## Strömungstechnik

Achim Wick

Population Balance Modeling and Large-Eddy Simulation of Soot Formation and Oxidation



#### Population Balance Modeling and Large-Eddy Simulation of Soot Formation and Oxidation

#### Populationsbilanz-Modellierung und Large-Eddy Simulation von Rußbildung und Rußoxidation

Von der Fakultät für Maschinenwesen der Rheinisch-Westfälischen Technischen Hochschule Aachen zur Erlangung des akademischen Grades eines Doktors der Ingenieurwissenschaften genehmigte Dissertation

vorgelegt von

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#### **Achim Wick**

# Population Balance Modeling and Large-Eddy Simulation of Soot Formation and Oxidation

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#### **Publications**

This thesis is mainly based on the following peer-reviewed publications; some material is updated, together with some new introduced results:

- A. Wick, M. Frenklach, and H. Pitsch (2020): Systematic assessment of the Method of Moments with Interpolative Closure and guidelines for its application to soot particle dynamics in laminar and turbulent flames. *Combustion and Flame*, 214, 450-463.
- A. Wick, T.-T. Nguyen, F. Laurent, R. O. Fox, and H. Pitsch (2017): Modeling soot oxidation with the Extended Quadrature Method of Moments. *Proceedings of the Combustion Institute*, 36, 789-979.
- A. Wick, A. Attili, F. Bisetti, and H. Pitsch (2020): DNS-driven analysis of the Flamelet/Progress Variable model assumptions regarding soot inception, growth, and oxidation in turbulent flames. *Combustion and Flame*, 214, 437-449.
- A. Wick, F. Priesack, and H. Pitsch (2017): Large-Eddy Simulation and detailed modeling of soot evolution in a model aero engine combustor. *Proceedings of the ASME Turbo Expo 2017*, GT2017-63293.

#### Abstract

To meet the increasing global demand of usable energy and mobility, the combustion of fossil as well as renewable fuels in multifarious applications such as power plants, vehicles, airplanes, industrial furnaces, and household heating systems, is of utmost importance. Pivotal targets for the development of next-generation, high-fidelity combustion devices are the enhancement of the energy efficiency, applicability to alternative fuels and combustion strategies, and the reduction of pollutant emissions, in particular soot emissions due to their adverse impact on the environment as well as human health.

Computational Fluid Dynamics simulations have been established as an integral part of the development process of modern combustion applications. With increasing computing capacities and focus on pollutant emissions, the interest in Large-Eddy Simulations (LES) is growing. In particular, the accuracy of simulations of soot formation in turbulent flames largely benefits from the resolution of large-scale turbulent fluctuations in LES. However, a further exploitation of the predictive potential of LES requires the improvement of a variety of submodels that an integral soot model is composed of as well as appropriate coupling strategies for these model components. Furthermore, methodologies are needed for the systematic analysis of integrated models to identify critical modeling assumptions regarding the overall performance.

The present thesis aims at contributing to both the systematic analysis of integrated LES models for soot evolution and the development of submodels of such integrated modeling suites. The first part of the thesis focuses on the assessment and development of moment methods for the solution of population balance equations governing the soot particle dynamics. A combined a-priori and a-posteriori analysis of different interpolation-based moment methods led to recommendations for an optimal choice of interpolation functions and orders to achieve highly accurate soot predictions for a variety of laminar and turbulent flame conditions. In addition, an advanced quadrature-based moment method, which also provides a reconstruction of an approximation of the soot Number Density Function (NDF), was coupled with a method to describe the disappearance of particles during soot oxidation in a mathematically rigorous manner. Furthermore, a multivariate physico-chemical soot model accounting for the diversity of the chemical composition of soot

particles was formulated and validated for the evolution of the NDF in a laminar flame.

Next, the propagation of errors related to flamelet assumptions into soot quantities was investigated taking advantage of large-scale Direct Numerical Simulation (DNS) data of a sooting turbulent jet flame. Various terms coupling flamelet-based combustion models with soot models were first analyzed a-priori. Then, a partial a-posteriori analysis was performed, where the soot evolution along Lagrangian trajectories was computed using the flow field and selected thermodynamic properties extracted from the DNS. The resulting error decomposition and quantification identified the modeling of polycyclic aromatic hydrocarbon-based soot growth processes to be associated with uncertainties of leading order. Eventually, LES of a model aircraft combustor were performed employing a flamelet combustion model and a state-of-the-art soot model based on a bivariate description of the soot particles.

