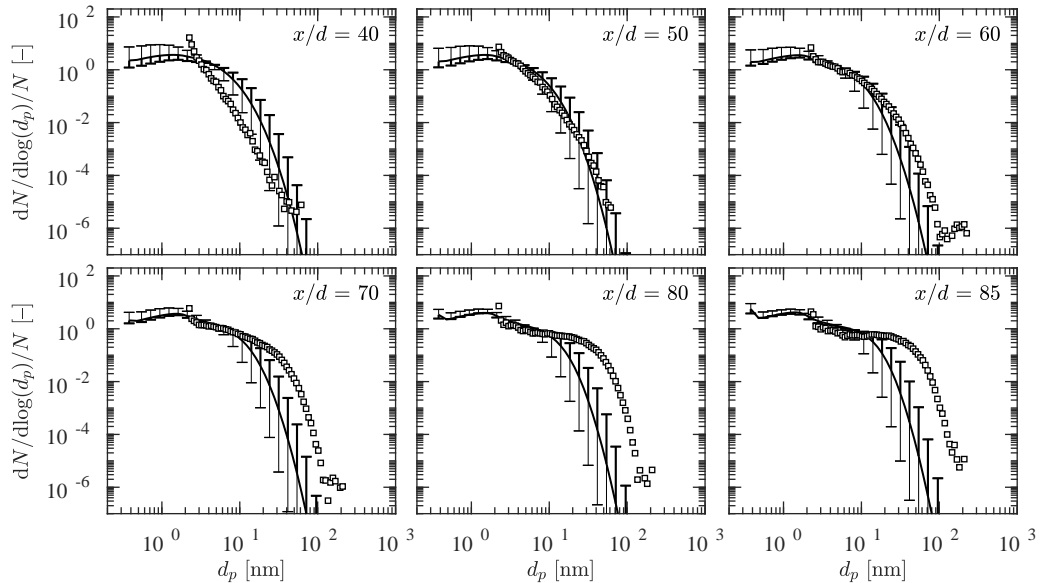


Figure 2: Normalised soot PSDs at the centreline of a $\text{C}_2\text{H}_4/\text{N}_2$ turbulent diffusion flame at $\text{Re} = 10,000$. Measurements by Chowdhury et al. [27] shown with open squares (\square). Calculated soot PSDs are shown with lines ($—$). The impact of changing the surface reactivity parameter $\alpha_s = 0.50 \pm 0.20$ is shown with thick and thin bars, respectively. For clarity, one out of every two measured data points is omitted.

