Mind the gap: turbulent combustion model validation and future needs

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Abstract

This overview collects a range of well characterized experiments used in the step-wise validation of turbulent combustion models, from gas phase non-premixed jet flames to spray flames, and from simple symmetric jets to real device geometries, focusing primarily on statistically steady state experiments. We discuss how the experiments and models are constructed, approaches to modelling, and the tradeoffs between the level of detail and computational demands. The review highlights a number of experiments used for benchmarking models, selecting a few examples where models have clearly succeeded, as well as some areas where there are clear needs in the experimental database. In particular, the areas of turbulent spray combustion and soot prediction, as well as combustion under high pressures appear as the least developed and present the clearest gaps for both models and experiments. Based on the successful application of advanced methods of uncertainty quantification to a number of problems in reacting flows, we suggest that these methods might be used to advantage in the design of experiments. This would enable an upfront examination of the extent to which comparisons between measurable scalars and velocities allow clear distinction between model features.

Keywords: turbulent combustion, diagnostics, model validation

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Preprint submitted to Proceedings of the Combustion Institute

1 1. Introduction

The general objective in the design of devices using 2 turbulent combustion is to produce clean hot gases in a 3 stable manner over a wide range of conditions, either for 4 the direct, efficient conversion into mechanical power in 5 engines and turbines, or for the indirect use of enthalpy 6 for heat exchange with some other fluid, for purposes of heating or power generation. This apparently simple 8 mission stumbles into inherent tradeoffs between stability and the production of undesirable pollutant byprod-10 ucts. Enormous progress has been made in numerical 11 modelling of reacting and non-reacting flows, yet one 12 cannot always make accurate predictions about the pol-13 lutant emissions, instability or reaction limits of new de-14 vices without building them. This state of affairs results 15 from the incomplete knowledge of some of the funda-16 mental kinetics (particularly in the case of large hydro-17 carbons and soot), as well as from inherent difficulties 18 in predicting the behavior of highly non-linear turbulent 19 flow systems. 20

In this paper, we take a very broad view of the state 21 of turbulent model validation over the past decade, and 22 set the stage for a discussion of what may be opportu-23 nities for developing more efficient validation strategies 24 for turbulent combustion models. There is only so much 25 room in a topical review (and panel discussion) to cover 26 such a broad topic. The present paper provides an en-27 try point by collecting information on validation targets 28 and methods, and identifies some of the directions for 29 research and methods. For conciseness, we only con-30 sider stabilized flames as a target, excluding the growing 31 database of unsteady experiments in combustion ves-32 sels, rapid compression machines, and engines. 33

The paper is structured as follows: a brief review of 34 the issues in turbulent combustion is presented, describ-35 ing the key difficulties in modelling and measurements, 36 followed by a discussion of the process of validation, 37 existing databases, and the state of the art in model com-38 parisons. The review leads to a reflection on the gaps in 39 the database, and finally, to questions about how cur-40 rent models can be used to improve the development of 41 validation experiments. 42

2. Turbulent Combustion Models and Closures

44 2.1. Multiscales and Multiscalars

There are three main challenges associated with modelling turbulent reacting flows, as discussed in many distinguished reviews and books [1–4]: (a) the vast range of temporal and spatial scales, from device spatial scales of the order of meters down to micrometer scales where mixing and viscous dissipation take place; (b) the range of species reacting at different time scales; (c) the highly non-linear behavior of chemical reactions with the highly variable local temperature. For the modeller, this means that not all scales and not all species may be accurately reproduced, and a compromise between fidelity and computational resources must be made. For the experimentalist, these demands challenge the dynamic range and resolution capability of any technique. The mesh resolution in practical CFD calculations cannot span the range of scales, and some spatial averaging or filtering must be done: subgrid models must therefore account for the non-linear contributions of the unresolved fluctuations.

The ratio of the largest length scale ℓ_T to the molecular diffusion length scale ℓ_K can be approximated based on the hypothesis of scale-invariant dissipation rate [5, 6], $\left(\frac{\ell_T}{\ell_K}\right) = \operatorname{Re}^{\frac{3}{4}} = \left(\frac{u_T\ell_T}{v}\right)^{\frac{3}{4}}$, where u_T is the integral turbulent velocity, v the fluid viscosity, and Re the corresponding turbulent Reynolds number. Correspondingly, integral time scales vary according to $\left(\frac{\tau_T}{\tau_{\kappa}}\right) = \mathrm{Re}^{\frac{1}{2}}$. At the high pressures and flows rates associated with high specific power in gas turbines and engines, Re can be of order 10^3 to 10^5 , so that two to three orders of magnitude in time or space need to be resolved. Whilst this lies in the realm of petascale direct numerical simulations, it is clearly beyond the reach of repeated design calculations. The turbulent time scales are compared to the corresponding chemical (and chemical-diffusive) scales τ_c , generating the Damköhler number, $Da = \tau_T / \tau_c$ and Karlovitz number, Ka = τ_c/τ_K [7, 8], and the two numbers are related by Da Ka = τ_T / τ_K = Re^{1/2}.

Flame-like structures are associated with short chemical time scales, with Da in the hundreds, and these tend to exist as wrinkled or intermittently extinguished flames up to Ka of the order of thousands [9, 10]. Under autoignition processes taking place at the initiation of combustion in compression-ignition engines, time scales can be large, with low Da, and reactions take place in a more spatially distributed mode. High power density demands higher Re and Ka numbers, and the job of the designer becomes to understand the limits of turbulent mixing and reactions for a particular objective.

The focus of a large number of experimental and modelling studies has been to investigate how well models of turbulent diffusion and premixed flames are able to represent the observed species or flame propagation characteristics, and to some extent the limits of stable combustion under these conditions. These studies, and the philosophy governing the experimental efforts de-

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signed to validate these models (or not), are described 124 101

in some detail in the next section. But first, let us take a 125 102

look at the equations that govern scalar reactions, which 126 103

are the source of the difficulties. 104

2.2. Governing equations 105

Turbulent combustion models use differential conservation equations, typically in an Eulerian framework, 130 to make predictions about the evolution of the rele-121 vant scalars and velocity fields. At the simplest level, 122 what makes combustion special in comparison to non-133 reacting turbulent flows is the evolution of the scalar 134 species and release of thermal energy, which leads to 135 density changes, and thereby a coupling with momen-136 tum. In practice, the key scalars are species which rep-137 resent progress of reaction or heat release (often a sum of CO, CO₂, and H₂O), temperature, and a total mixture fraction Z, usually a normalised linear combination of species representing the total original atomic abundance in the reacting streams. If we consider only gas phase species, in the low Mach number limit for many situations, the conservation equation for a scalar ψ reads, in 144 the approximation of Fickian diffusion: 145

$$\frac{\mathrm{D}\rho\psi}{\mathrm{D}t} = \frac{\partial\rho\psi}{\partial t} + \nabla\cdot(\rho\mathbf{u}\psi) = \nabla\cdot(\rho D_{\psi}\nabla\psi) + \dot{\omega}_{\psi} \quad (1)$$

where radiative heat losses are not considered in the case of the energy equation. Equation 1 can be filtered or time-averaged [2, 3, 11] to yield an equation of form:

$$\frac{\partial \bar{\rho} \tilde{\psi}}{\partial t} + \nabla \cdot (\bar{\rho} \tilde{\mathbf{u}} \tilde{\psi}) = \nabla \cdot \mathbf{T}_{\psi}^{\mathbf{u}} - \nabla \cdot \mathbf{T}_{\psi}^{\mathbf{D}} + \overline{\dot{\omega}}_{\psi} \qquad (2)$$

where the flux terms for convection with velocity **u** 155 106 and density ρ , $\mathbf{T}_{\psi}^{\mathbf{u}} = \bar{\rho}(\tilde{\mathbf{u}}\tilde{\psi} - \overline{\mathbf{u}\psi})$, molecular diffusion, 156 107 $\mathbf{T}_{\psi}^{D} = \overline{\rho D_{\psi} \nabla \psi}$ and reaction $\overline{\dot{\omega}}_{\psi}$ require modelling. The 108 averaged or filtered terms do not in general correspond 109 to the values of the operators evaluated at averaged 159 110 or filtered conditions: departures from the averaged 111 161 temperature create significant deviations in the reaction 112 rates of most scalars, which depend exponentially on the 113 local temperature. Extensions and variations of these 114 models are required, for example, for systems involv-164 115 ing multiple phases, such as spray or particle reactions, 116 which require additional source terms for the scalars, 165 117 which couple with the liquid or solid phase. The fol-118 lowing discussion concerns closure models and experi-119 167 ments for scalars primarily in the gas phase. 120

2.3. Combustion closures 121

Closures are traditionally grouped into a choice of 171 122 how the subgrid or fluctuating model handles diffusional 172 123

and reaction terms in Eq. 2. There are excellent recent reviews on the details of the many models and their usage, as detailed below; a guide to best practices to the use of these models has also recently appeared [12]. The next subsections briefly describe flamelet and PDF/micromixing models.

2.3.1. Flamelet models

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Flamelet models assume that the time scales associated with chemical reaction are smaller those associated with turbulence. The conservation equations then allow the diffusion and reaction terms to be combined into a single entity, the flamelet, which can be transported convectively by the turbulent flow. Closure of the reaction term typically invokes a presumed PDF model, tied to conservation equations for the variance of the progress variable and mixture fraction, which gives rise to a term involving the subgrid scalar dissipation rate $\overline{\chi_{\psi}} = D_{\psi} |\nabla \psi|^2$. The latter is finally related to the filtered or grid scale Δ , a local turbulent viscosity (or reciprocal time scale τ_{Δ}) and a scalar variance, often via an algebraic closure, or modelled with corrections for reactive scalars. Flamelet models offer great simplification, by tying most scalars to a single progress variable c, which is transported by turbulence, and a local representation of the conserved atomic scalar in the form of a mixture fraction, Z. Reviews of models for premixed and non-premixed flamelets and variations thereof explain in greater detail how the progress of reaction is connected to other scalars via pre-calculated and tabulated flamelets [4, 7, 13-15]. The key disadvantage of the method is of course associated with the assumption of the existence of a flamelet, which may not hold in situations such as autoignition, multiple streams or for scalars for which reacting time scales are larger than turbulent time scales. Even in these cases, however, extensions have allowed continuation where the model assumptions are broken, by using additional progress variables, in the case of slowly varying soot [16-18] or NO [19], or by using switching variables to capture the behavior of partially premixed flames [20, 21], or autoignition in lifted flames [22].

2.3.2. Micromixing models

Micromixing models, which encompass transported-PDF models, make no assumption regarding the ratio of time scales of reaction relative to turbulence time scales, are therefore applicable over any range of Damköhler or Karlovitz numbers. Simple micromixing models assume full or partial mixing within the subgrid scale, accompanied by reaction [1, 23]. Full transported

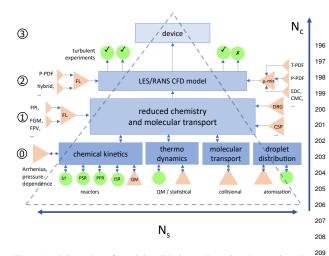


Figure 1: Hierarchy of model validation. Tan triangles: submodels: green circles: experiments. Numbered circles (left): validation tier levels. Arrows: direction of information. N_c : number of cells; 211 Ns: number of scalars. Acronyms indicated are for the many de-212 vices and methods used. Tier 0: PSR,PFR,JSR: perfectly stirred, plug flow and jet-stirred reactors; ST: shock tube; QM: quantum me-214 chanical calculations. Tier 1: Example chemical reduction methods, including, FL: flamelet, FGM: flamelet generated manifold, FPV: 215 flamelet-progress variable; FPI: flamelet-progress indicator; DRG: directed relation graphs: CSP: computational singular perturbation. Tier 2: large classes of flamelet (FL) or micromixing (µ-mix) models, 218 for example: PDF: probability distribution function, T-PDF, P-PDF: transported/presumed PDF; CMC: conditional moment closure, EDC: 219 eddy dissipation closure.

222 PDF approaches integrate equations for the evolution of 173 223 the multivariable, single point PDF, but require mod-174 224 els for closing the mixing term. The latter must re-175 solve molecular diffusion at the smallest scales, a dif-176 ficult task which can be achieved only by including ef- 225 177 ficient models of diffusion across the multidimensional 226 178 space [1, 4, 24, 25]). A number of simplified variants 179 of PDF and stochastic models significantly reduce the 180 dimensions across which diffusion occurs, for example 181 one-dimensional turbulence [26], conditional or multi-182 ple mapping closures [27, 28], which lower the dimen-183 231 sionality of systems by projecting the dependence of 184 species onto a small number of variables. 185 233

The need to control computational costs associated 186 with these complex multiscalar, multiscale calculations 187 generates a hierarchy of model validation, as discussed 188 in the following sections. 189

3. Hierarchical model validation 190

Turbulent combustion models include models for 241 191 192 chemistry and molecular transport, the associated heat 242 release, and turbulent transport, as outlined in Fig. 1. 243 193 The size of the computational problem or system N_s is 244 194 approximately proportional to the product of the num-245 195

ber of cells in the system N_c , and the number of scalars involved in the system, N_s , defining the total computational time. There is therefore an inherent tradeoff between the achievable level of detail in the model, represented by N_s and the geometric extent or detail (N_c) for a given total duration of the simulations. In order to accomplish a simulation given a total available computational resource, higher order models are simplified to a smaller number of scalars (or cells), requiring validation at each level moving up in the hierarchy. Validation starts from comparisons of chemical kinetic and thermodynamic models against fundamental experiments or quantum mechanical calculations (Tier-0), moving onto the generation of reduced chemical and transport models (Tier-1). At the lowest Tier, chemical and transport models can be very detailed, whereas the flow setup may be simple, such as a fully mixed device. A validation strategy between reduced order models against their more detailed counterparts with a larger number of scalars (e.g. using techniques for systematically reducing mechanisms) or a smaller number of cells (e.g. models for the PDFs of unresolved quantities, such as presumed or transported PDFs), ensures that the next step in the hierarchy can be taken with some assurance. The focus of the present paper is specifically on the validation of turbulent combustion models in (Tier-2), but it is useful to consider parallels and distinctions between the process of validation of chemical kinetics to the validation of turbulent combustion models.

