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Mid‑infrared CO2 sensor with blended absorption features for non‑uniform laminar premixed fames

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Abstract

We develop a novel mid-infrared $CO₂$ absorption sensor exploiting spectrally blended features to characterize thermochemical non-uniformity of laminar premixed fames. A new algorithm for interpreting spectra with signifcantly blended features is proposed for single line-of-sight multi-transition absorption thermometry. A CO₂ sensor covering eight absorption transitions near 2378.0 cm⁻¹ is demonstrated in a laminar premixed CH₄/Air flame at an equivalence ratio of $\varphi = 1.0$. The average signal-to-noise ratio is 1293 with a measurement time of 1.0 s, and the estimated $CO₂$ detection limit is 42.8 ppm at 1543 K with 6 cm pathlength. Computational fluid dynamics (CFD) simulation with reduced GRI 1.2 mechanism is performed for comparison. Spatially resolved distributions are obtained with the laser absorption spectroscopy (LAS) measurements, combined with postulated distribution from CFD simulation. The LAS measurements agree with the CFD simulation, with a central-zone temperature difference of less than 1.1% and $CO₂$ concentration difference of less than 1.0% . Discrepancy is observed in the boundary layer region due to pronounced mixing with the ambient surroundings. The sensor developed provides a lead for general LAS sensor design (blended absorption features, ambient interference, or under optically thick conditions), and can serve for practical combustion sensing.

1 Introduction

Tunable diode laser absorption spectroscopy (TDLAS) has been proved to be a powerful species diagnostic tool over the past decades thanks to its capability of providing nonintrusive, highly sensitive and quantitative measurements of various gas properties $[1-7]$ $[1-7]$. A number of demonstrations harnessing a variety of laser sources [[4,](#page-14-2) [5\]](#page-14-3) and detection techniques $[6, 7]$ $[6, 7]$ $[6, 7]$ $[6, 7]$, show convincing potentials for sensing

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targets from laboratory specialties to real-feld combustion environments.

For a typical absorption-based measurement, the incident (I_0) and transmitted (I_t) intensities are related by the Beer–Lambert law. Quantitative measurement is achievable with tunable, narrow-linewidth lasers and accurate transition lineshape models at experimental conditions. Two most common schemes for TDLAS sensing include the direct absorption spectroscopy (DAS) and wavelength modulation spectroscopy (WMS). DAS is advantageous with isolated transitions of sufficient linestrength, but may be complicated by the requirement for correct evaluation of the non-absorbing baseline, as discussed in [\[8](#page-14-5)]. Conversely, WMS is the method of choice for applications in harsh environments with low absorbance, high pressure, or for absorbers with blended absorption features. Calibration-free WMS with first harmonic (1*f*) or residual amplitude modulation (RAM) normalization can actively account for the variation in I_0 caused by broadband transmission losses $[9, 10]$ $[9, 10]$ $[9, 10]$ $[9, 10]$.

On the other hand, TDLAS technique by nature recovers the line-of-sight (LOS)-averaged gas properties along the laser beam path. Several approaches have been adopted to retrieve spatially resolved distributions, including singlebeam absorption thermometry with temperature probability distribution $[11]$ or profile fitting strategy $[12-15]$ $[12-15]$ $[12-15]$, and computed tomography with multiple laser beams [[16,](#page-14-11) [17](#page-14-12)]. It is worth noting that with single-beam schemes only the temperature or concentration distribution can be retrieved instead of an arbitrary profle along the laser beam path. A singular-value-decomposition framework has been proposed by Rieker et al. to explore the theoretical limits to resolve temperature distributions with single-beam LOS absorption measurement [\[18](#page-14-13), [19\]](#page-14-14). In this paper, we present a single-beam, mid-infrared (mid-IR) $CO₂$ absorption sensor exploiting several blended absorption features, for nonuniform temperature and concentration measurement of a laminar premixed fame. In particular, multi-line thermometry with profle-ftting strategy can serve as an alternative approach for two-dimensional reconstruction of an axisymmetric premixed fame, such as the fat fame of a Mckenna burner. This difers from traditional two-dimensional tomography for an axisymmetric fame using Abel transform method, which can be realized by translating the laser beam or burner, aligning multiple parallel beams [[20–](#page-14-15)[23\]](#page-14-16). While two-dimensional tomography with translated- or parallelbeam schemes will increase the complexity of experimental systems, and considerable efforts are required to alleviate the ill-posedness of Abel inversion algorithms, the single LOS, multi-line method proposed here will be more advantageous for measurement scenarios with limited optical access or confned space.

Carbon dioxide is a principal product of hydrocarbon combustion, and extensive research has been dedicated to $CO₂$ sensing. Several of the commonly studied absorption bands of CO₂ include the 1.5 μ m (2*v*₁ + 2*v*₂ + *v*₃), 2.0 μ m $(v_1 + 2v_2 + v_3)$, 2.7 μ m $(v_1 + v_3)$, and 4.2 μ m (v_3) rovibrational bands. Much of the earlier work utilized the weaker near-infrared (near-IR) combination bands near 1.5 μm [\[24](#page-14-17)], 2.0 μ m [[25](#page-14-18)] and the stronger vibrational band near 2.7 μ m [\[26\]](#page-14-19). More recently, the maturity and commercialization of quantum cascade lasers (QCLs) and interband cascade lasers (ICLs) $[4, 5]$ $[4, 5]$ $[4, 5]$ $[4, 5]$ has enabled spectroscopic access to $CO₂$ sensing near $4.2 \mu m$, where the fundamental band offers approximately 70 times stronger absorption than the vibrational band at $2.7 \mu m$.

Previous works [12, 27, 28, 29, 30] (Wen et al. 2021) of $CO₂$ sensing near 4.2 µm have been demonstrated for sensitive measurements of flame temperature and $CO₂$ concentration [\[12](#page-14-9), [15,](#page-14-10) [27](#page-14-20)[–31\]](#page-14-21). Liu et al. presented a multi-line thermometry technique for sooting fames with an ICL probing the *R*-branch bandhead near 2397 cm⁻¹ [[30\]](#page-14-22). Wen et al. further utilized the *R*-branch bandhead near 2397 cm−1 to spatially and temporally resolve temperature measurements in counter-fow fames [[15\]](#page-14-10). As shown in Fig. [1](#page-1-0), this selection of lines features several unique benefts including absence of ambient $CO₂$ absorption (blue dashed line), high sensitivity at elevated temperatures (red solid line), and simultaneous

Fig. 1 Simulated absorbance profiles for $CO₂$ near 4.2 μ m under ambient and typical combustion conditions

ftting of multiple transitions, making it suitable for combustion diagnostics. In contrast, the lower frequency transitions corresponding to lower *J* levels absorb signifcantly at a typical ambient $CO₂$ concentration of \sim 700 ppm and a pathlength of~30 cm, leading to issues of self-interference. This poses considerable challenges for real-feld combustion environments, where ambient $CO₂$ interference can be readily amplifed by the much longer optical paths such that even optically thick conditions can be reached. Moreover, densely packed hot band lines at the low-frequency side of the 4.2 μ m bandhead interfere with the v_3 fundamental band at high temperatures, making the region harder to resolve under combustion conditions.