#### Zusammenfassung

Um den weltweit steigenden Bedarf an nutzbarer Energie und Mobilität zu decken, ist die Verbrennung von fossilen sowie erneuerbaren Brennstoffen in vielfältigen Anwendungen wie Kraftwerken, Fahrzeugen, Flugzeugen, Industrieöfen und Haushaltsheizungen von großer Bedeutung. Hauptziele für die Entwicklung von Verbrennungsanlagen der nächsten Generation sind die Verbesserung der Energieeffizienz, die Kompatibilität mit alternativen Kraftstoffen und Verbrennungsstrategien sowie die Reduzierung von Schadstoffemissionen, insbesondere von Rußemissionen, da diese mit starken negativen Einflüssen auf die Umwelt und die menschliche Gesundheit einhergehen.

Strömungssimulationen haben sich als integraler Bestandteil des Entwicklungsprozesses moderner Verbrennungsanwendungen etabliert. Mit zunehmender Rechenleistung und Fokussierung auf Schadstoffemissionen wächst das Interesse an Large-Eddy Simulationen (LES). Insbesondere die Genauigkeit der Vorhersage von Rußbildung in turbulenten Flammen profitiert erheblich von der Auflösung großskaliger turbulenter Fluktuationen in LES. Eine weitere Verbesserung der Prädiktivität von LES in Bezug auf Rußbildung erfordert die Verbesserung einer Vielzahl von Modellkomponenten, aus denen ein integrales Rußmodell besteht, sowie geeignete Kopplungsstrategien dieser Modellkomponenten. Darüber hinaus werden Methoden für die systematische Analyse integrierter Modelle benötigt, um kritische Modellierungsannahmen bezüglich der Genauigkeit des Gesamtmodells zu identifizieren.

Gegenstand dieser Arbeit ist sowohl die systematische Analyse integrierter Rußmodelle für LES als auch die Entwicklung von Modellkomponenten solcher integrierter Modelle. Fokus des ersten Teils der Arbeit bildet die Analyse und Entwicklung von Momentenmethoden zur Lösung von die Rußpartikeldynamik beschreibenden Populationsbilanzgleichungen. Durch eine kombinierte a-priori und a-posteriori Analyse verschiedener interpolationsbasierter Momentenmethoden konnten Empfehlungen für eine optimale Wahl von Interpolationsfunktionen und -ordnungen abgeleitet werden, welche hochgenaue Vorhersagen der Rußbildung in laminaren und turbulenten Flammen ermöglichen. Darüber hinaus wurde eine neuartige quadraturbasierte Momentenmethode, welche auch eine Rekonstruktion einer Approximation der Rußpartikelverteilungsfunktion ermöglicht, mit einem numerischen Verfahren zur Beschreibung des Verschwindens von Partikeln während der Rußoxidation gekoppelt. Weiter-

hin wurde ein multivariates physikalisch-chemisches Rußmodell formuliert, welches die starke Diversität der chemischen Zusammensetzung von Rußpartikeln berücksichtigt. Dieses Modell wurde für die zeitliche Entwicklung der Partikelverteilungsfunktion in einer laminaren Flamme validiert.

Im weiteren Verlauf der Arbeit wurde der Einfluss von auf Flamelet-Annahmen beruhenden Modellfehlern auf die Berechnung von Rußgrößen mittels systematischer Analyse von Direkten Numerischen Simulationen (DNS) einer rußenden turbulenten Freistrahlflamme untersucht. Zunächst wurden verschiedene Größen, welche Flamelet-basierte Verbrennungsmodelle mit Rußmodellen koppeln, a-priori analysiert. Anschließend wurde eine partielle a-posteriori-Analyse durchgeführt. Hierbei wurde die Rußbildung entlang Lagrangescher Trajektorien nachgerechnet, wobei das Strömungsfeld sowie ausgewählte thermodynamische Größen aus der DNS extrahiert wurden. Mittels der aus dieser Analyse resultierenden Fehlerzerlegung und -quantifizierung konnte die Modellierung von auf polyzyklischen aromatischen Kohlenwasserstoffen basierenden Rußwachstumsprozessen als Fehlerquelle führender Ordnung identifiziert werden. Weiterhin wurden LES einer Modellbrennkammer eines Flugtriebwerks unter Verwendung eines Flamelet-Verbrennungsmodells sowie eines auf einer bivariaten Beschreibung der Rußpartikel basierenden Rußmodells durchgeführt.

