



# Essential role of B metal species in perovskite type catalyst structure and activity on toluene oxidation

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## Abstract

The perovskite type materials with transition metals are getting more attention especially as catalysts in total oxidation reaction. This work explores the B metal effect on the catalytic activity of LaBO<sub>3</sub> structured perovskites in total oxidation of toluene. The perovskite type oxides were obtained by Pechini method and characterized by X-ray diffraction, nitrogen adsorption/desorption isotherms, thermogravimetric analysis and differential scanning calorimetry, temperature-programmed reduction (H<sub>2</sub>-TPR), Raman spectroscopy, Fourier transform infrared spectroscopy and particle size analysis. The results showed that LaFeO<sub>3</sub> catalyst contained a single orthorhombic LaFeO<sub>3</sub> phase, while LaMnO<sub>3</sub> contained LaMn<sub>2</sub>O<sub>5</sub> species besides cubic LaMnO<sub>3</sub> phase. Both catalysts show very narrow distributions and average values of 55.59 µm and 51.43 µm for LaMnO<sub>3</sub> and LaFeO<sub>3</sub>, respectively. With regard to the H<sub>2</sub>-TPR profile for the LaMnO<sub>3</sub>, Mn<sup>4+</sup> to Mn<sup>3+</sup> reduction and Mn<sup>3+</sup> to Mn<sup>2+</sup> reduction. Consequently, the redox performance of ABO<sub>3</sub> perovskites was found as mainly driven by the B-site transition-metal element character. According to the catalytic tests, the LaMnO<sub>3</sub> catalyst was more active for toluene oxidation than LaFeO<sub>3</sub> and achieved the lowest light-off temperatures. An excellent agreement between the experimental data and the proposed one-dimensional pseudo-homogeneous model was achieved and corresponding kinetic parameters (estimated rate constants, *k*, activation energies, *E<sub>A</sub>*, and frequency factors, *A<sub>p</sub>*) were estimated. Lower activation energy was estimated for LaMnO<sub>3</sub> catalyst (84 kJ mol<sup>-1</sup> vs. 99 kJ mol<sup>-1</sup> for LaFeO<sub>3</sub>) confirming that LaMnO<sub>3</sub> catalyst was more active for toluene oxidation under reaction conditions presented in this paper.

**Keywords** Perovskite · B metal effect · Volatile organic chemicals oxidation · Toluene oxidation

## Introduction

Attention to environmental pollutants due to its destructive effects on human health has grown significantly in recent years (Ensafi and Karimi-Maleh 2010; Karimi-Maleh et al. 2019). Pollution due to volatile organic compounds (VOCs) is becoming an increasingly serious problem worldwide since VOCs are a group of carbon comprising compounds that disappear at room temperature are described as carcinogenic, mutagenic and teratogenic to humankind (Liu et al. 2013; Pham and Lee 2015). VOCs are commonly present in both indoor and outdoor atmospheres since originating from natural emissions and anthropogenic sources such as motor vehicle exhausts and solvent usage. They also appear in biogas as a result of the anaerobic digestion of organic waste (Paparello et al. 2012). As a result of strict regulations related to VOC emissions, VOC removal from flue gas streams is a relevant research area. Toluene is a typical aromatic VOC (Wu et al. 2016) and the main approaches

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utilized in toluene removal from waste gases consist of adsorption, thermal incineration and catalytic oxidation (Liu et al. 2013).

Catalytic oxidation process is considered as an effective, economic and environmentally agreeable way of overcoming air pollution (Liu et al. 2013, 2017). Due to the complex molecular structure of VOCs, high temperatures above 673 K are required for their thermal incineration, but in the presence of a suitable catalyst the operating temperature can be significantly lower (Kim et al. 2017). The optimization of the desired catalytic material is a tough issue because of the great variety of VOCs and the VOC-containing mixtures complexity. Besides favouring low ignition temperatures, highly selective catalysts yielding with complete VOC breakdown to CO<sub>2</sub> and H<sub>2</sub>O are desired. Also, long lifetime and thermal stability are expected as a characteristic of a good catalyst (Sihaib et al. 2017).

Noble metal-based catalysts, including Pd and/or Pt especially, have been intensively utilised in case of VOCs catalytic oxidation (Abdelouhab-Reddam et al. 2015; Huang et al. 2015). Nevertheless, these catalysts are known for being expensive as well as sensitive to the poisoning. As a result, transition-metal oxides are accepted as promising alternatives in terms of poisoning and cost advantages (Chen et al. 2014; Wang et al. 2017).

Perovskite type materials are famous for having flexible composition, superior thermal and hydrothermal stability, excellent redox properties and affordability in comparison with noble metal catalysts. Perovskite chemical formula ABO<sub>3</sub> allows modifying cations in either A- and/or B- position (Ding et al. 2017). In a classic structure, a lanthanide or alkaline-earth cation can be employed as A cation, while B cation which controls the catalytic activity is transition-metal element (Zhang et al. 2016; Li et al. 2017). Though perovskites are very well-known for their cubic structure, some other structures like rhombohedral and orthorhombic are probable synthesis outcomes. In cubic structure, coordination numbers of oxygen anions are 12 and 6 for A and B cation, respectively. (Zhang et al. 2016). A and O arrange a cubic nearby packing and B is exhibited in the octahedral voids in this structure. In order to obtain a perovskite crystal structure, the tolerance factor *t* which can be calculated from Eq. 1 below should meet the criteria including 0.8 < *t* < 1.0, *r*<sub>A</sub> > 0.090 nm, *r*<sub>B</sub> > 0.051 nm (Tanaka and Misono 2001).