3.1. Tier 0 - Chemical kinetics, transport and thermodynamics

Simulations and validation experiments often start by selecting the appropriate level of detail for the problem, from equilibrium to single-step reactions, to multistep reactions. There is a vast literature dedicated to the subject for a variety of fuels, and well established methods for composing and extracting chemical kinetic models from data emerging from shock tubes, jet stirred and plug flow reactors, as well as theoretical models [29, 30]. Periodic reviews of the available information are codified into comprehensively validated models for hydrocarbon oxidation for a variety of hydrocarbon fuels over a wide range of temperatures and pressures. Examples of well understood oxidation mechanisms are (a) the GRI mechanism for methane [31], (b) mechanisms for syngas oxidation [32], and (c) mechanisms for hydrocarbon autoignition [33-35]. However, reaction mechanisms and their rates are continually revised, with an optimal set of reactions and their constants produced in a feedback loop between experiments and models,

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informed by sensitivity analysis and uncertainty quan- 296 246 tification, to extract optimum parameters in the sense 297 247 of a feasible optimum set [30, 36]. Both the chemistry 298 248 and the thermodynamics for liquid and solid fuels are 299 249 less well studied than that of smaller hydrocarbons, al-250 300 though there are a number of well established surrogate 251 301 252 models for diesel and gasoline surrogates used both for 302 flames and autoignition. Mechanisms for soot forma-303 253 tion are significantly more complex, involving sectional 304 254 (size dependent) models, yet validation datasets for soot 305 255 are rarer than for hydrocarbons. Models for soot are al- 306 256 ways a low order model, representing the thousands of 307 257 species or classes thereof [37, 38]. Model reduction is 308 258 often necessary prior to incorporating into combustion 309 25 models, yet one must keep in mind how these models 310 260 were originally obtained, as well as simplified, lest they 261 be used beyond their validation range. The final tar-262 312 get of a turbulent combustion simulation may or may 313 263 not be sensitive to the uncertainties in the chemical ki- 314 264 netic mechanism or thermodynamic model, yet system- 315 265 atic uncertainty quantification is rarely incorporated into 266 316 routine validation exercises. 317 26

268 3.2. Tier 1 - Reduced models

The purpose of validation at *Tier 1* is to reduce the 269 320 number of scalars that need to be carried to the next 321 270 level, while still reproducing key results from the exper-271 iments in *Tier 0*, for example autoignition times, or from 323 272 experiments in Tier 1, such as premixed flame speeds, 324 273 extinction or ignition. Systematic methods of reduc- 325 27 tion and tabulation of chemical kinetic mechanisms, ei-326 275 ther with or without molecular diffusion effects [14, 39– 276 41], produce reduced reaction mechanisms, or generate 277 look-up tables as a function of the smaller set of scalars. 327 278 There are many methods of mechanism reduction, and 328 279 many variants thereof, denoted by acronyms in Fig. 1. 280 A succint review of their features and merits is available 329 281 in Ref. [42]. Reduced mechanisms for use in turbulent 330 282 flow calculations are usually of order of tens of species 331 283 for realistic geometries. However, a very large class of 332 284 LES or RANS simulations for practical combustors re- 333 285 lies on only one or two scalars – a progress of reaction 334 286 and a mixture fraction, very successfully for the simu- 335 287 lation of flame species behavior. Extensions to incorpo-288 rate the simulation of the slower species such as NO and 337 289 CO are routinely included in the reduction mechanism 338 290 or tabulation [39, 43, 44]. 291 339

3.3. Tier 2 - Turbulent combustion measurements and model validation

In Tier 0 and 1, the objective of the model validation exercise is to obtain a minimum set of chemical 344

kinetic parameters compatible with the existing thermodynamics and experimental datasets and their uncertainties. In Tier 2 validation, the objective is different. In general, one wishes to benchmark an existing physical representation of turbulent combustion against a set of conditions of interest, and demonstrate that the target measurands agree with the predictions within acceptable bounds. However, the feedback loop between the error found and required changes to the model is not necessarily obvious. A robust model should have a min*imum* and *transparent* number of adjustable constants, and be validated against target experiments over a sufficiently wide range of conditions. These constants are are generally associated with the subgrid models, either directly as parameters in the adjustment of scalar dissipation or turbulent viscosities, apparent turbulent Schmidt numbers or other factors. If model parameters need to be changed depending on the conditions or the model chosen, its broader utility is lost.

Researchers have used benchmark experiments to reexamine model assumptions and alter them, relaxing strong assumptions, reviewing correlations or considering originally neglected terms in equations. Given the variety of assumptions used for subgrid models, the particular adjustments made can easily get lost in comparisons that may have different simulation details, such as mesh distribution. Published model validations almost invariably claim acceptable agreement with the experiments, yet the value of comparisons lies in understanding the modes of failure, and creating methods for dynamically determining an optimum model choice.

4. A brief history of validation experiments for turbulent reacting flows

Validation experiments for combustion have a long and distinguished history. This review considers samples of experimental datasets over the past 20 years which have served as beacons for modelling efforts. Given the need for statistical information for the models, time and space resolved measurements are required, particularly regarding correlations between the state space of temperature and species. Pope [45] suggested in a 1985 review that the experimental techniques of laser-Doppler-anemometry (LDA) and Raman spectroscopy were approaching the stage where simultaneous measurements of local instantaneous velocities and scalars would soon be possible, allowing probability models to be directly validated. As ever, one tends to overestimate the coming speed of technical change, yet there are promising developments afoot.

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A vast set of measurements have been produced for 395 345 turbulent flames, but only a subset of those is suffi- 396 346 ciently detailed to address some of the questions re- 397 347 garding the suitability of the turbulence-chemistry and 398 348 turbulence-diffusion model. One of the purposes of ex- 399 349 periments at this level is to provide data to test the hy-350 400 351 potheses set out in models, or at least the results of the 401 hypotheses. In particular, assumptions in the models 402 352 posit inherent conditional relationships between scalars, 403 353 particularly between temperature and species. Whereas 404 354 it is always possible to test models a posteriori based 405 355 on the final mean or fluctuation measurements, the 406 356 power of detailed, single shot experiments which pro- 407 357 vide species-temperature and/or velocity-species statis-408 35 tics lies in the ability to test out *assumptions* in the 359 model-based correlations between scalars under a range 360 of conditions. Table 1 provides a non-exhaustive col- 411 361 lection of experiments produced for model validation, 412 362 including a variety of flame types, but focusing on sets 413 363 that are sufficiently complete to be useful, thus provid-414 364 ing a broad sample of validation datasets that explore 415 365 the variety of flame structures. A number of experi-416 366 ments on stratified flames listed on Table 1 also extend 367 into purely premixed flames, but a much larger set of 418 368 premixed experiments exists for a variety of configu- 419 369 rations of steady and unsteady premixed flames, as re- 420 370 viewed by [46], and in ongoing workshops on premixed 421 371 flame model verification and validation (e.g. [47]). 422 372