## List of Figures

| 2.1 | Overview of the model components of an integrated model for LES of soot evolution in turbulent flames                                  | 6   |
|-----|--|-----|
| 2.2 | Visualization of the turbulent jet flame by Attili et al. [8] at $t=15\mathrm{ms}$ : isosurfaces of the temperature close to the flame |     |
|     | front (blue), the naphthalene mass fraction (yellow), and the soot volume fraction (dark gray)   | 19  |
| 3.1 | Computed and measured temperature in the laminar ethylene  |     |
|     | flame as function of the height above burner (HAB) for a<br>burner-to-stagnation plate separation of 8 mm. Experimental                |     |
|     | data from [33]   | 32  |
| 3.2 | Computed and measured soot NDF in the laminar ethylene flame at a burner-to-stagnation plate separation of 8 mm. Com-                  |     |
|     | parison of free molecular (f.m.) and transition (tr.) regimes  | 0.0 |
| 3.3 | for coagulation. Experimental data from [33] Mixture fraction and temperature along Lagrangian trajectories                            | 32  |
| 5.5 | in the DNS by Attili et al. [8]. The trajectories marked in red  |     |
|     | and blue are discussed in detail in Chapter 3.4  | 33  |
| 3.4 | Soot volume fraction, $f_v$ , and number density, $N$ , in the lami-   |     |
|     | nar ethylene flame for the MOMIC-pos interpolation scheme and varying interpolation order $p$ . Solid and dashed lines                 |     |
|     | correspond to first and second order interpolation of grid func-   |     |
|     | tions, respectively. For the soot volume fraction, deviations are negligible, and the second order results are therefore omitted.      | 35  |
| 3.5 | A-priori evaluation of the grid function $f_{1/2}^{(0,0)}$ , which is required   | 33  |
| ა.ა | for the calculation of the coagulation source term for $M_0$   | 37  |
| 3.6 | A-priori evaluation of the fractional moments that are required  | ٠.  |
|     | for the calculation of the coagulation source term for the number  |     |
|     | density.   | 38  |
| 3.7 | Soot volume fraction, $f_v$ , and number density, $N$ , in the laminar   |     |
|     | ethylene flame for varying interpolation order using a second interpolation polynomial based on the moment $M$ for the                 |     |
|     | interpolation polynomial based on the moment $M_{-\infty}$ for the evaluation of negative order moments                                | 40  |
|     | Characteristics of megatitic order monitorion.   | 10  |