More generally, precise LAS sensor development imposes various design criteria, such as selection of well-isolated absorption lines, absence of blended hot bands, and ambient interference, which are nevertheless difficult to attain under the extreme conditions associated with combustion environments. Conditions including high temperature, pressure, and complicated composition, all render heavily blended rovibrational spectra. Moreover, novel broadband laser sources including frequency comb [[32–](#page-14-23)[36\]](#page-14-24), Fourier-domain modelocked (FDML) lasers [[37](#page-14-25)], dispersed super-continuum sources [[38\]](#page-14-26), external cavity quantum cascade (ECQC) lasers [[39,](#page-14-27) [40\]](#page-14-28), etc., are being increasingly exploited thanks to their capability of providing broad spectral coverage for multi-parameter combustion sensing. Such sensor developments call for synergetic advancement of spectroscopic interpretation algorithms to extract quantitative information from the interblended absorption features.

In the context of DAS, an interference-feature baseline transform and background subtraction method (IFBTBS) has been proposed by the authors and the method has been

demonstrated to be efective for interpreting absorption spectra with interfering features in combustion environments [\[8](#page-14-5)]. Based on that, a new algorithm is presented in this work for interpreting absorption spectra with signifcantly blended features and further enables single-LOS, multi-transition, non-uniform absorption thermometry. A novel $CO₂$ absorption sensor near 2380 cm−1 targeting a group of blended hot band lines and strongly interfering ambient lines is developed and demonstrated in a $CH₄/Air$ premixed flame with spatial non-uniformity. Spatially resolved temperature and $CO₂$ concentration as a function of height-above-burner (HAB) at equivalence ratio is comprehensively investigated with the developed method. CFD simulation with reduced GRI 1.2 mechanism [\[41](#page-14-29)] is performed for comparison. In summary, the objectives of this work include:

- 1. To develop a novel mid-IR $CO₂$ absorption sensor near 2380 cm⁻¹ with relatively strong line strength, high temperature sensitivity, and free of interference from H_2O and CO.
- 2. To develop a new algorithm to interpret absorption spectra with signifcantly blended features in high-temperature combustion environments. This will open up new opportunity for general LAS sensor design with more fexible absorption line selection.
- 3. To investigate the thermochemical non-uniformity of a CH4/Air premixed fame using LAS measurement and CFD simulation. This would further extend the applicability of single-LOS multi-transition absorption thermometry for combustion-related spectroscopic studies.

2 Fundamentals

2.1 Multi‑line absorption spectroscopy under uniform conditions

The principle of laser absorption spectroscopy has been well documented [[1–](#page-14-0)[7\]](#page-14-1), and here only relevant spectroscopic fundamentals are briefy outlined. The fractional transmission, τ_v , defined as the ratio of the transmitted (I_t) and incident (I_0) intensities of light at frequency *v* (cm⁻¹) through a uniform absorbing medium, is described by the Beer–Lambert relation:

$$
\tau_{v} = \left(\frac{I_{t}}{I_{0}}\right) = \exp(-\alpha_{v}) = \exp[-S(T)P\chi_{i}\phi(v, T, P, \chi_{i})L],
$$
\n(1)

where α ^{*v*} denotes the spectral absorbance at frequency *v*, *S*(*T*) (cm^{−2}·atm^{−1}) is the temperature-dependent linestrength of the absorption transition, *P* (atm) the total gas pressure, χ ^{*i*} the mole fraction of species *i*, ϕ (cm) the normalized lineshape function, and *L* (cm) the optical pathlength. The

temperature dependence of linestrength *S* can be expressed as

$$
S(T) = S(T_0) \frac{Q(T_0)}{Q(T)} \frac{T_0}{T} \exp\left[-\frac{hcE''}{k} \left(\frac{1}{T} - \frac{1}{T_0}\right)\right] \left[\frac{1 - \exp\left(-\frac{hcv_0}{kT}\right)}{1 - \exp\left(-\frac{hcv_0}{kT_0}\right)}\right]
$$
(2)

where $S(T_0)$ is the linestrength at reference temperature T_0 (typically 296 K), Q the partition function, E'' (cm⁻¹) the energy of the lower quantum state associated with the transition, and ν_0 the linecenter frequency. The constants h, c , and *k* are the Planck's constant, speed of light in vacuum, and Boltzmann's constant, respectively.

Two-line absorption thermometry is the most widely adopted technique to infer temperature from the ratio of integrated absorbance area *A* of two individual transitions. The temperature sensitivity of two-line absorption thermometry relies on the diference in the lower state energy *E*["] associated with the two absorption transitions, i.e., ΔE^{\prime} . As an extension to the two-line thermometry, Boltzmann plot method infers gas temperature and concentration based on information from multiple lines [\[42,](#page-14-30) [43](#page-14-31)]. This can be especially preferable for blended absorption features at high pressures or temperatures, as well as with broadband laser sources. Boltzmann plot equation can be obtained by reformulating Eqs. (1) (1) (1) and (2) (2) :

$$
\ln\left[\frac{A_j}{S_j(T_0)}\right] = -\frac{hc}{k}\left(\frac{1}{T} - \frac{1}{T_0}\right)E_j'' + \ln\left[\frac{Q_j(T_0)T_0}{Q_j(T)T}P_{X_1}L\right] + \ln\left[\frac{1-\exp\left(-\frac{hcV_{0,j}}{kT_0}\right)}{1-\exp\left(-\frac{hcV_{0,j}}{kT_0}\right)}\right],\tag{3}
$$

where subscript *j* denotes the *j*th transition.

The *y*-coordinate in a Boltzmann plot is the ratio of integrated absorbance area to absorption linestrength at reference temperature T_0 . The *x*-coordinate is the lower state energy of the *j*th transition with *j* from 1 to *n*. The slope *m* is then solely a function of temperature. The last two terms in Eq. [\(3](#page-2-2)) constitute the *y*-intercept and can yield the species concentration with temperature determined. As illustrated in Fig. [2](#page-3-0), the stimulated emission term (rightmost ratio in Eq. ([2\)](#page-2-1)) can be approximated by 1 for near-IR $CO₂$ absorption transition (v_0 =6359.97 cm⁻¹) under typical combustion conditions $(<2500 \text{ K})$ [\[24](#page-14-17)]. However, it is worth noting that for the mid-IR absorption transition (v_0 =2377.8268 cm⁻¹) used in this work, apparent deviation from such approximation requires the value to be computed exactly especially at high temperatures.

2.2 Non‑uniform distribution with profle‑ftting strategy

Multi-line thermometry with approximately 10 absorption transitions has been demonstrated to retrieve non-uniform

Fig. 2 Stimulated emission terms for the near-IR absorption transition $(v_0=6359.97 \text{ cm}^{-1})$ [\[24\]](#page-14-17) and mid-IR absorption transition $(v_0=2377.8268 \text{ cm}^{-1})$ in this work from 300 to 2500 K, respectively

distribution along the laser beam path [\[44](#page-14-32), [45](#page-14-33)]. Others have used single-LOS, multi-line thermometry to retrieve the maximum temperature in a two-section cell with a precision of 30 K [\[46,](#page-15-0) [47](#page-15-1)]. With additional absorption transitions, accuracy of the measured temperature or concentration distribution may be further improved. However, the theoretical limits of the spatially resolved temperature distributions with single-LOS absorption techniques still remain to be studied [\[18,](#page-14-13) [19\]](#page-14-14).

Here we present a mid-IR $CO₂$ absorption sensor accessing a spectral range with several blended absorption features for non-uniform temperature and concentration measurement in laminar premixed fames. The sensor scheme utilizes single-LOS combined with postulated distribution function from validated CFD simulation. It has been demonstrated previously that a proper selection of multiple absorption lines along the single LOS is capable of reducing the non-uniform reconstruction uncertainty by 25% for high-temperature flames with profile-fitting strategy [[14\]](#page-14-34). In this work, while the targeted region of blended $CO₂$ absorption features poses undesired challenges for conventional line-ftting routines and quantitative sensing, it also gives rise to promising potentials for non-uniform sensing in that multiple absorption transitions can be readily accessed with a single laser scan.