4.1. Tools of the trade 373

The demand for measurements which can generate 425 374 statistics of instantaneous species mass fractions and 375 426 temperatures for target gas flames requires specialized 427 376 Raman, Rayleigh, laser induced fluorescence (LIF) or 428 377 coherent anti-Stokes Raman scattering (CARS) mea- 429 378 surements. Unlike the case of velocity measurements, 430 379 which require significantly less expertise, only three or 380 431 four well-equipped laboratories around the world have 381 been able to maintain high-end facilities capable of 433 382 accurate scalar measurements over the past couple of 434 383 decades. Results are well documented through the TNF 435 384 Workshop [115]: the work by Barlow and coworkers at 436 385 Sandia National Laboratories, by Meier and colleagues 437 386 at DLR Stuttgart, by Bilger and Masri at Sydney, and 438 387 Dreizler and others at TU Darmstadt, as previously re- 439 38 viewed in [116, 117]. The collaborative workshop has 389 inspired similar initiatives in engine [118], autoignition 441 390 [119], and soot research [120]. 391

4.2. A smorgarsbord of flames 392

Flames investigated at the turn of the 20th century 445 393 were simple diluted turbulent jet diffusion and partially 446 394

premixed flames with jet Reynolds numbers from 10 to 40×10^3 , as shown in the first block of Table 1. The original questions were associated with the ability of variants of flamelet and PDF models to reproduce the flame structure. These experiments offered point measurements with a resolution of hundreds of micrometers, time resolutions of sub-microseconds, and species and temperature accuracies between 1 and 10 percent, which is in general a useful engineering range for model validation.

The use of jet flames simplifies simulations for two reasons: (a) boundary conditions are simple, (b) the calculations are parabolic, so that the upstream values do not depend on downstream values, allowing calculation domains to be reduced based on computational resources, without prejudice to accuracy [12]. However, unpiloted jet flames cannot be stabilized beyond a critical velocity. Piloting is therefore adopted to support a number of the flames with higher jet velocities without full extinction. The pilot stream temperatures therefore had to be well characterized, and any differences in molecular weights and properties accounted for or tailored to match the main mixture gases.

In particular, a series of lean-pilot, partially premixed jet flame experiments led by Sandia [52, 53, 121] (series D-F) have been simulated by a vast number of researchers. The attraction appeared primarily because these measurements offered not only a full set of scalars, but also quantitative NO and OH measurements. Further, high velocity jets for flames E-F allow testing of models for localized extinction, so these flames continue to be benchmarks for models to this date [43, 122, 123]. A number of additional measurements were made in both the Sandia and DLR flames, including measurements of 2D and 3D fluctuating scalar dissipation of the mixture fraction [53, 121, 124], which allowed an examination of model assumptions and the role of filtering in the comparison of LES and models. A parallel series of flames from the Sydney group were investigated [54-56], with a number of variants on non-premixed jet flames, including bluff-body and swirl-stabilized flames which remained stable up to higher velocities, thus pushing Re and Ka numbers to higher levels and extinction arises. Swirl and bluff-body flames are of course more challenging from the fluid mechanics viewpoint, and can possibly create difficulties with the onset of higher heat transfer at the base. Many of these results are expressed in scatter plots of temperature-mixture fraction, which are useful for limits of diffusion-like flames.

Piloted high velocity non-premixed flames can be pushed to the point where they are lifted. In that case,

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Name	Ref.	Description	Fuel	Measurements ^a
Jet non-premixed and partia	lly premixed			
TUD-H3	[48]	diluted non-premixed jet flame	H_2, N_2	$T, Y_{\rm NO}, Y_{\rm OH}$
H2-A,B,C	[49, 50]	diluted non-premixed jet flame	H_2 , He	$T, Y_{\rm NO}, Y_{\rm OH}$
DLR-A,B	[51]	piloted non-premixed jet flame	CH ₄ /H ₂ /N ₂	$T, Y_i, Y_{NO}, Y_{OH}, CH, U, V$
Sandia-C,D,E,F	[52, 53]	lean piloted jet partially premixed flame	CH ₄ , air	$T, Y_i, Y_{NO}, Y_{OH}, U, V$
Sydney PF, BF, SM	[54-56]	bluff-body and swirl stabilized flames	CH_4 , CO, H_2 , methanol	$T, Y_i, Y_{\rm NO}, Y_{\rm OH}, U, V$
AJHC	[57]	piloted non-premixed jet flame	CH ₄ ,H ₂	T, Y_i, U, V
DJHC	[58]	piloted non-premixed jet flame	CH4 (NG)	T, Y_i, U, V, OH, NO
Autoigniting/large pilot	[**]	F F J		-,-,, -, -, -,,
Cabra	[59, 60]	rich piloted partially premixed	H_2,CH_4	$T, Y_i, Y_{\rm NO}, Y_{\rm OH}$
РРЈВ	[61, 62]	lean premixed jet into large pilot	CH ₄ and NG	$T, Y_i, Y_{OH}, CH, CH_2O, U, V$
DJHC-2	[63-65]	piloted premixed jet	CH_4, H_2	$T, Y_i, Y_{\rm NO}, U, V$
Premixed and stratified	[00 00]	proted proninted jet	0114,112	1,1,1,1,0,0,0,,
TUD stratified	[66, 67]	concentric stratified flame, inner pilot	CH ₄	T, Y_i, U, V
TUD counterflow	[68]	opposed flow turbulent flame	CH4 CH4	T, Y_i, U, V, OH
Cambridge stratified	[69, 70]	radially stratified flames with/without swirl	CH ₄	T, Y_i, U, V, OH T, Y_i, U, V, OH
Sydney stratified	[71–75]	piloted burner with variable radial stratification	0114	CH_4, T, Y_i, U, V, OH
Sooting flames	[/1-/3]	photed burner with variable radial stratification		CH_4, I, I_i, U, V, OH
DLR/Adelaide	[76 79]	lifted non-monived ist flows	C_2H_4	TUVEJ
	[76-78]	lifted non-premixed jet flame		T, U, V, f_v, d_p
DLR/Adelaide-2	[55, 79]	bluff-body non-premixed jet flame	C_2H_4	f_{v}
Missouri	[80]	non-premixed jet flame (no co-flow)	C_2H_4	f_{v}
DJHC-3	[58, 81, 82]	piloted jet flame	NG	Y_i, U, V, OH, f_v
DLR/RQL	[83-85]	swirling pressurized flame with secondary air injection	C_2H_4	T , OH, f_v , U , V
Technical flames				
TECELAM	107 001	model swirling injector, radial vanes, partially	GU	
TECFLAM	[86-88]	premixed burner, operated at high P, T	CH_4	T, Y_i, U, V, OH
		model swirling injector, radial vanes, partially		
GTMC	[89-92]	premixed burner, also operated at pressure and	CH ₄	T, Y_i, U, V, OH, CH
		under instabilities		
Siemens SGT-100	[93–95]	Siemens swirling injector, radial vanes, partially	CH ₄ (NG)	$T, Y_i, U, V, OH, NO(ave.)$
		premixed burner, operated at high P, T		$I, I_i, U, V, OH, NO(ave.)$
NASA LDI	[96]	swirling lean direct injector operated on gas at	H ₂ /CH ₄	Y_i
NASA LDI	[90]	high P, T	H2/CH4	11
Spray flames				
UC Irvine	[97]	pressure spray hollow cone atomiser flame	methanol	U_d, V_d, n_d, d_d
NIST	[98]	pressure spray hollow cone atomiser flame	methanol	U_d, V_d, n_d (dye), d_d
CNIRS Orleans	[99]	air-assist injector with surrounding co-flow; pilot	n hantona	
CNRS Orleans	[99]	flame located at variable height from injector	n-heptane	U_d, V_d, n_d, d_d, U, V
Yale	[100]	weakly turbulent jet with dilute droplets in	methanol	T, U_d, n_d, d_d
		co-flow, stabilized at the atomiser tip		I, U_d, n_d, a_d
Sydney	[101, 102]	dilute and dense spray into pilot mixture for	ethanol, methanol	U_d, V_d, n_d, U, V
		autoignition study into piloted co-flow		U_d, V_d, n_d, U, V
Sydney-2	[103, 104]	weakly turbulent jet with dilute droplets in	acetone,ethanol	U_d, V_d, n_d, OH
Sydney-2	[105, 104]	co-flow, stabilized at the atomiser tip	acetone,ethanoi	U_d, V_d, n_d, OH
Cambridge swirl	[105, 106]	swirling confined spray flame	diesel, JP-10, PME, RME	U_d, V_d, n_d, U, V
Cambridge jet	[107]	bluff-body stabilized spray flame	n-heptane,n-decane,n-dodecane,	CH ₂ O, OH, Mie
Cambridge pilot	[108]	piloted bunsen burner with dispersed droplet mist	jet-A1 ethanol	CH ₂ O, OH, Mie
0.1		confined burner at elevated temperature,		- · ·
CORIA	[109, 110]	non-swirling air flow	ethanol, methanol	U_d, V_d, n_d, OH
				<i></i>
DHSC	[111, 112]	piloted spray flame into co-flow of air or lean pilot	ethanol	T, U_d, V_d, n_d, U, V