| 3.8  | A-priori evaluation of the negative order fractional moments               |     |
|------|--|-----|
|      | that are required for the calculation of the coagulation source            |     |
|      | term for the number density. Comparison of MOMIC-pos with                  |     |
|      | order $p$ and MOMIC-infty  | 40  |
| 3.9  | Computed PAH-based and HACA-based soot mass growth                         |     |
|      | rates in the laminar ethylene flame and along two Lagrangian               |     |
|      | trajectories in the turbulent flame DNS                                    | 42  |
| 3.10 | Soot volume fraction, $f_v$ , and number density, $N$ , along a La-        |     |
|      | grangian trajectory dominated by PAH-based growth for vary-                |     |
|      | ing interpolation order using the MOMIC-pos and MOMIC-infty                |     |
|      | algorithms   | 43  |
| 3.11 | Soot volume fraction, $f_v$ , and number density, $N$ , along a            |     |
|      | Lagrangian trajectory with both PAH-based and HACA-based                   |     |
|      | growth for varying interpolation order using the MOMIC-pos                 |     |
|      | and MOMIC-infty algorithms   | 44  |
| 3.12 | Moments of the soot number density function as a function of               |     |
|      | the moment order   | 46  |
| 3.13 | Soot volume fraction, $f_v$ , and number density, $N$ , along a La-        |     |
|      | grangian trajectory with both PAH-based and HACA-based                     |     |
|      | growth. Comparison of MOMIC-pos, MOMIC-infty, and MOMIC-                   |     |
|      | infty with extended use of the interpolation function con-                 |     |
|      | structed with $M_{-\infty}$ , $M_0$ , and $M_1$ to evaluate fractional mo- |     |
|      | ments up to moment order $x = 1, \ldots, \ldots$                           | 49  |
| 3.14 | A-priori analysis of the interpolation polynomials based on                |     |
|      | non-negative order moments and using the moment of order                   | 4.0 |
|      | minus infinity at $t = 5 \mathrm{ms.}$                                     | 49  |
| 4.1  | Schematic of the EQMOM algorithm   | 57  |
| 4.2  | Schematic illustration of the oxidation treatment                          | 59  |
| 4.3  | Reconstruction of two experimentally measured, normalized                  | 00  |
|      | NDFs from rich, premixed ethylene flames (left: [33]; right: [3])          |     |
|      | using, from top to bottom, gamma EQMOM with two and                        |     |
|      | three kernel functions and lognormal EQMOM with two and                    |     |
|      | three kernel functions   | 62  |

| 4.4        | Reconstruction of the NDF at three times during pure oxidation of the soot population represented by the bimodal NDF shown   |    |
|------------|--|----|
|            | in Fig. 4.3. Gamma and lognormal EQMOM with two and three kernel functions are compared to the analytical solution   |    |
|            | at these times (time increasing from top to bottom). Line colors are the same as in Fig. 4.3   | 63 |
| 4.5        | Time evolution of the first three moments, representing number density, soot volume fraction, and variance of the NDF, normalized with the initial particle number, during pure oxidation  |    |
|            | of the soot population represented by the unimodal NDF shown in Fig. 4.3   | 64 |
| 4.6        | Time evolution of the first three moments, representing number density, soot volume fraction, and variance of the NDF, normalized with the initial particle number, during pure oxidation of the soot population represented by the bimodal NDF shown  |    |
|            | in Fig. 4.3.   | 65 |
| 4.7        | Time evolution of the weights, $w_{\alpha}$ , and abscissas, $V_{\alpha}$ , of the kernel functions during pure oxidation of the soot population   |    |
| 4.8        | represented by the bimodal NDF shown in Fig. 4.3 Time evolution of the shape parameter, $\sigma$ , of the kernel functions during pure oxidation of the soot population represented  | 67 |
|            | by the bimodal NDF shown in Fig. 4.3   | 67 |
| 4.9        | Time evolution of $M_1/M_0$ representing a mean particle diameter for both NDFs using gamma EQMOM and lognormal  |    |
| 4.10       | EQMOM with a varying number of kernel functions Soot volume fraction in the primary and secondary burner and number density in the secondary burner. Comparison of EQMOM with MC, and with experimental data by Neoh [133] in the secondary burner, where two postprocessing techniques  | 68 |
|            | were used to determine the number density  | 69 |
| 5.1<br>5.2 | Coagulation regime indicator, $\alpha$ , based on the H/C ratio Computed and measured soot NDFs in the ethylene BSS flame at four different burner-to-stagnation plate separation distances. Comparison of the pure coalescence and a grant for the grant for the pure coalescence and a grant for the grant for th | 74 |
|            | tances. Comparison of the pure coalescence and aggregation models. Experimental data from [33]. The particle diameter,   |    |
|            | $D_p$ , refers to the mobility diameter and the collision diameter for the experimental and computational data, respectively   | 76 |