For non-uniform gas medium, the integrated absorption area can be expressed as

$$
A_j = P \int_0^L X(x) S_j[T(x)] dx,
$$
\n(4)

where $T(x)$ and $X(x)$ are the distributions of temperature and gas concentration along the optical path *L*, respectively.

A set of *n* equations can be established when *n* absorption transitions are measured simultaneously.

$$
\begin{cases}\nA_1 = P \int_0^L X(x) S_1[T(x)] dx \\
A_2 = P \int_0^L X(x) S_2[T(x)] dx \\
\vdots \\
A_n = P \int_0^L X(x) S_n[T(x)] dx\n\end{cases} (5)
$$

Such an equation set can be solved using the criteria of minimal residual:

$$
\min_{T(x),X(x)} \left[\sum_{j=1}^{n} \left\{ \frac{P \int_{0}^{L} X(x) S_{j}[T(x)] dx - A_{\text{mea}}^{j}}{A_{\text{mea}}^{j}} \right\}^{2} \right],
$$
 (6)

where A_{mea}^j is the measured integrated absorbance area of the *j*th transition. Optimization algorithms, such as genetic algorithm (GA) [[16](#page-14-11)], simulated annealing (SA) algorithm $[16]$ $[16]$, are efficient in searching for the optimal distributions of temperature and gas concentration.

Stabilized laminar premixed fames from a McKenna burner have been widely investigated and its fame temperatures and species concentrations are assumed to be uniformly distributed along the radial direction [[48\]](#page-15-2). However, thermochemical gradients in the boundary layer could lead to discrepancies between central zone and LOS-averaged temperature or species concentration measurements. Extensive researches have been dedicated to the thermal boundary layer effects on LAS measurement [[12,](#page-14-9) [13](#page-14-35), [49\]](#page-15-3). Postulated distribution with physical understanding and simulation studies can greatly mitigate the infuence from the nonuniform characteristics along the laser beam path, hence, making it still a favorable model burner for both uniform and non-uniform diagnostic validation reference.

Over-simplifed 2-*T* or trapezoid profle is not able to sufficiently characterize the non-uniform temperature and species concentration distribution for the laminar premixed flame investigated here [[11\]](#page-14-8). Boltzmann profile-fitting strategy is used in $[12]$ $[12]$ as described by Eqs. (7) (7) (7) and (8) (8) . More detailed illustrations of Boltzmann profle for temperature and species concentration distributions are shown in Fig. [3](#page-4-0):

$$
T(x) = C_{2,T} + \frac{C_{1,T} - C_{2,T}}{1 + \exp\left(\frac{x - C_3}{C_4}\right)},
$$
\n(7)

$$
X(x) = C_{2,X} + \frac{C_{1,X} - C_{2,X}}{1 + \exp\left(\frac{x - C_3}{C_4}\right)},
$$
\n(8)

where $C_{1,T}$ and $C_{2,T}$ denote the temperature in the central fame zone and ambient surrounding, respectively. Similarly, $C_{1,X}$ and $C_{2,X}$ denote the species concentration in the central flame zone and ambient surrounding, respectively. C_3 is the radial position, where the temperature or species concentra-
tion is equal to $\frac{C_{1,T}+C_{2,T}}{2}$ or $\frac{C_{1,X}+C_{2,X}}{2}$. *C*₄ characterizes the gradient in the fame periphery or the boundary layer.

2.3 CFD simulation

CFD simulation is performed with reduced GRI 1.2 mechanism for comparison. Detailed geometry of the inner and outer burner structure (i.e., including the sintered stainlesssteel porous media and the chamfers) are precisely specifed in the computation domain, making the boundary conditions closer to the actual situation. The reactant flow $\left(CH_{4}/Air\right)$ and N_2 co-flow are set as the velocity inlets based on the experimental conditions. In the computation, both the downstream and the surrounding environment boundaries are set as the pressure outlets. More detailed illustrations about CFD modeling can be found in our previous work [[12](#page-14-9), [13](#page-14-35)]. Boltzmann profle [described in Eqs. ([7\)](#page-3-1) and [\(8](#page-3-2))] is determined based on non-uniform distributions obtained from CFD simulation. Table [1](#page-4-1) shows typical Boltzmann-profle parameter values with the increase of HAB from CFD simulation at $\varphi = 1.0$. With validated CFD simulation, parameters

characterizing the Boltzmann profle in LAS experiments can be constrained to a limited range, enabling better recovery of the non-uniform distribution.

3 Sensor design and evaluation

3.1 Line selection and characterization

In this work, eight $CO₂$ absorption lines located between 2377.2 and 2379.0 cm⁻¹, including two lines (*R*(44), *R*(46)) in the fundamental band and six lines [*R*(73–78)] in the hot band are chosen for $CO₂$ sensing. The spectroscopic parameters for the targeted $CO₂$ lines provided by HITEMP 2010 database [\[50](#page-15-4)] including wavenumber v_0 (cm⁻¹), linestrength *S* (cm−2·atm−1), lower state energy *E*'' (cm−1), air-broadening coefficient *γ*_{air} (cm⁻¹·atm⁻¹), self-broadening coefficient *γ*_{self}

Table 1 Typical Boltzmann-profle parameter values with the increase of HAB from CFD simulation at $\varphi = 1.0$

HAB (mm)	$\alpha_{1T}(\text{K})$	$\alpha_{1.X}$	α_3 (mm)	α_4 (mm) 1.20	
5	1818	0.090	28.5		
9	1804	0.0895	26.0	1.40	
13	1795	0.0895	24.0	1.45	

(cm⁻¹·atm⁻¹), and temperature dependence coefficient *n*_{air} for air-broadening coefficient are listed in Table [2](#page-5-0). n_{self} is set to 0.75 to characterize the temperature dependence of self-broadening coefficient $[51]$ $[51]$ for all transitions, since it is not included in the database.

A free-space distributed-feedback (DFB) interbandcascade laser (Nanoplus GmbH) operating near 4203.8 nm, with approximately 2.0 mW output power, serves as the monochromatic light source for the $CO₂$ sensor. The upper panel of Fig. [4](#page-5-1) shows the wavelength tuning characteristics as a function of injection current and laser temperature measured with a wavelength meter (Bristol 771B). The absorption spectrum for 5% CO₂ at $T = 1800$ K and $P = 1$ atm with 6 cm pathlength is illustrated in the lower panel of Fig. [4.](#page-5-1) As shown, the eight transitions are closely spaced and can be readily accessed with a single laser scan. Ambient absorption of 700 ppm $CO₂$ is also shown in the lower panel of Fig. [4](#page-5-1) for reference. The transitions are labelled with their relevant re-vibrational quantum notions, as *R*(*J*″). Note that H₂O and CO produce no interference within this region and are not shown in Fig. [4](#page-5-1). In a representative benchtop optical setup, ambient $CO₂$ interference cannot be neglected, making this portion of the $CO₂$ fundamental hot band challenging to use for many open-path studies.