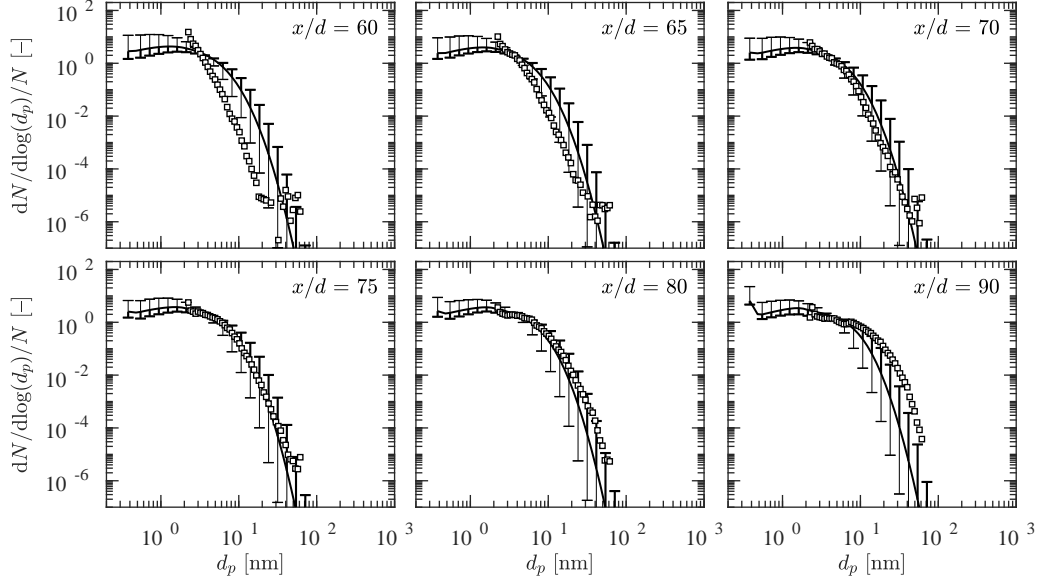


Figure 3: Normalised soot PSDs at the centreline of a C_2H_4/N_2 turbulent diffusion flame at $Re = 20,000$. Measurements by Boyette et al. [26] and Chowdhury et al. [27] shown with open squares (\square). Calculated soot PSDs are shown with lines ($—$). The impact of changing the surface reactivity parameter $\alpha_s = 0.50 \pm 0.20$ is shown with thick and thin bars, respectively. For clarity, one out of every two measured data points is omitted.

156 keeping their position in stream function space fixed [47]. An initial number
 157 of 100 stochastic Lagrangian particles per cell was used. Results shown are
 158 independent of the grid resolution and number of particles.

159 2.3. Experimental Data Sets

160 The full sectional model was first applied to the well-stirred/plug flow re-
 161 actor (WSR/PFR) configuration of Manziello et al. [4, 8] featuring a C_2H_4 /air
 162 mixture at an equivalence ratio $\phi = 2.0$, close to the soot inception limit, and
 163 a temperature of 1723 K in the WSR with temperatures in the subsequent
 164 PFR following a profile descending from 1420 K to 1340 K as described by

165 Waldheim [29]. Boyette et al. [26] and Chowdhury et al. [27] measured PSDs
166 in turbulent jet flames using a scanning mobility particle sizer and two nano
167 differential mobility analysers with different size ranges. The burner design
168 was based on that of Zhang et al. [48] featuring a C₂H₄/N₂ central fuel jet
169 (at a volume ratio of 35/65) of diameter 3.2 mm and a concentric C₂H₄/air
170 pilot at $\phi = 0.90$. Two sooting jet flames with $Re = 10,000$ and $20,000$ at
171 atmospheric pressure were investigated. In the calculations, volumetric flow
172 rates were imposed according to Chowdhury et al. [27] with the pilot flow
173 assumed to be at chemical equilibrium.

174 **3. Results and Discussion**

175 The measured and calculated soot PSDs in the WSR/PFR configuration
176 of Manzello et al. [4, 8] are shown in Fig. 1. Results obtained with the
177 fitted acetylene-based nucleation model, outlined above, are compared to
178 the result obtained with the detailed pyrene-based inception chemistry of
179 Lindstedt and Waldheim [9]. The two models agree well for the nucleation
180 rate in Table 1. The two orders of magnitude reduction in the pre-exponential
181 factor of the nucleation rate, compared to previous work [15, 34], is consistent
182 with the need for a large reduction in simplified nucleation rate expressions
183 for premixed systems identified by Faeth and co-workers [49, 50].

184 For $\alpha_s = 0.20$ [9] and the lower limit collision efficiency model with $D =$
185 2 nm, calculations roughly match the measured PSDs in the WSR section.
186 Agreement improves with increasing residence time, and the subsequent PFR
187 evolution is qualitatively reproduced with the predicted peak locations for
188 C₂H₂-based nucleation at $d_p \approx 5$ nm at Port 1 of the PFR and at $d_p \approx 8$ nm at