| 5.3 | Computed and measured soot NDFs in the ethylene BSS flame at four different burner-to-stagnation plate separation distances. Comparison of the modles using regime indicators based on the ratio of the particles' volumes, diameters, and $H/C$ ratios. Experimental data from [33]. The particle diameter, $D_p$ , refers to the mobility diameter and the collision diameter for the experimental and computational data, respectively | 77  |
|-----|---|-----|
| 6.1 | Scatter and conditional mean of gas-phase quantities required as input for the calculation of the soot source terms evaluated from the DNS with the mixture-averaged transport model at   | o.c |
| 6.2 | t = 15  ms.   | 83  |
| 6.3 | mixture-averaged transport model at $t=15\mathrm{ms.}$ Dimer formation rate conditioned on mixture fraction, $Z$ , and progress variable, $C$ , obtained from the DNS with the mixture-averaged transport model at $t=15\mathrm{ms}$ as well as unscaled and  | 85  |
| 6.4 | scaled table solution   | 88  |
| 6.5 | using unity Lewis numbers   | 89  |
| 6.6 | $t=15\mathrm{ms}$ as well as unscaled and scaled table solution PAH source terms conditioned on mixture fraction, $Z$ , obtained from the DNS with unity Lewis numbers at $t=15\mathrm{ms}$ as well as unscaled and scaled table solution   | 90  |
| 6.7 | Reaction rate coefficient of the HACA source term, $k_{\rm HACA}$ , conditioned on mixture fraction, $Z$ , and progress variable, $C$ , obtained from the DNS with the mixture-averaged transport model at $t=15\rm ms$ and corresponding table solution. The magenta line indicates an isocontour of the soot surface fraction obtained from the DNS at a value of 5 % of its peak conditional   |     |
|     | mean  | 92  |

| 6.8  | Soot mass growth rate due to HACA-based growth, $\left(\frac{df_M}{dt}\right)^{HACA}$ , |     |
|------|---|-----|
| 0.0  | Soot mass growth rate due to HACA-based growth, $\left(\frac{d}{dt}\right)$ ,           |     |
|      | at $t=15\mathrm{ms}$ conditioned on mixture fraction, $Z$ , and progress                |     |
|      | variable, $C$ , computed with the HACA rate coefficient, $k_{\rm HACA}$ ,               |     |
|      | obtained directly from the DNS with the mixture-averaged                                | 0.0 |
|      | transport model and from the flamelet table   | 92  |
| 6.9  | Domain-averaged soot mass growth rate due to surface growth.                            |     |
|      | Lines are drawn to guide the eye. "MA" and "Le=1" refer                                 |     |
|      | to the DNS employing the mixture-averaged transport model                               |     |
|      | and unity Lewis numbers, respectively. Flamelets are always                             |     |
| 0.10 | computed using unity Lewis numbers  | 93  |
| 6.10 | Reaction rate coefficient of the oxidation source term, $k_{Ox}$ ,                      |     |
|      | conditioned on mixture fraction, $Z$ , and progress variable, $C$ ,                     |     |
|      | obtained from the DNS with the mixture-averaged transport                               | 0.4 |
|      | model at $t = 15 \text{ms}$ and table solution  | 94  |
| 6.11 | model at $t = 15 \text{ ms}$ and table solution   |     |
|      | conditioned on mixture fraction, $Z$ , and progress variable, $C$ ,                     |     |
|      | computed with the oxidation rate coefficient, $k_{\text{Ox}}$ , obtained                |     |
|      | directly from the DNS with the mixture-averaged transport                               |     |
|      | model and from the flamelet table   | 94  |
| 6.12 | Domain-averaged soot mass growth rate due to oxidation. Lines                           |     |
|      | are drawn to guide the eye. "MA" and "Le=1" refer to the DNS                            |     |
|      | employing the mixture-averaged transport model and unity                                |     |
|      | Lewis numbers, respectively. Flamelets are always computed                              |     |
|      | using unity Lewis numbers   | 95  |
| 6.13 | OH mass fraction conditioned on mixture fraction, $Z$ , and                             |     |
|      | scatter of the OH mass fraction and the temperature obtained                            |     |
|      | directly from the DNS with the mixture-averaged transport                               |     |
|      | model and from the flamelet table using flamelets with unity                            |     |
|      | Lewis numbers. The black lines indicate equally large values.                           |     |
|      | The size and color of the circles correspond to the soot mass                           |     |
|      | rate of change due to oxidation and the difference between                              |     |
|      | the model-predicted and the DNS rates, respectively. As the                             |     |
|      | oxidation rate is negative, negative values on the color bar                            | 0.0 |
|      | correspond to an overprediction by the model  | 96  |