As shown in the lower panel of Fig. [4,](#page-5-1) a weaker absorption transition *R*(78) in the hot band almost coincides with the absorption transition $R(46)$ (with a line-center spacing of merely 0.0028 cm^{-1}), making the two lines difficult to reduce individually with multi-peak Voigt lineshape ftting. Instead, the sum of the two merged transitions can be treated effectively as a combined transition at $v_{0,w}$ but with a weighted linestrength $S_w(T)$ and lower state energy E_w ". Wavenumber $v_{0,w}$ is set as 2378.8282 cm⁻¹, which is the average of the two transition centers of *R*(78) and *R*(46). The linestrength $S_w(T)$ of the resultant effective line can be expressed as Eq. ([9](#page-5-2)), with reference temperature set at T_0 =296 K.

Fig. 4 Wavelength tuning characteristics of the $CO₂$ sensor at different operating temperatures (Upper panel) and Simulated absorbance profiles for $CO₂$ ambient and typical combustion environment (Lower panel)

$$
S(T) = S(T_0) \frac{Q(T_0)}{Q(T)} \frac{T_0}{T} \exp\left[-\frac{hcE''}{k} \left(\frac{1}{T} - \frac{1}{T_0}\right)\right] \left[\frac{1 - \exp\left(-\frac{hcV_0}{kT}\right)}{1 - \exp\left(-\frac{hcV_0}{kT_0}\right)}\right],
$$
\n(9)

It is worth noting that the linestrength $S_w(T)$ of the resultant efective line from 300 to 2800 K cannot be simply depicted with fixed weighted parameters $(S_w(T)$ and E_w ") due to the combination of two lines with diferent *E*″. To accurately characterize the efective weighted multi-line parameters, the temperature dependence of the sum of linestrength of transitions $R(78)$ and $R(46)$ is fitted range-wise from 300 to 2800 K (Fig. [5\)](#page-6-0): the linestrength curve is divided into fve diferent sections and each least-squarefitted to yield one set of corresponding $S_w(T_0)$ (cm⁻² ·atm⁻¹) and E_w ["] (cm⁻¹), as listed in Table [3](#page-6-1).

Fig. 5 Sum of linestrength of the two transitions $R(78)$ and $R(46)$

Range	T(K)	$S_{\rm w}(T_0)$	$E_{\rm w}$ "
	300-600	6.63	847.8
2	601-900	5.89	894.1
\mathcal{E}	901-1300	3.84	1023.0
4	1301-1900	1.68	1243.0
5	1901-2800	0.70	1455.0

Table 3 Optimal $S_w(T_0)$ (cm^{−2} atm^{−1}) and E_w ["] (cm^{−1}) for each range

3.2 Evaluation of sensor performance on non‑uniform absorption thermometry

respectively

It has been recognized that absorption line selection plays a critical role in LAS sensor design and performance. Previous

works have been mostly targeting the relatively simple case of sensing uniform temperature or concentration distributions with two or multiple absorption transitions. Wen et al. developed a $CO₂$ sensor utilizing the R-branch bandhead near 2397 cm⁻¹ to spatially and temporally resolve temperature in counter-flow flames $[15]$ $[15]$. The CO₂ sensor captures the high temperature region well but fails to work at temperatures below 800 K due to the decreased temperature-sensitivity and weaker absorption at low temperatures. Instead of using the absorption transitions ($\Delta E_{\text{max}}^{\prime\prime} = 1892.4 \text{cm}^{-1}$) in the R-branch bandhead [[15](#page-14-10)], we extend the absorption line selection region to the low-frequency side of the 4.2 μm band ($\Delta E_{\text{max}}^{\prime\prime}$ = 2236.6 cm⁻¹). Here we evaluate the sensor performance under various non-uniform distribution conditions, i.e., diferent Boltzmann profles given in Eqs. ([7\)](#page-3-1) and ([8\)](#page-3-2). Figure [6](#page-6-2)a shows the fowchart of the sensor performance evaluation process for non-uniform absorption thermometry. Initial $T(x)$ and $X(x)$ follow prior distributions obtained from CFD simulation. Two diferent cases are demonstrated: Case 1, $C_{1,T} = 2000$ K, $C_{2,T} = 750$ K; Case 2, $C_{1,T}$ = 1804K, $C_{1,T}$ = 293K. In both cases, $C_{1,X}$, $C_{2,X}$, C_3 , C_4 are set to mole fractions of 0.0895, 0.0008 (800 ppm), and lengths of 26.0 mm, 1.40 mm, respectively.

Simulated absorbance profles can be calculated using the spectroscopic parameters from HITEMP 2010 database with initial non-uniform distributions $[T(x)]$ and $X(x)$] determined along the optical pathlength. Path-integrated absorbance profle can then be simulated according to these distributions along the optical pathlength. Integrated absorbance

area for each absorption transitions can be deduced from non-linear least-square-ftted absorbance profles. As illustrated in Fig. [6b](#page-6-2), the Voigt fttings residuals are generally within 1.0% relative for both cases. As illustrated in [[14](#page-14-34)], the relative error is mainly caused by the fact that the accumulated absorbance profle from simulation may not be accurately represented by a single Voigt profle. Furthermore, the relative residuals in case 1 is lower than case 2 due to stronger absorption from the six hot band lines at the higher temperatures in the boundary layer of case 1. Simulated annealing algorithm is utilized to obtain the optimal temperature and concentration distributions, i.e., to fnd the optimal parameters including $C_{1,T}$, $C_{2,T}$, $C_{1,X}$, $C_{2,X}$, C_3 , C_4 . The search domain for $C_{1,T}$ is limited to ± 200 K and for other fve parameters from 0 to infnity. The iterative reconstruction process of non-uniform distributions is repeated for 1000 cases with 2% random noises incorporated in the ftted integrated absorbance area.

Figure [6](#page-6-2)c, d shows the set and reconstructed average temperature distributions for the two cases, respectively. For case 1, the sensor captures the temperature distribution from 800 to 2000 K well and the maximum deviation between the set and reconstructed distributions is 30 K in the boundary layer. The average central temperature diference for case 2 is found to be within 25 K $(< 1.4\%)$ and notable disparities (-90 K) are observed in the boundary layer. This is due to the weak absorption of the selected lines at lower temperatures. Compared to the absorption lines at the *R*-branch bandhead near 2397 cm⁻¹, the selected lines at the low-frequency side in this work have higher temperature sensitivity at low temperature, making it suitable to capture the temperature transition in the boundary layer regions. Hence the advantage of using the absorption lines at the low-frequency side of the 4.2 μm band compared with the *R*-branch bandhead is verifed for prospective applications in practical combustion environments.

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4 IFBTBS method for ambient interference and blended absorption features

As shown in Fig. [4](#page-5-1), ambient $CO₂$ interference cannot be neglected, so nitrogen or inert gas purging of the exposed optical path would be desired to eliminate the interference. However, as in many practical cases, the highly limited optical access or difficulty in using pitch or catch fibers for accessing the measurement spot (e.g., with mid-IR laser), as well as real-feld conditions requiring long open paths, make purging of the entire optical path difficult or completely impractical. This makes the multi-line absorption scheme potentially attractive, as the targeted combustion and ambient section conditions along the laser beam path can be deduced directly from the LOS path-integrated measurements.