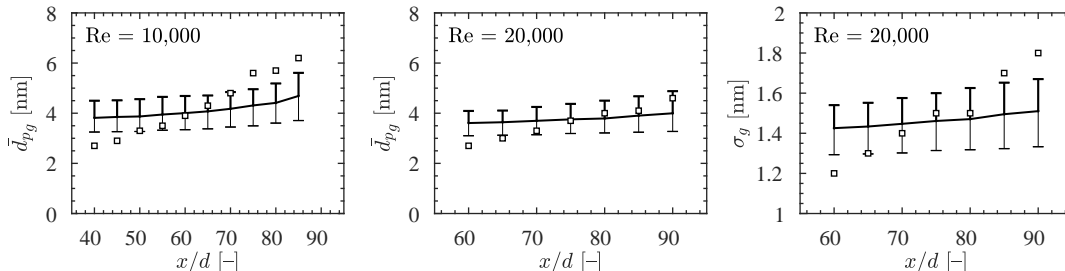


Figure 4: Geometric mean diameter (\bar{d}_{pg}) of centreline PSDs in the flames at $Re = 10,000$ (left) and 20,000 (centre) and geometric standard deviation (σ_g) at $Re = 20,000$ (right). Lines and symbols as in Figs. 2–3. Experimental data by Boyette et al. [26] and Chowdhury et al. [27].

189 Port 3. However, larger particles ($d_p > 25$ nm) with concentrations at least
 190 two orders of magnitude below the peak are under-predicted in the PFR.
 191 While the generality of such simplified nucleation rates is questionable, the
 192 agreement is sufficient for the purpose of evaluating the evolution of PSDs in
 193 the current turbulent flames. The omission of the collision efficiency model
 194 (i.e. $\alpha_e = 1$ in Eq. (12)) leads to a pronounced depletion of small particles that
 195 is inconsistent with laminar flame data [9–12]. It was further investigated for
 196 the WSR/PFR data sets by Schiener and Lindstedt [28] and shown to occur
 197 for a wide range of nucleation rates.

198 Measured and calculated PSDs at the centreline of the two turbulent diffu-
 199 sion flames at $Re = 10,000$ and 20,000 are shown in Fig. 2 and 3, respectively.
 200 The PSDs are normalised using the total particle concentration (N) of all
 201 particles within the experimental detection limits (2 nm to 225 nm) in order
 202 to be consistent with the experimental procedure. The value for the surface
 203 reactivity parameter was set to $\alpha_s = 0.50$ and the sensitivity to values in the
 204 range $0.30 \leq \alpha_s \leq 0.70$ is shown. The agreement with experiment is arguably

205 fair overall and improved for the less sooting flame at $Re = 20,000$. This is
206 perhaps surprising given the simplified nucleation rate expression applied,
207 but also encouraging as practical applications tend to operate at higher Re
208 numbers. Particle concentrations at the upper end of the distribution tend
209 to be under-predicted at measurement locations further downstream. The
210 agreement with the lower end of the measured distributions improves down-
211 stream. The measured maximum for small particles near the detection limit
212 of the condensation particle counter (CPC) is also disproportionately affected
213 by the algorithm correcting for diffusion losses inside the scanning mobility
214 particle sizer (SMPS) [26, 27]. Boyette et al. [26] note that “some caution
215 should be exercised when considering the data, especially in the range be-
216 low 4 nm” and Chowdhury et al. [27] remark that “readers may choose to
217 disregard the data for very small particles due to the large uncertainty”.
218 However, the data is included here for guidance. The applied values of α_s
219 are somewhat higher than those used by Lindstedt and Waldheim [9] for the
220 laminar premixed ethylene flames of Abid et al. [10–12] and the sensitivity
221 to the parameter suggests that improved descriptions that are valid across a
222 wider range of Lagrangian particle time histories, as encountered in different
223 devices, remain desirable.

224 The sensitivity of the calculated PSDs in both flames to the model for
225 the lower limit of the collision efficiency and model parameters was explored.
226 The calculations shown in Figs. 2–3 use $D = 2$ nm, a value of the Hamaker
227 constant of 7.0×10^{-20} J and $C_a = 3.0$. The value of $D = 2$ nm, marking the
228 passing to the upper bound of the collision efficiency, is lower than applied
229 for premixed laminar flames [9] and collision efficiencies at the lower limit

230 will be further decreased when a value of the Hamaker constant lower than
 231 the current 7.0×10^{-20} J is used [40, 41]. Compared to a value of $C_a = 2.2$
 232 commonly used in moment methods [22, 35, 51], the current van der Waals
 233 enhancement factor of 3.0 will increase coagulation globally. However, only a
 234 moderate sensitivity to the replacement of the collision efficiency model with
 235 the assumption $\alpha_e = 1$ [3] or to an increased value of $D = 6$ nm was observed,
 236 and then mostly for small particles outside of the experimental data range.
 237 The impact of a decrease of the Hamaker constant to 3.0×10^{-20} J or of
 238 the van der Waals enhancement factor to $C_a = 2.2$ is even more limited.
 239 Accordingly, these results are included in the Supplemental Material.