| 6.14 | Soot mass growth rate due to oxidation, $\left(\frac{df_M}{dt}\right)^{Ox}$ , at $t = 15 \text{ ms}$   |     |
|------|--|-----|
| 6.15 | conditioned on mixture fraction, $Z$ , and progress variable, $C$ , computed with the oxidation rate coefficient, $k_{\text{Ox}}$ , obtained directly from the DNS with unity Lewis numbers and from the flamelet table  | 97  |
| 6.16 | Soot mass growth rate due to HACA-based growth, $\left(\frac{\mathrm{d}f_M}{\mathrm{d}t}\right)^{\mathrm{HACA}}$ , at $t=15\mathrm{ms}$ conditioned on mixture fraction. $Z$ , and progress  |     |
|      | at $t=15\mathrm{ms}$ conditioned on mixture fraction, $Z$ , and progress variable, $C$ , computed with the HACA rate coefficient, $k_{\mathrm{HACA}}$ , obtained directly from the DNS with the mixture-averaged transport model and from the flamelet table and domain- |     |
| 6.17 | averaged surface growth rates for both DNS cases at three times of the simulation. The progress variable is defined as the temperature here  | 99  |
|      | in the chemical soot model   | 101 |
| 7.1  | Numerical grid and dimensions of the combustion chamber. Left: Plane through the center of the combustor. Right: Cross section of the quadratic combustion chamber at $x = 80 \text{ mm}$  | 10* |
| 7.2  | and cut through the swirler at $x = -11 \text{mm}$   | 107 |
|      | in the cold flow. (Experimental data provided by the DLR.).  | 111 |

| 7.3  | Radial profiles of axial, radial, and tangential velocity compo-   |      |
|------|--|------|
|      | nents (top to bottom) close to the swirler (left; $x = 12 \mathrm{mm}$ ) and   |      |
|      | slightly upstream of the secondary air inlets (right; $x = 65 \text{ mm}$ )  |      |
|      | in the cold flow. (Experimental data provided by the DLR.).  | 112  |
| 7.4  | Axial velocity component along the centerline of the combustor   |      |
|      | in the reactive flow. (Experimental data provided by the DLR.)   | 113  |
| 7.5  | Radial profiles of axial, radial, and tangential velocity compo-   |      |
|      | nents (top to bottom) close to the swirler (left; $x = 12 \mathrm{mm}$ ) and   |      |
|      | slightly upstream of the secondary air inlets (right; $x = 65 \text{ mm}$ )  |      |
|      | in the reactive flow. (Experimental data provided by the DLR.)   | 114  |
| 7.6  | Tangential velocity component in a cutplane through the center   |      |
|      | of the combustor. (Experimental data provided by the DLR.)   | 115  |
| 7.7  | Instantaneous (left) and averaged (right) temperature in a   |      |
|      | midplane of the combustor  | 116  |
| 7.8  | Temperature along the centerline of the combustor. The black   |      |
|      | bars and yellow region indicate the range of the measured and  |      |
|      | computed temperature PDFs, respectively, which contain $90\%$  |      |
|      | of the data. (Experimental data provided by the DLR.) $$   | 117  |
| 7.9  | Radial temperature profiles at four axial positions. Lines and   |      |
|      | colors as in Fig. 7.8. (Experimental data provided by the DLR.)  | )117 |
| 7.10 | Temperature histograms at four characteristic locations in the   |      |
|      | combustor. (Experimental data provided by the DLR.)  | 118  |
| 7.11 | Deviation of the instantaneous acetylene mass fraction obtained  |      |
|      | by the solution of its transport equation from the tabulated   |      |
|      | value. The black isoline indicates a soot volume fraction of   |      |
|      | $f_v = 1 \text{ ppm.} \dots \dots$ | 120  |
| 7.12 | Instantaneous soot volume fraction contour in a midplane of  |      |
|      | the combustor at two statistically independent times. The  |      |
|      | magenta line indicates 1.5 times the stoichiometric mixture  |      |
|      | fraction   | 120  |
| 7.13 | Measured and model-predicted averaged soot volume fraction.  |      |
|      | Image of experimental results taken from [65]. Experimental  |      |
|      | scale: 0-70 ppb, simulated scale: 0-7.7 ppm  | 121  |