Figure [7](#page-7-0)a shows a simplified schematic of the $CO₂ LAS$ experimental setup to defne terms and symbols. The laser beam is split into two equal intensity paths (50:50) using a beam splitter, with one propagating through the fat-fame burner (diameter L_2 = 6 cm) and the other serving as the reference to eliminate ambient interference by carefully adjusting the optical length to $L_3 = L_1 - L_2$. Identical photodetectors are used in two paths and the values of L_1 and L_3 are set as 28 cm, 22 cm in the experiments, respectively. One major complication is that with ambient absorbance being strong in this band the accumulated absorption readily saturates and reaches optically thick conditions. Treatment for this problem will be detailed in Sect. [5.3](#page-10-0) in the following. The Beer–Lambert relations can be expressed as follows:

$$
I_{t1} = I_{01} \exp(-\alpha_{L_1}) = I_{01} \exp(-\alpha_{L_2} - \alpha_{L_3}),
$$
\n(10)

$$
I_{12} = I_{02} \exp(-\alpha'_{L_1}) = I_{01} \exp(-\alpha'_{L_2} - \alpha_{L_3}),
$$
\n(11)

$$
I_{t3} = I_{03} \exp(-\alpha_{L_3}), \tag{12}
$$

Fig. 7 a Schematic diagram of CO₂ LAS experimental setup. BS, beam splitter, **b** Typical measured $CO₂$ absorption raw signals at 5 mm height of a CH₄/Air flame ($\varphi = 1.0$)

where I_{01} and I_{02} denote the incident non-absorbing laser intensities of the measurement path under room and fame temperature conditions, respectively. I_{03} is the incident nonabsorbing intensity of the reference path at room temperature. Similarly, I_{11} and I_{12} are the transmitted laser intensities under room and flame temperature conditions, and I_{13} is the transmitted laser intensity of the reference path. α_{L_1} , α_{L_2} and α_{L_3} are the ambient CO_2 absorbance with optical pathlength L_1 , L_2 and L_3 , respectively. α'_i L_2 is the CO_2 absorbance in hightemperature flame with an optical pathlength of L_2 .

Figure [7](#page-7-0)b shows typical measured raw signals in a fame experiment including incident intensity I_{01} and transmitted intensities I_{11} and I_{12} at an equivalence ratio of $\varphi = 1.0$. I_{01} can be directly obtained through polynomial baseline ftting of non-absorbing portions of I_{t1} with sufficiently isolated absorption features at room temperature. On the other hand, as can be seen in Fig. [7b](#page-7-0), in the case of severe blending from the hot band absorption features at high-temperatures, it is impossible to find sufficient non-absorbing spectral regions in the measured transmitted signal I_{12} for the corresponding baseline ftting.

In our previous work $[8]$ $[8]$, it has been demonstrated that I_{01} under room temperature condition contains sufficient information on laser tuning and detection characteristics that can be used to emulate the incident non-absorbing intensity I_{02} under flame temperature conditions. More specifically, I_{01} can be scaled (for attenuation) and shifted (for background ofset correction) to closely match the measured transmitted signal I_1 ². The empirical baselines of I_{02} are obtained through non-absorbing baseline transform of I_{01} , which further serve to reduce the measured transmitted signal I_{12} to the absorbance profle. Background adjustment is conducted through orthogonal polynomial expansion and subtraction of the frst three components and modifed absorbance profle can then be obtained. More detailed illustration about the IFBTBS method can be found in [[8\]](#page-14-5). Here, based on the previously developed IFBTBS method, a new algorithm is proposed for sensitive detection of $CO₂$ with blended features in combustion gases and ambient gas absorption interference. Then integrated absorbance area for each absorption transition can be obtained from the best-ftted modifed absorbance profle with a Voigt lineshape. Boltzmann plot method follows to deduce the LOS-averaged temperature and $CO₂$ concentration with integrated absorbance area determined. Furthermore, non-uniform distribution of temperature or $CO₂$ concentration can be recovered with prior information obtained from validated CFD simulation.

Fig. 8 Typical modified absorbance profile of CO₂ at $\varphi = 1.0$ and $HAB = 9$ mm

5 Experimental results and discussion

5.1 LAS optical confguration

The mid-IR $CO₂$ sensor using blended absorption features is demonstrated in premixed $CH₄/Air laminar flat-frame$ burner. As illustrated in Fig. [7](#page-7-0)a, the incident beam from the DFB laser (4203.8 nm) is split with a CaF₂ beam splitter (Thorlabs, BSW511) to provide the measurement path (through the flat-flame burner) and the reference path (through ambient $CO₂$). A collinear visible laser is used to assist the alignment of the mid-IR laser above the burner surface with two irises (~1 mm diameter open aperture). Each laser beam is spectrally fltered with a narrow bandpass flter (Spectrogon, NB-4230–64 nm), and then focused onto the photodetector (Vigo System, PVI-3TE-6). The experiment is conducted at various HAB (5 mm, 9 mm, 13 mm) with a total air flow rate of 14.4 L/min ($\varphi = 1.0$). The flow rate of annular shroud N_2 co-flow is 10 L/min. A 100 Hz sawtooth function provided by a software-controlled function generator is used to access the eight target absorption lines with a single scan. A Ge-etalon (0.0164 cm−1 freespectral-range) is utilized to calibrate the relative wavelength tuning characteristics.

5.2 Flat‑fame measurement results and discussion under uniform conditions

Based on the previously developed IFBTBS method, a typical modifed absorbance profle of both measured and ftted $CO₂$ spectra after removal of ambient $CO₂$ interference from the reference path is shown in the upper panel of Fig. [8.](#page-8-0) The measured absorbance profle results from 100 averages of consecutive transmitted intensities at HAB=9 mm, each with an acquisition time of 10 ms. The relative fitting residuals in the lower panel of Fig. [8](#page-8-0) are all below 2.0% within the

ftted spectral range. Here we defne the signal-to-noise ratio (SNR) as the peak modifed absorbance value divided by the standard deviation of the relative residuals in Fig. [8.](#page-8-0) The SNR is 1293 at a measurement time of 1.0 s. The measured integrated absorbance area $A_{\text{mea},j}(j = 1, 2, \dots, 7)$ for each transition can be derived from Fig. [8](#page-8-0). The uncertainties of the inferred integrated area are estimated to be 0.28% and 1.4% at 95% confdence interval (CI) with non-linear leastsquare fit for the two lines in the fundamental band and five lines in the hot band, respectively.

To further investigate the advantage of multi-line thermometry over conventional two-line thermometry under uniform conditions, two diferent cases are demonstrated: Case 1, absorption thermometry with 8 lines; Case 2, absorption thermometry with a representative selection of 2 lines $(R(44): E_w'' = 772.1 \text{ cm}^{-1} \text{ and } R(77): E_w'' = 3008.7 \text{ cm}^{-1}.$ Note that the eight lines in Case 1 refer to the full set of $CO₂$ absorption transitions with two coincident lines $R(78)$ and *R*(46), as listed in Table [2](#page-5-0). In both cases, the maximum diferences in the lower-state energy *E*'' associated with the selected absorption transitions are the same. LOS-averaged temperature and $CO₂$ concentration are deduced by multiline or two-line Boltzmann plot method with the measured integrated absorbance area for each transition derived from Fig. [8](#page-8-0).