240 Geometric mean diameters (\bar{d}_{pg}) and standard deviations (σ_g) at $Re =$
 241 20,000 [26, 27] are compared to calculations in Fig. 4. Calculations initially
 242 overpredict the measured values for $\bar{d}_{pg} < 3.5$ nm, with improvements for
 243 larger particles, consistent with experimental uncertainties as outlined above.

244 Figure 5 shows scatter plots of temperature (T) and soot volume fraction
 245 (f_v) at $Re = 20,000$, with weighted centred moving averages also displayed.
 246 Soot is primarily present on the rich side of the stoichiometric mixture frac-
 247 tion ($f_{st} \approx 0.16$), with a maximum around $f = 0.25$. At $x/d = 20$, a
 248 considerable level of local extinction is apparent from the temperature distri-
 249 bution. The soot peak is less pronounced with relatively more soot appearing
 250 on the lean side of stoichiometry due to mixing and local extinction as com-
 251 pared to locations further downstream. Lindstedt et al. [42, 43] have shown
 252 that the current approach correctly predicts local extinction and reignition
 253 for turbulent non-premixed jet flames at high Reynolds numbers. Further
 254 data are included in the Supplemental Material.

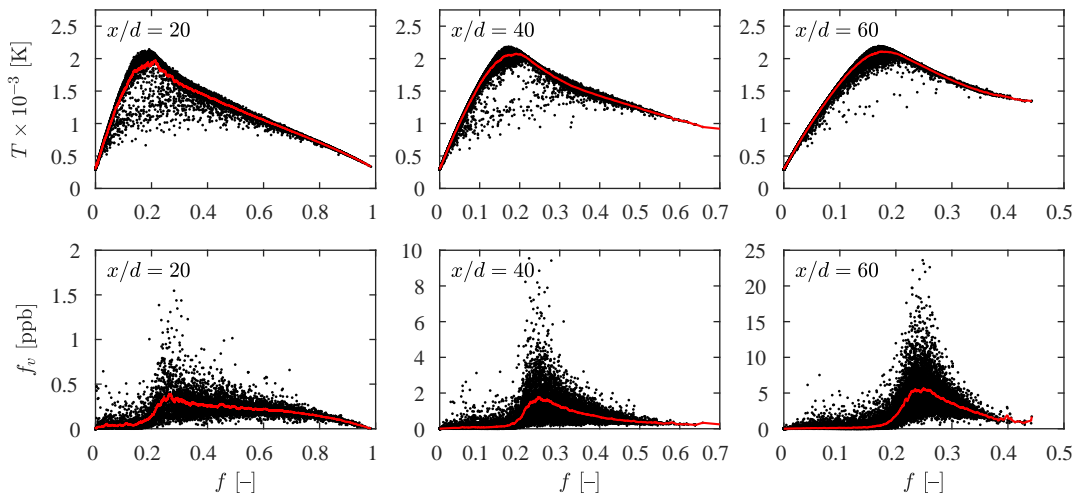


Figure 5: Scatter plots of calculated temperature (top) and soot volume fraction (bottom) at different axial locations in a C_2H_4/N_2 turbulent diffusion flame at $Re = 20,000$. The Lagrangian particles are shown with black dots. Red lines represent centred moving averages with a window size of 1 % of the range of mixture fraction (f) values and take particle weights into account.