^{*a*} Variables indicate single shot measurements of the following variables: U, V: axial and radial gas velocities, U_d , V_d : axial and radial gas velocities, T: gas temperature, Y_i : stable species concentrations, n_d : droplet concentration, d_d : droplet diameter, OH, CH: non-quantitative PLIF, f_v : soot volume fraction., NG: natural gas.

Table 1: Turbulent flame experiments offering quantitative statistics of species and temperature for flame structure validation.

entrainment and autoignition at the base of the flame 457 447 can become a significant mechanism for flame stabiliza- 458 448 tion. This is a particularly difficult phenomenon to cap- 459 449 ture with simple flamelet models, and has been a desir-450 460 able target flame of modellers as a challenge, either as a 461 451 lifted non-premixed flame (Cabra burner) [59], or a se-452 462 ries of lower speed autoigniting piloted flames [57, 58], 453 463

or stratified-premixed autoigniting jet flames [61, 62].

Emerging needs in the validation of premixed and 465 partially premixed flames for practical gas turbine flame 466 models led to a number of investigations, starting from very simple, controlled turbulence stratified flames within flammability limits [66, 67, 69, 70] to piloted rich flames with a more aggressive variance in mixture fraction [71–75].

Demand for accurate data sets on the formation of soot have spurred investigators to adapt previously used turbulent jet flames as benchmarks for soot production [55, 76–82], both at atmospheric pressures and more recently, up to 5 bar [83–85]. In these experiments,

flame temperatures are measured using CARS, laser- 517 467 induced incandescence (LII) and absorption measure- 518 468 ments are used for determining soot volume fraction. 519 469 Very high pressure measurements from sprays at well 520 470 characterized diesel-like conditions are available in the 521 471 ECN database [118]. There are currently no datasets 472 522 for steady turbulent soot formation for liquid sprays at 523 473 high pressures, although it is understood that there are 524 474 specific datasets for industrial injectors (e.g. [125]). 475

A small number of flames that are surrogates for real 526 476 gas turbine flames have been well characterized both at 527 477 low pressure and high pressure and temperature by the 528 478 TUD [86, 87] and DLR groups [88–95], as well as more 529 479 recent experiments at NASA facilities [96]. These very 530 480 detailed measurements of technically premixed, realis-481 tic burners demonstrate the state of the art for experi-482 mental investigations in industrially relevant flames. As 533 483 discussed further on, realistic simulations of these sys-534 484 tems provide a glimpse into what has (or has not) yet 535 485 been solved for practical problems of this nature. 486

4.3. A sprinkle of data 487

538 Whilst there are many examples of turbulent pre-488 mixed, partially premixed and non-premixed flames, 539 489 there is a dearth of good data sets on well-controlled and 540 490 characterized spray flames, where experimental meth- 541 491 ods have barely scratched the surface of what is needed 542 492 and possible. Most of the flames currently used for 543 493 benchmarking simulations have used pressure atomiz- 544 494 ers mounted centrally, surrounded by a co-flow, and 495 measurements of droplet sizes and velocities was made 546 496 using phase-Doppler anemometry (PDA) [97, 98, 105, 547 497 107, 126]. Some measurements have aimed to decou- 548 498 ple the spray atomization process from the transport and 549 499 combustion by producing controlled mists [99, 101-550 500 104]. More recently, well-controlled piloted spray mea- 551 501 surements have also been produced [111, 112]. Only 502 552 a few of those many experiments provide gas velocity 553 503 measurements as well as droplet velocities, and only 554 504 two data sets have produced detailed temperature mea- 555 505 surements using CARS. The ECN network [118] has 556 506 been creating a consistent database for diesel-like and 557 507 gasoline sprays over a range of conditions suitable for 558 508 validation, and that activity should start to populate the 559 509 necessary space for robust modelling of these phenom-560 510 ena. 511 561

A number of high quality experiments exist as part 562 512 513 of a more general database, including a wealth of data 563 on steady and unsteady premixed flames as reviewed 514 in [46], and a growing database of imaging of pre-565 515 mixed flames at high Karlovitz numbers [10, 127] which 566 516

can be modelled directly via DNS [128]. More practically, there is also an emerging database on oxyfuel/coal flames [129, 130], and many experiments on high frequency visualization of combustion instabilities and limit phenomena, for example [131–134], which are not addressed in the present review.

From this brief survey, we conclude that there is a large variety of test cases offering pointwise scalar and velocity information at atmospheric pressure, ranging from diffusion to partially premixed flames, with and without pilot, and near and away from autoignition. A few experiments also have information on relevant pollutants. There is a much smaller database at high pressures and temperatures, typically containing information on more practical flames. The detailed database on scalars in sprays flames is very small, and almost non-existent at pressure. Given the importance of liquid phase combustion for practical applications, including engines and aeroengines, this state of affairs appears to reflect the ingenuity of engineers, who continue to produce good products with incomplete information.

5. Minding the gap: the state of the art

Guidelines on model validation [12, 135] in general offer the following advice: (a) validation experiments should be designed independently, but considering input from modellers, (b) boundary conditions should be well characterized, and their influence quantified, (c) random and systematic experimental uncertainties should be clearly assessed, (d) a hierarchy of experimental measurements of increasing computational difficulty and specificity should be created, from globally integrated quantities to local quantities, (e) validation should be attempted over a wide range of conditions to which model parameters are sensitive. As a final guideline, not sufficiently emphasized in previous studies, (f) validation should be conducted by modeling the quantity directly experimentally measured (say, scattered signal or speed of sound), rather than the variable in the governing equations (e.g. temperature). The fact that the customer is usually the modeler leads to convoluted attempts by experimentalists at inversion of the experimental signal, adding to the error in the final delivered measurand.