Take multi-line Boltzmann plot in Case 1 as an example, the best linear ft in the upper panel of Fig. [9](#page-9-0)a yields *T*=1543 K, X_{CO2} =5.54% at HAB=9 mm and the black point at E_w ["] = 1243.0 cm⁻¹ denotes the weighted line of *R*(78) and *R*(46), as reported in Table [3.](#page-6-1) Independent sources of uncertainty associated with multi-line Boltzmann plot include uncertainty of the reference temperature linestrength $(-2.0\%$ [[29\]](#page-14-36)), uncertainty of the integrated area $(0.28\%$ or 1.4% at 95% CI), and uncertainty of ambient $CO₂$ absorption removal from the reference path (-2.0%) . These accumulate to a combined uncertainty of LOS-averaged temperature of

Fig. 9 a Multi-line Boltzmann plot (Upper panel) for each transition (black point) and linear ft (red solid line), relative residual in the integrated absorbance area (lower panel), **b** two-line Boltzmann plot (upper panel) for each transition (black point) and linear ft (red solid line), relative residuals of the other six transitions in the integrated absorbance area (Lower panel)

24.0 K and absolute $CO₂$ concentration of 0.21% in Case 1, according to the propagation of uncertainty in the least-squares fitting of a straight line [[52\]](#page-15-6). The detection limit is defined as the noise-equivalent ppm $CO₂$ level at a given pressure and pathlength, and thus estimated to be 42.8 ppm at $T = 1543$ K, $X_{CO2} = 5.54\%$. Similarly, in Case 2, the best linear fit in the upper panel of Fig. [9b](#page-9-0) gives $T = 1558$ K, $X_{C₁}$ = 5.76% at HAB = 9 mm, with an uncertainty of LOSaveraged temperature to 36.7 K and absolute $CO₂$ concentration of 0.33%.

Fitted integrated absorbance area $A_{\text{fit},j}^{\text{Uni}}(j = 1, 2, \dots, 7)$ for each transition can be determined using the linear-ftted ordinate values determined by multi-line or two-line Boltzmann plot method under uniform conditions. The relative residual, ϵ_A^{Uni} , in the integrated absorbance area for each transition in two cases, can be defned as:

$$
\varepsilon_{A,j}^{\text{Uni}} = \frac{A_{\text{mea},j} - A_{\text{fit},j}^{\text{Uni}}}{A_{\text{mea},j}}, j = 1, 2, \cdots, 7,
$$
\n(13)

The sum of squared relative residual, $\varepsilon_{A,\text{sum}}^{\text{Uni}}$, is expressed as Eq. [\(14](#page-9-1)) and this is consistent with the criteria in nonuniform reconstruction, as described in Eq. [\(6](#page-3-3)):

$$
\varepsilon_{A,\text{sum}}^{\text{Uni}} = \sum_{j=1}^{7} \left| \varepsilon_{A,j}^{\text{Uni}} \right|^2 \tag{14}
$$

The lower panel of Fig. [9a](#page-9-0) shows the value of $\varepsilon_A^{\text{Uni}}$ in Case 1. Uncertainty of $\varepsilon_{A,j}^{\text{Uni}}$ for each transition is estimated from the evaluation of both $A_{\text{me}aj}$ and $A_{\text{fit},j}^{\text{Uni}}$, and magnified 10 times for better visualization. It is obvious that the relative residuals of the two lines (E_w ″=772.1 cm⁻¹, 1243.0 cm⁻¹) in the fundamental band are signifcantly lower than those of the fve lines in the hot bands. It can be mathematically interpreted that the two relatively discrete points at low E_w ["] values could dominate in linear least-squares regression

compared to the five tightly spaced points at large E_w ["] values. The mean absolute residual in percent for 8 lines is 1.61% and sum of squared relative residual is 30.2×10^{-4} in Case 1. In Case 2, the relative residuals of the 2 lines (*R*(44): E_w "=772.1 cm⁻¹ and *R*(77): E_w "=3008.7 cm⁻¹) are zero in two-line linear fit and not shown in the lower panel of Fig. [9](#page-9-0)b. The mean absolute residual in percent for other 5 lines is 2.25% and sum of squared relative residual is 53.2×10^{-4} in Case 2. Overall, under uniform conditions, multi-line thermometry (Case 1) outperforms conventional two-line thermometry (Case 2) in both measured uncertainty and relative residual. More detailed comparisons between two cases at $HAB = 5$ mm, 13 mm are summarized in Table [4](#page-10-1) (see Sect. [5.3](#page-10-0)) and will be discussed later.

5.3 Flat‑fame measurement results and discussion in non‑uniform reconstructions

Non-uniform absorption thermometry with Boltzmann profle-ftting strategy is demonstrated for temperature and $CO₂$ concentration reconstructions of the studied laminar premixed flame. Under uniform conditions, ambient $CO₂$ with optical pathlength L_3 (22 cm) is assumed to be uniform and subtracted through the reference path. However, for nonuniform reconstruction, width of the fame region including the thermal boundary layer is extended to 8 cm, which has been verifed in our previous studies [\[12](#page-14-9), [13\]](#page-14-35). Correspondingly, 20 cm optical pathlength in the ambient surrounding is assumed to be uniform and subtracted through the reference path before non-uniform reconstruction.

As illustrated in Sect. [3.2](#page-6-3), SA algorithm is utilized to obtain the optimal temperature and concentration distributions, i.e., to fnd the optimal Boltzmann-profle parameters including $C_{1,T}$, $C_{2,T}$, $C_{1,X}$, $C_{2,X}$, C_3 , C_4 . It is worth noting that the performance of SA algorithm strongly depends on a

number of critical factors including the starting temperature T_{st} , cooling schedule, initial parameter values and the search domain for the parameters, i.e., lower and upper bounds. Previous works showed that SA algorithm with a sufficiently high T_{st} and a slow cooling schedule would be preferred to ensure a satisfactory solution [[53,](#page-15-7) [54](#page-15-8)]. To further decrease the complexity of the non-uniform iterative reconstructions, $C_{2,T}$ is set to 293 K, while $C_{2,X}$ is estimated to be 780 ppm. This has been repeatedly verifed using LAS technique under room temperature conditions with the same experimental optical configuration before the flat-flame experiments, and the standard deviation of ambient $CO₂$ measurement is 8.0 ppm in 1.0 s. It is worth emphasizing that $CO₂$ is more stable than $H₂O$ in the ambient surroundings, making the developed mid-IR $CO₂$ sensor more accurate in ambient background subtraction than the previously reported near-IR $H₂O$ sensor [[11](#page-14-8)]. CFD simulation is performed for comparison with the non-uniform characterization of the LAS measurement. As has been discussed in Sect. 2, parameters involved in multi-line Boltzmann profle-ftting strategies can be constrained to a reasonably limited range from CFD simulation. However, as a probabilistic and metaheuristic method, SA algorithm can be easily stuck in the local minima or lower/upper bounds with an excessively limited search domain for the parameters, i.e., over-saturated prior information. Moreover, such prior information is not always available in practical combustion environments. Here, in this work, the search domain for other four parameters including $C_{1,T}$, $C_{1,X}$, C_3 , C_4 , are within $\pm 50\%$ of typical Boltzmann-profle parameter values shown in Table [1](#page-4-1). Such broad search domain has been verifed to ensure robust and repeatable reconstructions for both cases. The initial values for other four Boltzmann-profle parameters are randomly generated in the search domain at each iteration.