255 4. Conclusions

256 Soot particle size distributions in a well-stirred/plug flow reactor setup
 257 [4, 8] and two turbulent non-premixed diffusion flames [26, 27] have been
 258 studied computationally using the combination of a mass and number den-
 259 sity preserving sectional model and a transported PDF approach closed at
 260 the joint-scalar level. The model for the coagulation collision efficiency of
 261 small particles by Lindstedt and Waldheim [9] was included and found to
 262 improve the qualitative agreement with measured PSDs for the turbulent
 263 flames. A sensitivity study shows that the predicted PSDs in the turbu-
 264 lent flames are insensitive to changes of the Hamaker constant in the range
 265 $3.0\text{--}7.0 \times 10^{-20}$ and to the van der Waals enhancement factor in the range

266 $C_a = 2.2\text{--}3.0$. A moderate sensitivity to the parameter D , marking the up-
267 per limit of the reduced collision efficiency model for small particles, was
268 observed with agreement improved for $D = 2$ nm compared to 6 nm.

269 Calculations matched measured data well, although the treatment of the
270 surface reactivity parameter α_s of the PAH based growth model remains a
271 source of uncertainty. More general formulations remain desirable. The same
272 applies to detailed and simplified models for soot nucleation. However, it also
273 appears clear that the inclusion of the current sectional model into a trans-
274 ported PDF based framework for the prediction of turbulent flames enables
275 computations of the evolution of soot PSDs with a similar accuracy to that
276 encountered in laminar flames. The latter finding is of significant practical
277 importance. It has also been shown that the distribution of soot in mixture
278 fraction space is affected by local extinction events.

279 **Acknowledgments**

280 The authors wish to gratefully acknowledge the support of the European
281 Union under the SOPRANO H2020 project award 690724. The data pro-
282 vided by Mr Wesley Boyette and Professor William Roberts from the Clean
283 Combustion Centre at KAUST is gratefully acknowledged.

284 **References**

- 285 [1] M. D. Smooke, R. J. Hall, M. B. Colket, J. Fielding, M. B. Long, C. S.
286 Mcenally, *Combust. Theor* 8 (2004) 593–606.
- 287 [2] J. Z. Wen, M. J. Thomson, S. H. Park, S. N. Rogak, M. F. Lightstone,
288 *Proc. Combust. Inst.* 30 (2005) 1477–1483.

- 289 [3] J. S. Bhatt, R. P. Lindstedt, *Proc. Combust. Inst.* 32 (2009) 713–720.
- 290 [4] S. L. Manzello, D. B. Lenhert, A. Yozgatligil, M. T. Donovan, G. W.
291 Mulholland, M. R. Zachariah, W. Tsang, *Proc. Combust. Inst.* 31 (2007)
292 675–683.
- 293 [5] R. P. Lindstedt, V. Markaki, R. K. Robinson, in: H. Bockhorn,
294 A. D’Anna, H. Wang (Eds.), *Combustion Generated Fine Carbonaceous*
295 *Particles*, KIT Scientific Publishing, Karlsruhe, 2009, pp. 499–521.
- 296 [6] D. F. Kronholm, J. B. Howard, *Proc. Combust. Inst.* 28 (2000) 2555–
297 2561.
- 298 [7] R. P. Lindstedt, B. B. O. Waldheim, R. K. Robinson, in: *8th Int. Symp.*
299 *Clean. Diesel Engines*, Shell Global Solutions (UK), Chester, 2011, pp.
300 36–39.
- 301 [8] D. B. Lenhert, S. L. Manzello, *Proc. Combust. Inst.* 32 (2009) 657–664.
- 302 [9] R. P. Lindstedt, B. B. O. Waldheim, *Proc. Combust. Inst.* 34 (2013)
303 1861–1868.
- 304 [10] A. D. Abid, N. Heinz, E. D. Tolmachoff, D. J. Phares, C. S. Campbell,
305 H. Wang, *Combust. Flame* 154 (2008) 775–788.
- 306 [11] A. D. Abid, E. D. Tolmachoff, D. J. Phares, H. Wang, Y. Liu, A. Laskin,
307 *Proc. Combust. Inst.* 32 (2009) 681–688.
- 308 [12] A. D. Abid, J. Camacho, D. A. Sheen, H. Wang, *Combust. Flame* 156
309 (2009) 1862–1870.