### Contents

| 1 | Intr | oducti  | on  | 1  |
|---|------|---------|---|----|
|   | 1.1  | Outlin  | e and Achievements of the Thesis  | 3  |
| 2 |      | -       | ional Modeling of Soot Evolution  | 5  |
|   | 2.1  | Model   | ing Suite for LES of Soot Evolution   | 5  |
|   |      | 2.1.1   | Chemical Kinetics of Soot Presursor Formation   | 7  |
|   |      | 2.1.2   | Multivariate Physico-Chemical Soot Models   | 8  |
|   |      | 2.1.3   | Statistical Methods for the Solution of Population Bal-   |    |
|   |      |         | ance Equations  | 10 |
|   |      | 2.1.4   | Coupling of Soot Models with Turbulent Combustion   |    |
|   |      |         | Models  | 13 |
|   |      | 2.1.5   | Soot Subfilter Models for Large-Eddy Simulations  | 16 |
|   | 2.2  | System  | natic Analysis, Development, and Validation of Soot Models  | 16 |
|   |      | 2.2.1   | Varying System and Simulation Complexity  | 17 |
|   |      | 2.2.2   | DNS-Driven Model Assessment, Development, and Val-  |    |
|   |      |         | $idation \dots \dots$ | 18 |
|   |      | 2.2.3   | Monte Carlo Simulations as a Reference Solution for   |    |
|   |      |         | Population Balance Equations  | 20 |
| 3 | Sys  | temati  | c Assessment of MOMIC and Guidelines for its Ap-  |    |
|   | plic | ation t | to Soot Particle Dynamics in Laminar and Turbu-   |    |
|   | -    | Flame   | · · · · · · · · · · · · · · · · · · ·   | 21 |
|   | 3.1  | Interpe | olation and Extrapolation in MOMIC  | 22 |
|   |      | 3.1.1   | Formulation of the Soot Source Terms  | 23 |
|   |      | 3.1.2   | Closure via Interpolation and Extrapolation   | 28 |
|   | 3.2  | Valida  | tion Cases  | 30 |
|   |      | 3.2.1   | Laminar Premixed Ethylene/Air Flame   | 30 |
|   |      | 3.2.2   | Soot Particle Trajectories in a Turbulent Jet Flame .   | 33 |
|   | 3.3  | Model   | Analysis for a Laminar Premixed Flame   | 34 |
|   |      | 3.3.1   | A-Posteriori Analysis - Variation of the Interpolation  |    |
|   |      |         | Order   | 34 |
|   |      | 3.3.2   | A-Priori Analysis of Fractional Moments and Grid Func-  |    |
|   |      |         | tions   | 35 |