Cond	R(73)	R(74)	R(44)	R(75)	R(76)	R(77)	R(46), R(78)	$\varepsilon_{A,\text{sum}}(\times 10^{-4})$	
Uniform, 8 lines	1.22	1.82	0.21	0.38	3.58	2.36	0.33	23.50	
Uniform, 2 lines	3.39	0.35	$-*$	1.89	6.01	—-*	0.01	51.35	
Non-uniform, 8 lines	1.99	0.60	6.54	1.75	4.41	2.36	1.51	77.41	
Non-uniform, 2 lines	0.51	2.64	3.10	4.91	2.20	5.50	1.75	79.15	
Uniform, 8 lines	1.42	2.09	0.09	1.28	4.21	2.10	0.09	30.19	
Uniform, 2 lines	3.38	0.14	$-*$	0.73	6.39	$-*$	0.60	53.22	
Non-uniform, 8 lines	1.99	1.62	4.26	0.85	7.40	1.39	1.88	85.63	
Non-uniform, 2 lines	2.92	6.37	1.63	5.65	2.18	3.56	1.34	102.9	
Uniform, 8 lines	1.83	2.34	0.12	2.10	4.71	1.93	0.14	39.18	
Uniform, 2 lines		0.57	$-*$	0.27	6.72	$-*$	0.64	59.18	
Non-uniform, 8 lines	0.01	4.10	1.80	3.80	5.75	0.35	0.47	68.00	
Non-uniform, 2 lines	2.21	6.24	0.33	5.94	3.39	2.60	2.13	102.0	
		3.63							

Table 4 Absolute relative residuals expressed in percentiles for each transition, $\left| \epsilon_A^{\text{Uni}} \right|$ and $\left| \epsilon_A^{\text{Non-uni}} \right|$, as well as $\epsilon_{A, \text{sum}}$ ($\times 10^{-4}$) at various HABs

–*Relative residuals of two lines (*R*(44) and *R*(77)) are zero in two-line linear ft and not shown in Table [4](#page-10-1)

For each set of six Boltzmann-profle parameters, temperature and concentration distributions can be calculated. The corresponding $S_w(T_0)$, E_w'' of the resultant effective line can then be determined at each discrete temperature value according to Table [3.](#page-6-1) Same non-uniform reconstruction process is repeated for the two cases in Sect. [5.2](#page-8-1) to further investigate the sensor performance with multi-line and twoline absorption thermometry. The starting temperature in SA algorithm is set to 1000 K, followed by a Boltzmanndistribution cooling schedule in both cases [[53](#page-15-7)]. Figure [10](#page-11-0) presents the measured and simulated radial distributions of temperature and $CO₂$ concentrations at $HAB = 9$ mm in Case 1 and 2. Uncertainty of CFD simulation result is determined by introducing 2% variation in the inlet boundary conditions of the fat-fame burner. Two major sources of error can contribute to the aggregated uncertainty of non-uniform LAS measurement for two cases: lineshape ftting error in obtaining the measured integrated absorbance, which has been estimated at 95% CI from the non-linear least-square ft of the integrated area for each absorption line, and uncertainty of high-temperature spectroscopic parameter, *S*(*T*), which is estimated to be about 5%. The iterative reconstruction process of non-uniform distributions is repeated for 1000 cases with random noises of the given level incorporated in the integrated area and *S*(*T*). The uncertainties of non-uniform temperature and $CO₂$ concentration in LAS measurements for two cases are estimated from the 1000 realizations.

As directly observed from Fig. [10](#page-11-0), the fame temperature and $CO₂$ concentration by LAS measurement in the central uniform region for Case 1 and 2 is in excellent agreement with the CFD simulation at HAB=9 mm. Certain degree of discrepancy between LAS measurement and CFD simulation is observed in the thermal boundary layer region due to pronounced mixing with the ambient surroundings, and such deviation within the boundary layer region becomes more signifcant in Case 2 than that in Case 1. With multiple absorption lines in the non-uniform reconstruction, the radial position of boundary layer can be captured more accurately than that with only two lines selected at HAB=9 mm. It indicates that using the full set of selected $CO₂$ absorption lines exhibits superior performance in non-uniform reconstruction over conventional two-line absorption thermometry. The same performance holds for the non-uniform reconstruction at HAB=5 mm, 13 mm.

Similarly, fitted integrated absorbance area $A_{\text{fit},j}^{\text{Non-uni}}(j=1,2,\cdots,7)$ for each transition can be determined from optimal non-uniform reconstruction conditions. The relative residual, $\varepsilon_A^{\text{Non-uni}}$, in the integrated absorbance area for each transition, and the sum of squared relative residual, $\varepsilon_{A,\text{sum}}^{\text{Non-uni}}$, are defined in the same way as in Eqs. ([13\)](#page-9-2) and ([14](#page-9-1)), respectively. The absolute relative residuals, $\left| \epsilon_A^{\text{Uni}} \right|$ and $\left| \epsilon_A^{\text{Non-uni}} \right|$ for each transition, as well as $\epsilon_{A,\text{sum}}$ at various HAB | | (5 mm, 9 mm, and 13 mm) are summarized in Table [4.](#page-10-1)

As illustrated in Table [4,](#page-10-1) several key conclusions are worth highlighting:

- 1. Under uniform conditions: two lines $(E_w'' = 772.1 \text{ cm}^{-1})$, 1243.0 cm⁻¹) in the fundamental band present lower relative residuals than those of other fve lines in the hot bands at HAB=5 mm, 13 mm in Case 1. This is consistent with the results at $HAB = 9$ mm as discussed in Sect. [5.2.](#page-8-1) The sums of squared relative residual in Case 1 (8 lines) are lower than those in Case 2 (2 lines) at various HAB in uniform conditions.
- 2. For non-uniform reconstructions: the residual distribution for $CO₂$ transitions in the two cases becomes complex and irregular. As shown under uniform conditions, the sums of squared relative residual in Case 1 (8 lines) are lower than those in Case 2 (2 lines) at various HAB in non-uniform reconstructions.
- 3. Non-uniform reconstruction results present slightly larger residuals in Case 1 and 2 compared to those in uniform conditions at various HAB. The reason could lie in two aspects: increased uncertainty of high-temperature spectroscopic parameters, e.g., *S*(*T*) and line profles, can impair accurately characterization of the non-uniform distribution; on the other hand, due to limited tunability of a single DFB laser, only two groups of transitions with E_w ["] centered around 770 cm⁻¹ and

Fig. 10 Radial temperature (**a**) and concentrations (**b**) distribution at HAB=9 mm. Black solid lines: CFD simulation; Red dash lines: Case 1, 8 lines; Blue dash dot lines: Case 2, 2 lines

Fig. 11 Central and LOS-averaged fame temperature (left panel) and CO₂ concentration (right panel) along the HAB at $\varphi = 1.0$ from LAS measurement (Case 1) and CFD simulation

2800 cm⁻¹ can be accessed. The performance in nonuniform reconstruction with the selected group of lines is difficult to be further improved significantly.

In summary, it is verifed that multi-line thermometry shows its advantages over conventional two-line thermometry under uniform and non-uniform conditions. It is also proved that with more absorption features and broader E_w ["] span, the performance of non-uniform reconstruction will improve. However, it is yet still an open question to determine optimal absorption line selection in non-uniform reconstruction problems and more detailed discussions could be found in Ref. [[18\]](#page-14-13) and [\[19](#page-14-14)].

For more illustrative quantitative comparison of the results, Fig. [11](#page-12-0) shows (with closed symbols) the axial fame temperature and CO_2 concentration at $\varphi = 1.0$ in LAS measurement for Case 1. The central fame temperature and $CO₂$ concentration of CFD simulation also generally agree with LAS measurement at HAB=5 mm, 13 mm. The fame temperature tends to decrease with the increase of HAB for both LAS measurement and CFD simulation, and this can be attributed to the enhanced radiative heat loss to the surroundings. The $CO₂$ concentration remains almost unchanged at the HAB from 5 to 13 mm. The average central temperature diference between LAS measurement and CFD simulation is found to be within 20.0 K $\ll 1.1\%$ relative) and the CO_2 concentration difference is within 700 ppm (<1.0%) relative). On the other hand, as shown by the open symbols, due to the discrepancy observed in the thermal boundary layer shown in Fig. [10](#page-11-0), much larger discrepancies in the LOS-averaged temperature and concentration are observed between the LAS measurement and CFD.