- 310 [13] G. Narsimhan, E. Ruckenstein, *J. Colloid Interface Sci.* 104 (1985) 344–
311 369.
- 312 [14] M. Frenklach, S. J. Harris, *J. Colloid Interface Sci.* 118 (1987) 252–261.
- 313 [15] R. P. Lindstedt, S. A. Louloudi, *Proc. Combust. Inst.* 30 (2005) 775–782.
- 314 [16] S. B. Pope, *Prog. Energy Combust. Sci.* 11 (1985) 119–192.
- 315 [17] M. Frenklach, *Chem. Eng. Sci.* 57 (2002) 2229–2239.
- 316 [18] J. H. Kent, D. Honnery, *Combust. Sci. Technol.* 54 (1987) 383–398.
- 317 [19] A. Coppalle, D. Joyeux, *Combust. Flame* 96 (1994) 275–285.
- 318 [20] R. McGraw, *Aerosol Sci. Technol.* 27 (1997) 255–265.
- 319 [21] D. L. Marchisio, R. O. Fox, *J. Aerosol Sci.* 36 (2005) 43–73.
- 320 [22] M. E. Mueller, G. Blanquart, H. Pitsch, *Combust. Flame* 156 (2009)
321 1143–1155.
- 322 [23] M. E. Mueller, H. Pitsch, *Combust. Flame* 159 (2012) 2166–2180.
- 323 [24] C. Yuan, R. O. Fox, *J. Comput. Phys.* 230 (2011) 8216–8246.
- 324 [25] S. Salenbauch, A. Cuoci, A. Frassoldati, C. Saggese, T. Faravelli,
325 C. Hasse, *Combust. Flame* 162 (2015) 2529–2543.
- 326 [26] W. Boyette, S. Chowdhury, W. Roberts, *Flow, Turbul. Combust.* 98
327 (2017) 1173–1186.

- 328 [27] S. Chowdhury, W. R. Boyette, W. L. Roberts, *J. Aerosol Sci.* 106 (2017)
329 56–67.
- 330 [28] M. A. Schiener, R. P. Lindstedt, *Combust. Theory Model.* (accepted for
331 publication 16 April 2018).
- 332 [29] B. B. O. Waldheim, Modelling of soot formation and aromatic growth
333 in laminar flames and reactor systems, Ph.D. thesis, Imperial College
334 London, 2015.
- 335 [30] A. Veshkini, S. B. Dworkin, M. J. Thomson, *Combust. Flame* 161 (2014)
336 3191–3200.
- 337 [31] A. Khosousi, S. B. Dworkin, *Proc. Combust. Inst.* 35 (2015) 1903–1910.
- 338 [32] A. Khosousi, S. B. Dworkin, *Combust. Flame* 162 (2015) 4523–4532.
- 339 [33] M. Frenklach, H. Wang, in: H. Bockhorn (Ed.), *Soot Formation in Com-*
340 *bustion: Mechanisms and Models*, Springer-Verlag, 1994, pp. 165–192.
- 341 [34] R. P. Lindstedt, in: H. Bockhorn (Ed.), *Soot Formation in Combustion:*
342 *Mechanisms and Models*, Springer-Verlag, 1994, pp. 417–441.
- 343 [35] A. Kazakov, H. Wang, M. Frenklach, *Combust. Flame* 100 (1995) 111–
344 120.
- 345 [36] J. Appel, H. Bockhorn, M. Frenklach, *Combust. Flame* 121 (2000) 122–
346 136.
- 347 [37] S. A. Louloudi, Transported probability density function modeling of
348 turbulent jet flames, Ph.D. thesis, Imperial College London, 2003.