|   |   | 3.3.3 Effect of the MOMIC-infty Interpolation Scheme using $M_{-\infty}$ | 39         |  |  |  |  |
|---|---|--|------------|--|--|--|--|
|   | 3.4   | Model Analysis for Lagrangian Trajectories in the DNS of a               | 00         |  |  |  |  |
|   | 0.1   | Turbulent Flame  | 41         |  |  |  |  |
|   |   | 3.4.1 A-Posteriori Analysis  | 42         |  |  |  |  |
|   |   | 3.4.2 A-Priori Analysis of the HACA Source Term                          | 44         |  |  |  |  |
|   | 3.5   | Concepts for the Evaluation of Fractional Moments of Orders              |            |  |  |  |  |
|   |   | between Zero and One   | 47         |  |  |  |  |
|   | 3.6   | Implications for Users of MOMIC  | 49         |  |  |  |  |
| 4 |   | deling Soot Oxidation with the Extended Quadrature Meth                  |            |  |  |  |  |
|   |   |  | 53         |  |  |  |  |
|   | 4.1   | Why Soot Oxidation is a Challenge for Moment Methods                     | 54         |  |  |  |  |
|   | 4.2   | EQMOM for Soot Formation and Oxidation                                   | 56         |  |  |  |  |
|   |   | 4.2.1 Moment Inversion Algorithm   | 56         |  |  |  |  |
|   |   | 4.2.2 Gamma EQMOM  | 58         |  |  |  |  |
|   |   | 4.2.3 Lognormal EQMOM  | 58         |  |  |  |  |
|   |   | 4.2.4 Treatment of Oxidation   | 59         |  |  |  |  |
|   | 4.9   |  | 60         |  |  |  |  |
|   | 4.3   | Validation   | 60<br>60   |  |  |  |  |
|   |   | 4.3.2 Coupled Soot Formation and Oxidation in a Two-Stage                | 00         |  |  |  |  |
|   |   | Burner   | 68         |  |  |  |  |
| 5 | A Detailed Multivariate Soot Model based on Particle Vol-   |  |            |  |  |  |  |
| - |   |  | 71         |  |  |  |  |
|   | 5.1   | Multivariate Model Formulation   | 72         |  |  |  |  |
|   |   | 5.1.1 Coagulation Model  | 72         |  |  |  |  |
|   | 5.2   | Evolution of the Soot NDF in a Laminar Premixed Flame                    | 75         |  |  |  |  |
| 6 | DNS-Driven Analysis of the Flamelet/Progress Variable Model |  |            |  |  |  |  |
|   |   | umptions on Soot Inception, Growth, and Oxidation in                     |            |  |  |  |  |
|   |   |  | <b>7</b> 9 |  |  |  |  |
|   | 6.1   | Coupling of the Combustion and Soot Models                               | 80         |  |  |  |  |
|   |   | 6.1.1 Combustion Model   | 80         |  |  |  |  |
|   | 0.0   | 6.1.2 Soot Model and its Coupling with the Combustion Model              | 80         |  |  |  |  |
|   | 6.2   | Analysis of Soot-Related Gas-Phase Quantities in a DNS of a              | 00         |  |  |  |  |
|   | 0.0   | Turbulent Sooting Flame  | 82         |  |  |  |  |
|   | 6.3   | Effects of Flamelet/Progress Variable Model Assumptions on               | 86         |  |  |  |  |
|   |   | Soot Source Terms  | Xh         |  |  |  |  |

|              |   | 6.3.1   | PAH-Based Soot Growth                                | 87  |  |  |  |
|--------------|---|---------|--|-----|--|--|--|
|              |   | 6.3.2   | HACA-Based Soot Growth                               | 91  |  |  |  |
|              |   | 6.3.3   | Soot Oxidation                                       | 93  |  |  |  |
|              |   | 6.3.4   | Effect of the Progress Variable Definition           |     |  |  |  |
|              | 6.4   |         | al A-Posteriori Analysis of Soot Evolution along La- | ٠.  |  |  |  |
|              | 0.1   |         | an Trajectories                                      | 100 |  |  |  |
|              |   | 8141181 | an majocoones  | 100 |  |  |  |
| 7            | Large-Eddy Simulation of Soot Evolution in a Model Aero |         |  |     |  |  |  |
|              |   | _       | ombustor   | 105 |  |  |  |
|              | 7.1   | -       | utational Setup                                      | 106 |  |  |  |
|              |   | 7.1.1   |  |     |  |  |  |
|              |   | 7.1.2   | Combustion Model                                     |     |  |  |  |
|              |   | 7.1.3   | Soot Model   |     |  |  |  |
|              |   | 7.1.4   | Operating Conditions                                 |     |  |  |  |
|              | 7.2   |         | Flow Results   | _   |  |  |  |
|              | 7.3   |         | ive Flow Results                                     |     |  |  |  |
|              | 1.5   | 7.3.1   |  |     |  |  |  |
|              |   |         | Velocity   |     |  |  |  |
|              |   | 7.3.2   | Temperature  |     |  |  |  |
|              |   | 7.3.3   | Soot   | 119 |  |  |  |
| 8            | Sun   | nmary   |  | 123 |  |  |  |
| Bibliography |   |         |  |     |  |  |  |