5.4 LAS under optically thick conditions

Optically thick conditions (optical density >1.0) are usually associated with high absorber number density, long optical pathlength and strong absorption linestrength [[55,](#page-15-9) [56](#page-15-10)]. While increasing demands for highly sensitive measurements in real-feld combustion environments have led to a pressing need for mid-IR absorption sensors, this essentially reduces the dynamic range of the transmission signal, with the upper limits of absorbance constrained by optically opaque conditions at the strong transition peaks. As illustrated in Fig. [4](#page-5-1), even at a relatively short pathlength associated with the benchtop optical setup, $CO₂$ absorption in the fundamental band can be optically thick. Due to the large absorbance of the two low- E'' lines ($R(44)$, $R(46)$), pronounced mixing and interaction of hot $CO₂$ to the ambient surroundings near the fame boundary region can lead to further enhanced saturation in absorption. In addition, ambient $CO₂$ interference is unavoidable and the path-integrated absorption readily saturates.

Figure [12a](#page-13-0) shows a single-scan raw transmitted signal (black solid line) at HAB of 5 mm, $\varphi = 1.0$, and a measurement pathlength of \sim 53 cm. The instantaneous transmitted intensity reaches optically thick condition due to increased optical pathlength (from 28 to 53 cm) and fame instabilities even with the relatively stable McKenna burner. The transmission path becomes opaque with transmitted intensity reaching zero within random noise bounds at the two $CO₂$ fundamental transition peaks, as shown in the enlarged insets of Fig. [12](#page-13-0)a. This renders non-physical values of absorbance near the absorption line peaks, but with appropriate spectral reduction algorithm the integrated absorbance area for each absorption transition can still be estimated from evaluation of the absorption profle wings. To further extend the applicability of the developed sensing strategy to more practical combustion studies, data reduction schemes for LAS measurement under optically thick conditions is discussed in the following. Figure [12](#page-13-0)b presents the measured absorbance profle derived from Fig. [12](#page-13-0)a, together with non-linear least-square fts to the truncated lineshape region. The relative residuals are within 2.0% and is on similar level with the full absorbance profile fit in Fig. $12a$. As such, the $CO₂$ absorption sensor developed here could be further extended to more practical combustion studies, e.g., in open long-path environments with ambient interference. However, the level of saturation in absorption will afect the accuracy of the proposed spectrum reduction algorithm, as only incomplete spectral profiles are used for Voigt fit. This effect becomes more pronounced especially with blended absorption features, as illustrated in Fig. [12a](#page-13-0), but is not the main focus of this work. In conclusion, the developed data processing approach allows implementation in other measurement scenarios, where large dynamic range in the targeted measurand **Fig. 12 a** Instantaneous measured $CO₂$ absorption raw signal at $\varphi = 1.0$ and $HAB = 5$ mm under optically thick condition, **b** Typical modifed absorbance profile of $CO₂$ at $T = 1553$ K, $X_{CO2} = 6.0\%$

is desired. Further demonstration is underway to investigate the performance of this mid-IR $CO₂$ sensor in more practical and harsh combustion environments.

6 Conclusions

A mid-IR $CO₂$ sensor with blended absorption features for non-uniform temperature and concentration of laminar premixed fame is developed. In general, precise LAS sensors desire selection of well-isolated absorption lines that are preferably free from blended hot bands. However, in complicated, practical combustion environments, the target absorption feature is usually inevitably spoiled by blended spectral features, ambient interference or optically thick conditions. Moreover, traditional two-line absorption thermometry provides LOS-averaged gas property measurements. Therefore, more accurate and quantitative spatially-resolved temperature or species concentration distribution measurement with single-LOS, multi-line absorption spectroscopy, can contribute to deeper understanding of complex combustion environments, and is still pressingly pursued.

The mid-IR $CO₂$ sensor presented here exhibits several important characteristics compared with previous LAS sensors: (1) The blended $CO₂$ absorption spectra with ambient self-interference can be well interpreted using IFBTBS method in high-temperature combustion environments. This is not only important for the extreme conditions associated with combustion, but also useful for exploiting novel laser sources with large spectral bandwidth for combustionrelated spectroscopic studies; (2) The single-beam, multiline absorption thermometry harnessing both molecular fundamental and hot bands, opens up new opportunity to retrieve spatially-resolved gas property distributions along the laser beam path with a single laser. This would further simplify the design of the absorption sensor and optical confguration in LAS measurements, making it preferable for complicated sensing needs. However, it is worth noting that the sensor developed here aims at a more challenging and difficult situation, where ambient $CO₂$, blended absorption spectra both exist. This is the frst time, to the best of our knowledge, that a CO_2 absorption sensor near 2380 cm⁻¹ targeting a group of blended hot band lines and strongly interfering ambient lines is developed. The demonstrated methodology in this work can be extended to diferent target mixtures using diferent portions of the spectra.

 $CO₂$ absorption sensor covering eight absorption transitions between 2377.2 and 2379.0 cm−1 is demonstrated in a laminar premixed CH₄/Air flat flame at $\varphi = 1.0$. Two cases are demonstrated, i.e., Case 1, absorption thermometry with 8 lines; Case 2, absorption thermometry with 2 lines (*R*(44): E_w ["] = 772.1 cm⁻¹ and *R*(77): 3008.7 cm⁻¹), to further investigate the advantage of multi-line thermometry over conventional two-line thermometry under uniform and non-uniform conditions. It is shown that the LOS-averaged temperature can be determined with a precision of 24.0 K and the uncertainty of $CO₂$ concentration measurement is 0.21% in Case 1. The average signal-to-noise ratio is 1293 at a measurement time of 1.0 s, and the detection limit for $CO₂$ is estimated to be 42.8 ppm at 1543 K with 6 cm pathlength. The results show that under uniform conditions, multi-line thermometry (8 lines) outperforms conventional two-line thermometry in both measured uncertainty and relative residual. CFD simulation with reduced GRI 1.2 mechanism

is performed for comparison. The CFD simulation for central flame zone temperature and $CO₂$ concentration are in good agreement with the LAS measurement in two cases. Moreover, with multiple absorption lines in the non-uniform reconstruction, the radial position of boundary layer can be captured more accurately than that with only two lines selected at HAB = 9 mm. Difference between the LAS measurement and CFD simulation is found to be within 20.0 K $\approx 1.1\%$ relative) for temperature and 700 ppm $\approx 1.0\%$ relative) for $CO₂$ concentration. Small discrepancy is observed near the fame boundary region due to pronounced mixing and interaction of hot $CO₂$ with the ambient surroundings.

The novelties of this work are highlighted as follows: (1) A new CO₂ absorption sensor near 2380 cm⁻¹ is developed, with strong line strength and high temperature sensitivity, and free of spectral interference from H_2O and CO ; (2) A new algorithm for interpreting absorption spectra with signifcantly blended features is proposed, combining IFBTBS method and single-line-of-sight multi-transition absorption thermometry at high-temperature combustion environments. In addition, the sum of the two merged transitions is treated efectively as a combined transition with a weighted linestrength $S_w(T)$ and lower-state energy E_w'' . This opens up new opportunity for LAS sensor design with more fexible absorption line selection; (3) Spatially-resolved temperature and $CO₂$ concentration distributions of $CH₄/Air$ premixed fame is investigated, involving demonstrations from both LAS measurement and CFD simulation. The sensor developed here can serve to guide more general LAS sensor design with blended absorption features, ambient interference, or under optically thick conditions, and can be useful for various practical combustion studies (shock tube flows, practical combustor fames, etc.).

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