- 349 [38] P. Roth, O. Brandt, S. von Gersum, Proc. Combust. Inst. 23 (1990)
350 1485–1491.
- 351 [39] H. Guo, P. M. Anderson, P. B. Sunderland, Fuel 172 (2016) 248–252.
- 352 [40] A. D’Alessio, A. C. Barone, R. Cau, A. D’Anna, P. Minutolo, Proc.
353 Combust. Inst. 30 (2005) 2595–2603.
- 354 [41] A. D’Anna, J. H. Kent, Combust. Flame 152 (2008) 573–587.
- 355 [42] R. P. Lindstedt, S. A. Louloudi, E. M. Váos, Proc. Combust. Inst. 28
356 (2000) 149–156.
- 357 [43] R. P. Lindstedt, S. A. Louloudi, Proc. Combust. Inst. 29 (2002) 2147–
358 2154.
- 359 [44] C. G. Speziale, S. Sarkar, T. B. Gatski, J. Fluid Mech. 227 (1991) 245–
360 272.
- 361 [45] J. Janicka, W. Kolbe, W. Kollmann, J. Non-Equilibrium Thermodyn. 4
362 (1979) 47–66.
- 363 [46] W. L. Grosshandler, RADCAL: A Narrow-Band Model for Radiation
364 Calculations in a Combustion Environment., Technical Report, NIST
365 Technical Note 1402, 1993.
- 366 [47] D. B. Spalding, GENMIX – A General Computer Program for Two-
367 Dimensional Parabolic Phenomena, Pergamon Press, Oxford, 1977.
- 368 [48] J. Zhang, C. R. Shaddix, R. W. Schefer, Rev. Sci. Instrum. 82 (2011)
369 1–10.

- 370 [49] P. B. Sunderland, Ü. Ö. Köylü, G. M. Faeth, *Combust. Flame* 100 (1995)
371 310–322.
- 372 [50] P. B. Sunderland, G. M. Faeth, *Combust. Flame* 105 (1996) 132–146.
- 373 [51] A. Kazakov, M. Frenklach, *Combust. Flame* 114 (1998) 484–501.

374 **List of Tables**

375 **Table 1:** Rate constants for soot nucleation ($k_N = k_{N,3}/3.75$ [28]), growth
376 (k_G) and oxidation via OH (k_{OH}), O (k_O) and O₂ (k_{O_2}) in the form
377 $A_i\alpha_iT^{\beta_i}\exp(-E_i/RT)$ [37–39]. Units are in K, kmol, m³ and s.

378 **List of Figures**

379 **Figure 1:** Soot PSDs in the WSR and at PFR Port 1 and 3 of the WSR/PFR
380 setup of Manzello et al. [4]. Measurements by Lenhert et al. [8] shown
381 with open squares (\square), calculations using pyrene-based nucleation with
382 dots/lines ($-\bullet-$), and the acetylene-based nucleation model with solid
383 lines ($—$). Dashed lines ($- - -$) show calculations with the lower limit
384 collision efficiency model replaced with $\alpha_e = 1$ for acetylene-based nu-
385 cleation.

386 **Figure 2:** Normalised soot PSDs at the centreline of a C₂H₄/N₂ turbulent
387 diffusion flame at Re = 10,000. Measurements by Chowdhury et al. [27]
388 shown with open squares (\square). Calculated soot PSDs are shown with
389 lines ($—$). The impact of changing the surface reactivity parameter
390 $\alpha_s = 0.50 \pm 0.20$ is shown with thick and thin bars, respectively. For
391 clarity, one out of every two measured data points is omitted.

392 **Figure 3:** Normalised soot PSDs at the centreline of a C₂H₄/N₂ turbulent
393 diffusion flame at Re = 20,000. Measurements by Boyette et al. [26] and
394 Chowdhury et al. [27] shown with open squares (\square). Calculated soot
395 PSDs are shown with lines ($—$). The impact of changing the surface
396 reactivity parameter $\alpha_s = 0.50 \pm 0.20$ is shown with thick and thin bars,

397 respectively. For clarity, one out of every two measured data points is
398 omitted.

399 **Figure 4:** Geometric mean diameter (\bar{d}_{pg}) of centreline PSDs in the flames
400 at $Re = 10,000$ (left) and $20,000$ (centre) and geometric standard de-
401 viation (σ_g) at $Re = 20,000$ (right). Lines and symbols as in Figs. 2–3.
402 Experimental data by Boyette et al. [26] and Chowdhury et al. [27].