The experiments listed in Table 1 were most frequently designed by experimentalists, with input from modellers, to test robustness of turbulent combustion models. However, reality often intervenes to complicate what initially seems a simple task to measure boundary conditions: effects of heat transfer back to the stabilization point, or the role of boundary layers upstream con-

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spire to add uncertainty to otherwise well-designed ex-567 periments [136]. Random errors are usually assessed by 568 understanding the limitations of the optical diagnostic 569 techniques used; yet systematic errors (typically associ-570 ated with flow measurements, instrument calibration or 571 asymmetry) are often much more difficult to assess, and 572 573 are only discovered in the rare occasions when an experiment is duplicated elsewhere. Finally, the measure-574 ment of local rates or terms in balance equation is possi-575 ble only in the simplest of cases – but there is certainly 576 room for thoughtful experiment design to target specific 577 model features, as highlighted in Section 6. In what fol-578 lows, we consider a few examples of cross comparisons 579 between models and experiments, which capture the ad-580 vances in prediction, and suggest a future path. 581

582 5.1. Rich premixed-diffusion Sandia flame D-F

An entire tome could be written on the roughly 400 583 comparisons of models and experiments of piloted par-584 tially premixed flames D-F associated with the TNF 585 Workshop [115]. These sets have often been selected for 586 validation, as they offer not only stable species measure-587 619 ments, but also NO and OH concentrations. The nature 588 620 of the flame, consisting of a rich stream (25% CH₄, 75% 589 air, for $\phi = 3.17$), surrounded by a lean pilot flame, pro-590 621 duces a well-controlled environment for the simulation 591 of flames exposed to high turbulence levels into near ex-622 592 tinction. Many LES simulations are able to capture the 593 behavior of major species, velocities and temperatures 624 594 with modest spatial resolution, and a range of subgrid 625 595 models. Most LES (and RANS) models are able to cap-626 596 ture the overall temperature and velocity distributions 597 using tabulated or flamelet approaches, although the be-598 havior of the higher velocity flames E-F are more chal-629 599 lenging for coarser models [43, 137]. Creative solutions 630 600 – for example by the introduction of additional scalars 631 601 with reacting time scales uncoupled to the lead progress 632 602 variable – are used in combination with flamelet models 633 603 to capture extinction behavior, as well as the concentra-634 604 tions of the slower reacting species CO and NO further 635 605 downstream. A concise review of a number of simu-636 606 lations of NO in flame D using tabulation and direct 637 607 chemical integration approaches is available in Refs. 638 608 [43, 137]. Figure 2 shows a collection of simulation 609 results for NO centerline concentrations, both recent 639 610 and past, using direct integration and extended flamelet 640 611 models. Prediction of NO mass fractions using flamelet 641 612 modes requires inclusion of an additional variable to ac-613 642 614 count for disparate time scales as well as accounting for 643 subgrid variances, as demonstrated by [44, 138]. In con-615 trast with flamelet models, RANS-PDF models tend to 645 616 be quite successful in representing the chemistry of slow 646 617

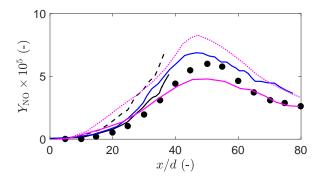


Figure 2: Sample LES simulation and experimental results for Sandia Flame-D using directly integrated chemistry. Symbols are experimental mass averaged mixture fractions along the centerline. Black lines from [43]: Highly resolved (2-5 ℓ_k) direct integration simulations using GRI2.11 (solid), and GRI3.0 (dashed lines). Blue lines from [140]: (40 μ m grid, tabulated premixed flamelet-PSR model. Magenta lines from [138]: premixed flamelet, coarse grid (*D*/8), with scalar subgrid variance (solid) and with thickened flame model (dashdotted).

reacting species, as shown for example in earlier papers by Tang et al. [139], as well as autoigniting flames discussed below.

5.2. Autoigniting flames

Predictions regarding the interaction between high velocity reactants and surrounding pilot flames challenges simpler models, as the combustion regime becomes a mixture between autoigniting reactants under partial diffusion control. PDF transport models [25, 141] and CMC [142, 143] as well as RANS-PDF [144] with reduced chemistry have been used to model these systems to predict scalar profiles. Creative approaches to modelling these flames by using a switching index which can recover either the diffusion, premixing or autoigniting regimes, and still use unsteady flamelets and tabulation using PFR or PSRs [22, 145, 146]. The good performance of flamelet models under these conditions is perhaps surprising, but as has been noted [22, 145], autoignition times are not very sensitive to the particular diffusion model used, rendering predictions rather forgiving of the particular details.

5.3. Stratified flames and technically premixed flames

The Cambridge and TU Darmstadt stratified flames have been the targets of a number of validation efforts [21, 147–149]. Results on the Darmstadt simulation results were recently compiled by Fiorina et al. [136], showing that stratified flames within the flammability limit behave essentially as ensembles of premixed flames. The state of the art in understanding

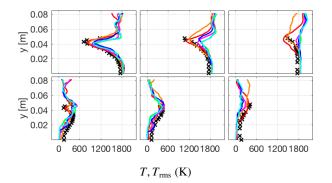


Figure 3: Sample comparison of measured and predicted mean temperature (top) and corresponding RMS fluctuations (bottom) on a 7 Mcell grid model of the SGT-100 burner experiments, for distances from the burner of x/D=[1.21, 1.44, 1.66]. Legend: (-) LES-PaSR, (-) LES-EDC, (-) LES-FM, (-) LES-TFM, (-) LES-SF, (-) LES-ADM and (+) experimental data from [93-95]. For references to the details of each model, the reader is referred to the original paper [153].

of such flames has been recently reviewed and dis-681 647 cussed in [150]. A recent series of rich-piloted strati-648 fied flames by [71–75] offer an interesting case where 649 both premixed and diffusion behavior are simultane-650 ously present, based on the correlation of temperature 651 and mixture fraction. A number of papers in this Sym-652 posium address the difficulties in these simulations. 653

Measurements and simulations of technically pre-654 mixed flames under high pressure and temperature have 689 655 been made, mostly on generic gas turbine injectors with 656 natural gas, as listed in Table 1, but also on a variety of 657 692 swirl-stabilized burners, as reported in [151, 152] and 658 others, where the dataset may not be complete owing 659 to proprietary or other reasons. Recent simulations by 660 695 [153–155] of the Siemens SGT-100 burner experiments 661 [93–95] have benchmarked a variety of models against a 662 whole range of simulations. Fedina et al. [153] analyzed 663 the results of six variations of micromixing and flamelet 664 models, concluding that the overall error in tempera-665 ture, velocity and major species across the four cross 666 sections of the flame were similar for all models, as 667 shown in Fig. 3. Previous LES results using a simple 668 eddy closure model against the same dataset showed an 669 overprediction of both outlet NO and CO by a factor 703 670 of about four, whereas more recent predictions of the 671 same flame using integration of reduced chemical mech-672 anisms [154, 156] showed results within 25 percent of 673 the measured values. 674