403 **Figure 5:** Scatter plots of calculated temperature (top) and soot volume
404 fraction (bottom) at different axial locations in a C_2H_4/N_2 turbulent
405 diffusion flame at $Re = 20,000$. The Lagrangian particles are shown
406 with black dots. Red lines represent centred moving averages with a
407 window size of 1 % of the range of mixture fraction (f) values and take
408 particle weights into account.

409 **List of Supplemental Material**

410 Supplemental material is included in form of a single PDF document, contain-
411 ing the following sections, tables and figures. The references in the captions
412 below refer to the separate list of references in the supplemental document.

413 *S1. PAH Analogy Model for Soot Surface Growth*

414 **Table S1:** Reaction rate constants for the PAH analogy of soot surface
415 chemistry [2] presented in the form $A_i\alpha_iT^{\beta_i}\exp(-E_i/RT)$. Units are
416 in K, kmol, m³ and s.

417 *S2. Turbulent Flames: Sensitivities of PSDs and Scatter Plots*

418 **Figure S1:** Normalised soot PSDs at the centreline of C₂H₄/N₂ turbulent
419 diffusion flames at Re = 10,000 (top) and 20,000 (bottom). Measure-
420 ments by Boyette et al. [6] and Chowdhury et al. [7] are shown with
421 open squares (□). The original rate constant for reaction (II) [15] was
422 used with $\alpha_s = 1.00 \pm 0.50$.

423 **Figure S2:** Normalised soot PSDs at the centreline of C₂H₄/N₂ turbulent
424 diffusion flames at Re = 10,000 (top) and 20,000 (bottom). Measure-
425 ments by Boyette et al. [6] and Chowdhury et al. [7] are shown with
426 open squares (□). The sensitivity of the calculated PSDs (lines, —) to
427 the replacement of the lower limit collision efficiency model with $\alpha_e = 1$
428 is shown with bars.

429 **Figure S3:** Normalised soot PSDs at the centreline of C₂H₄/N₂ turbulent
430 diffusion flames at Re = 10,000 (top) and 20,000 (bottom). Measure-
431 ments by Boyette et al. [6] and Chowdhury et al. [7] are shown with

432 open squares (\square). The sensitivity of the calculated PSDs (lines, —) to
433 an increase of the parameter $D = 2$ nm to 6 nm is shown with bars.

434 **Figure S4:** Normalised soot PSDs at the centreline of C_2H_4/N_2 turbulent
435 diffusion flames at $Re = 10,000$ (top) and $20,000$ (bottom). Measure-
436 ments by Boyette et al. [6] and Chowdhury et al. [7] are shown with
437 open squares (\square). The sensitivity of the calculated PSDs (lines, —) to
438 a decrease of the Hamaker constant from 7×10^{-20} J to 3×10^{-20} J is
439 shown with bars.

440 **Figure S5:** Normalised soot PSDs at the centreline of C_2H_4/N_2 turbulent
441 diffusion flames at $Re = 10,000$ (top) and $20,000$ (bottom). Measure-
442 ments by Boyette et al. [6] and Chowdhury et al. [7] are shown with
443 open squares (\square). The sensitivity of the calculated PSDs (lines, —) to
444 a decrease of the van der Waals enhancement factor from $C_a = 3.0$ to
445 2.2 is shown with bars.

446 **Figure S6:** Scatter plots of calculated temperature, species mass fractions
447 and soot volume fraction at different axial locations in a C_2H_4/N_2 tur-
448 bulent diffusion flame at $Re = 10,000$. The states of the Lagrangian
449 particles are shown with black dots. Red lines represent centred mov-
450 ing averages with a window size of 1 % of the range of mixture fraction
451 (f) values, taking into account particle weight.

452 **Figure S7:** Scatter plots of calculated temperature, species mass fractions
453 and soot volume fraction at different axial locations in a C_2H_4/N_2 tur-
454 bulent diffusion flame at $Re = 20,000$. The states of the Lagrangian

455 particles are shown with black dots. Red lines represent centred mov-
456 ing averages with a window size of 1 % of the range of mixture fraction
457 (f) values, taking into account particle weight.