5.4. Sooting flames 675

Simulations of turbulent sooty flames have existed, 710 676 but only recently have reliable detailed comparisons 677 711

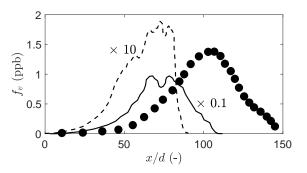


Figure 4: Comparison of experimental measurements of mean soot volume fraction (circles) at the centreline of the flame in [81], simulations [158] and [159] (note different scales for model results).

been made between measurements and experiments. The DJHC-3 flame [58, 81, 82] has been simulated using LES coupled with presumed-PDF methods, with additional closures to account for the population balance for soot volume and area, and global models for PAH growth [157] based on the literature. Donde et al. [158] and Sewerin and Rigopoulos [159] used a PDF/population balance with stochastic closures to model the same flame. In all cases, agreement with major species and temperature is good, but estimates of soot volume fraction spread over two orders of magnitude, as shown in Fig. 4. Recent comparisons with the experimental data from DLR in [83, 84] show encouraging results for high pressure predictions of soot. Clearly, significantly more work is needed in refining models, as well as identifying potential measurements which could identify the problems. Recent measurements [160] of mixture fraction using Kr fluorescence showed an innovative means of obtaining simultaneous soot and mixture fraction, for example, and further measurements are certainly needed. The emerging measurements from the ECN network on soot formation in engines, as well as other unsteady measurements [161] of mixture fractions in unsteady jets will continue to help improve models and their accuracy.

5.5. Spray combustion

A recent review of models for dilute sprays, provides an excellent summary of the issues surrounding spray simulations, including those of the Delft hot spray flame (DHSC) ([111, 112]). The latter experiments provide a more complete database than similar studies, and several recent studies have tackled the simulation with good results using flamelet and transported PDF [162-164], as well as stochastic methods [165].

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Sample results for two cases are shown in Fig. 5, one 712 with co-flowing air, A_{II} , and one with co-flowing pilot 713 (H_{II}) . The very interesting and complex structure of 714 such flames, which feature multiple reaction zones ow-715 ing to the inner and outer mixing regions, makes them 716 a challenging choice, quite apart from the difficulties in 717 simulating two-phase flows. Clearly, whereas the struc-718 ture of the piloted spray is reasonably well captured, that 719 is not the case for the air co-flow, and this case will con-720 tinue to be the target of model investigations. 721

There have been many simulations of steady spray 722 flames, from RANS simulations for practical fuels 723 [166], to stochastic-LES simulations [167] of the early 724 McDonell data [97], and CMC models [168] of well-725 controlled pressure-atomized flames [108], as well as 726 countless simulations of high velocity, transient au-727 toigniting jets such as those available in the ECN 728 database [118]. Yet one of the striking observations 729 about the list of steady spray measurements in Table 1 730 is that, unlike their gaseous counterparts, none have 731 reliable measurements of mixture fraction or species, 763 732 and only few have gas velocities and product tem-733 peratures. The main reason for this lack of informa-734 tion is the significant background interference created 735 by the highly radiative environment prevalent in soot-736 laden or spray flames, which renders various incoher-766 737 ent scattering-based techniques impossible to quantify. 767 738 Even robust velocity measurement techniques that rely 768 739 on Mie scatter tend to be affected by background noise 769 740 in highly radiative situations. These difficulties are com-770 741 pounded at high pressures, as not only does the radia-742 tive background signal increase, but so does the extent 772 743 of signal trapping for measurement techniques such as 773 744 laser induced fluorescence and laser-induced incandes-774 745 cence. As a result, the database is limited, and mod-746 els that try to reproduce the features of sooting, particle 776 747 or spray-laden flames can at best reproduce the behav-748 ior of droplet sizes, concentrations and velocities, and 778 749 possibly the location of the flame by comparison with 779 750 OH measurements. Spray and soot combustion mod-780 751 elling and measurements remain a challenge, and suit-781 752 able datasets are clearly needed. Coherent optical tech-782 753 niques offer a sensible way around some of the radiative 783 754 background problems, and the next section discusses 784 755 some emerging diagnostic possibilities. 756

6. Experimental needs and opportunities 757

758 The review of experiments outlined in Section 5 has 789 revealed some areas of agreement between models and 790 759 experiments, and some significant gaps. There are, of 791 760 course, as many experimental situations as one cares to 792 761

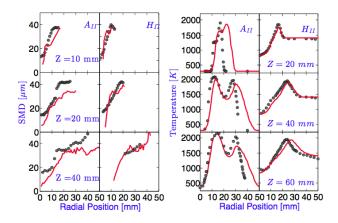


Figure 5: Radial profiles of droplet SMD (left), and mean temperature (right) at several elevations from the burner, for case A_{II} (air-spray) and H_{II} (pilot-spray). Line: LES results from [169], symbols: experimental data from [111]. Left: Sauter mean droplet diameter (SMD); right: mean temperatures.

invent, so the question is: where should one focus? Below we list some of the largest gaps, and suggest emerging techniques which could be used to address them.

6.1. Spray and sooting flames

Spray flames are luminous and soot-prone, so that the workhorse of measurements for temperature and species - Raman scattering measurements - does not work under these conditions. Ample data are available on droplet sizes and velocities, accompanied by occasional non-quantitative measurements of OH or CH₂O, which are helpful in terms of identifying flame structures, but not so useful for quantitative validation. Apart from the significant progress highlighted in Sections 5.4 and 5.5, there is a possible opportunity for new fs/ps-CARS techniques in these flames: unlike ns-CARS, these techniques have been demonstrated to be insensitive to both radiative background (since it is a coherent technique) as well as non-resonant background, and work well under sooting conditions [170-174]. Further, their applicability to 1D and 2D-CARS has been demonstrated, as well as wideband techniques that can extract multiple species [171, 175]. The disadvantage of these techniques at the moment is that they require significant specialist expertise, both in setting up the phasesensitive experiments, as well as in processing and interpreting the information. Modelling efforts need to pinpoint what type of information would be most critical to differentiate between models, keeping in mind the ultimate targets of the validation, whether that be with respect to emissions, heat release rate or other parameters.

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6.2. Real hydrocarbons 793

842 Most of the studies discussed above have used 794 843 methane, as it is the simplest hydrocarbon. Yet the 795 different behavior of higher hydrocarbons is likely to 796 have significant effects, particularly with respect to ef-797 fective Lewis numbers. Recent DNS work [176, 177] 798 reveals how the complex chemistry of larger hydrocar-799 bon is translated onto the macroscale behavior of tur-800 bulent flames. Experimental work using Raman scattering of hydrocarbons becomes more challenging as the 802 the multiplicity of intermediate species creates interfer-803 ences in the spectral range. Yet detailed information has 804 only started to emerge for turbulent flames containing 805 some of the simpler, soot-free hydrocarbons [178–180]. 806

6.3. Realistic densities, realistic Ka 807

The vast majority of experiments have been per-808 formed at ambient conditions, yet most combustion de-809 vices operate at high pressure and temperature. The bar-810 riers are costs (which increase with confinement) and 811 the quality of the measurements, which can suffer due 812 to signal trapping, beam steering, and spectral broad-813 ening. Emerging techniques that provide higher signal-814 to-noise at higher densities (such as laser induced grat-815 ing spectroscopy [181]) or that are not prone to colli-816 sional broadening (ultra-fast techniques) may also help. 817 However, as the discussion in Section 5 and Fig. -3 818 highlights, it is perhaps surprising that the overall flame 867 819 structure can be relatively insensitive to the details of 820 the micromixing model in some high turbulence cases. 821 869 It would be useful to understand how general these find-822 870 ings might be in practical problems. 823

7. Error and uncertainty analysis 824

874 The process of model validation is usually considered 825 875 finished when the error between measurements and sim-826 876 ulations is quantified to be within the estimated exper-827 877 imental uncertainty. When discussing highly unsteady 828 phenomena such as turbulent combustion, measures for 878 829 879 comparison are typically statistical averages and mo-830 ments. In the case of instabilities, the quantity of in-880 831 terest may be a characteristic time scale or spectrum. 881 832 What is an appropriate measure of a validated model? 882 833 How sensitive is the error to model parameters? And 883 834 how do we know whether models can be extrapolated 884 835 beyond the conditions where strict validation was con-885 836 ducted? 837 886

The quantification of errors is a general problem 887 838 associated with probabilistic outcomes in either mea-888 839 surements or models, which has been tackled on the 889 840

modelling level via uncertainty quantification (UQ). A number of studies have used statistical methods for error propagation, particularly those associated with the extraction of reaction parameters [182-184], but also thermoacoustic oscillations [185, 186], and are general enough to, in principle, be applicable to any model parameter. Khalil et al. [183] have recently considered the sensitivity of results in a bluff-body flame to a range of model parameters, whilst Mueller and Raman [122] have considered uncertainties in different types of models. Although uncertainties in boundary conditions have been considered by trial and error, the methodology of polynomial expansion in UQ has been used recently for identifying uncertainties due to boundary conditions in spray simulations [187]. Finally, a recent contribution by Ihme and colleagues [188] applies systematic statistical error measurement methods to quantify the overall error for a number of variables in the recently investigated Sydney stratified flame [74, 75], allowing for a quantification of the influence of various predicted intermediate variables on the overall error, as shown in Fig. 6. Clearly, these methods are useful not only to identify the merits of different models, but also to understand the sensitivity of results to measured boundary conditions, to pinpoint cross-correlations, and to guide the models towards better physical representations.

8. Designing future experiments

Whereas UQ has been used to quantify the bounds of model uncertainty, and therefore the limits of error between model and experiments, the potential for UQ and error quantification techniques is much more relevant when applied to the *design* of experiments, by attempting to ask the following questions upfront:

- 1. What is the *target output* of the model? In other words, which predictions are most valuable: CO? NO? Soot? Instability frequency? Rate of combustion? A combination of those with different weights? Over what range of conditions?
- 2. What qualifies a good test of a model or submodel? Changes to the model should yield differentiable outputs: when very different submodels give answers within the accuracy of the experiment, the model is not adequately tested.
- 3. How sensitive are the outputs of the model to the inherent errors in the experiment, for example to details of domain boundary conditions, such as velocity or temperatures?
- 4. To what extent can the model be confidently extrapolated away from validated ranges, given

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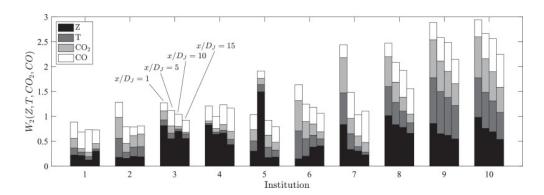


Figure 6: Quantitative comparison of multiscalar Wasserstein metric as a measure of global error [188], from ten anonymized LES-calculations, presented at the 13th TNF-workshop [115] for flame conditions FJ-5GP-Lr75-57 in the inhomogenous flame [72–75]. The decomposition of multiscalar calculations allows contributions from each variable at each axial location to become visible. The four bar-graphs from each contribution correspond to axial locations of $x/D_j = [1, 5, 10, 15]$. Results used in this figure were included with permission from TNF-contributors. Reproduced from [188].

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known uncertainties in scaling? For example, if 922
the uncertainties in chemistry due to pressure are 923
well bounded, what are the expected uncertainties 924
of the turbulent predictions at pressure? Can these 925
bounds be used to decide whether experiments are 926
necessary or useful? 927

These are not technically straightforward questions, 896 but surely worthwhile enterprises given the enormous 897 effort devoted to developing experiments and to acquir-898 ing high quality data. Data generated by a validation 899 effort can become significantly more valuable if the tar-900 gets and sensitivities are clearly understood, and quan-901 tified. As well observed by Oberkampf and Trucano 902 [135], decisions about model validation should take into 903 account the various incentives in place for both exper-904 imentalists and modellers and their respective institu-905 tions, in evaluating the need for (or the results of) a vali-906 dation exercise. A complex and challenging experiment 907 from the point of view of the diagnostic developers may 908 or may not yield the necessary results for the model. 909 Similarly, complex or computationally-intensive simu-910 lations may or not answer the question of whether they 911 are valid over the design range if the output sensitivity 912 is insufficient. 913

914 9. Summary: a more perfect union

In this brief review, we collect a broad spectrum 947 915 of validation experiments for turbulent combustion and 948 916 their respective comparisons, and suggest ways to im-917 949 918 prove the productivity of validation procedures. Suc- 950 cess requires joint work between experimentalists and 951 919 modellers to understand how to design validation pro-952 920 cedures that provide clear answers to well-posed ques-953 921

tions. The most referenced databases have demonstrated the following attributes: (a) well-defined geometries and boundary conditions, (b) accessible data, (c) a sufficient number of independent and complementary scalar and velocity measurements, over a wide enough parameter range, and (d) quantified uncertainties.

Examination of the state of the art in model validation shows that there are clear gaps in validation-quality data in spray, soot, and high pressure combustion. In that vein, there are opportunities for upfront collaboration between modellers and experimentalists to design experimental targets designed with a clear understanding of which model features can actually be tested and distinguished. Further, researchers would benefit from closer exchange in information with industry to better quantify the value of increasing accuracy of predictions for different target variables: how much is a marginal increase in accuracy in NO prediction worth, relatively to other potential quantities? These are challenging questions, yet understanding the value of improvements will help better allocate resources. A panel discussion at this Symposium will hopefully open up the questions raised to enlighten a wider audience.

10. Acknowledgements

SH would like to acknowledge the many colleagues who provided their time for discussion and additional figures and data during the compilation of this review, including R. Barlow, H. Pitsch, M. Ihme, M. Mueller, D. Roekaerts, B. Savard, C. Fureby, D. McGrath and G. Nivarti, and the anonymous reviewers, who provided insightful comments and suggestions. The University of Cambridge provided access to bibliographical resources

for the efficient search and compilation of this review, 1016 954

- and allowed the use of my professional time for the pur-1017 955
- pose. 956

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