$$t = (r_A + r_B) / \sqrt{2}(r_B + r_O) \quad (1)$$

Perovskites and mesoporous perovskites are employed in the toluene catalytic oxidation (Wang et al. 2016; Zonouz et al. 2016; Sihaib et al. 2017). Wang et al. produced LaMnO<sub>3</sub> nano-catalysts for toluene oxidation and these catalysts were found to yield an activation energy (*E*<sub>A</sub>) of 54.3 kJ mol<sup>-1</sup> similar to catalysts containing noble

metal (Wang et al. 2016). Sihaib et al. (Sihaib et al. 2017) investigated the activity of four manganese-based oxides including a LaMnO<sub>3</sub> prepared by sol-gel method; a Mn<sub>2</sub>O<sub>3</sub> prepared by rapid method and octahedral molecular sieve (OMS-2) by two different preparation methods such as solid-state method (OMSs) and hydrothermal method (OMS<sub>h</sub>). As a result, the catalyst performance followed the order: OMSs > OMS<sub>h</sub> > Mn<sub>2</sub>O<sub>3</sub> > LaMnO<sub>3</sub>. A comparison of these catalysts revealed that OMS<sub>s</sub> were more active even at low temperature starting to convert toluene at about 443 K, while in the case of Pd/Al<sub>2</sub>O<sub>3</sub> conversion started at about 463 K (Sihaib et al. 2017). Zonouz et al. (Zonouz et al. 2016) studied La<sub>1-x</sub>Ce<sub>x</sub>Mn<sub>1-y</sub>Cu<sub>y</sub>O<sub>3</sub> as potential catalysts for toluene oxidation. According to hybrid artificial neural network-genetic algorithm method modelling and optimization results, the optimum composition of La<sub>1-x</sub>Ce<sub>x</sub>Mn<sub>1-y</sub>Cu<sub>y</sub>O<sub>3</sub> was found at *x* = 0.30, *y* = 0.52 and calcination temperature of 898 K. The optimum conversion was obtained 513 K as 92.16% (Zonouz et al. 2016).

Though Mn-based perovskites are extensively investigated, iron-based perovskites are not often used in VOCs oxidation. On the other hands, some studies have been conducted concerning the application of mesoporous materials as good supports or templates for perovskite catalysts providing an increase in the specific surface area. Gao et al. (2013) evaluated mesoporous LaFeO<sub>3</sub> catalysts for complete oxidation of CO and toluene. High catalytic activity obtained was attributed to the large surface area, high adsorbed oxygen concentration and low-temperature reducibility.

In this work, catalytic properties of two perovskite catalysts (LaFeO<sub>3</sub> and LaMnO<sub>3</sub>) in the catalytic oxidation of toluene were investigated and compared. In our previous research, Mn and Fe proved to be effective components of a mixed metal oxide such as MnFeO<sub>x</sub> (Duplančić et al. 2017). Therefore, utilization of Mn and Fe as potential B cations in the perovskites was evaluated in this study.

## Matherislas and methods

### Materials

Lanthanum (III) nitrate hexahydrate (%99, ABCR), iron (III) nitrate nonahydrate (≥ 99.95%, Sigma-Aldrich), manganese (II) nitrate hexahydrate (For analysis, Acros) and citric acid monohydrate (Carlo Erba) were used in catalyst preparation step. All aqueous solutions were prepared with deionized water.

### Catalyst preparation

The catalysts were prepared via Pechini (citrate) technique (Ghiasi and Malekzadeh 2014). Briefly, La(NO<sub>3</sub>)<sub>3</sub>·6H<sub>2</sub>O,

$\text{Fe}(\text{NO}_3)_3 \cdot 9\text{H}_2\text{O}$ ,  $\text{Mn}(\text{NO}_3)_2 \cdot 3\text{H}_2\text{O}$  and citric acid monohydrate were used as precursors. All chemicals were of analytical grade. At first, calculated amounts of metal nitrate and citric acid were mixed until dissolved. Then, the homogeneous solution was evaporated at 338 K overnight. The swelled material was crushed in an agate mortar and put in a vacuum oven which was set to 353 K and 7000 Pa. The material was crushed every hour and maintained in the vacuum oven overnight. The oven was set to 373 K and 7000 Pa for a day. Finally, the solid obtained was calcinated at 1023 K with  $10 \text{ K min}^{-1}$  for 5 h under dry air in a quartz tubular reactor.

### Catalyst characterization

Morphology of the catalysts was obtained from scanning electron microscope (SEM-Zeiss Auriga). XRD patterns of the catalysts were obtained with a Bruker D8 Advance XRD with  $\text{CuK}\alpha$  radiation between  $10^\circ$  and  $120^\circ 2\theta$  in a step scan mode with  $0.02^\circ$  steps and 0.6 s counting time. FT-IR spectra were recorded between 4000 and  $700 \text{ cm}^{-1}$  at a resolution of  $4 \text{ cm}^{-1}$  using PerkinElmer Spectrum One at room temperature. Textural parameters of the catalysts were determined by nitrogen adsorption/desorption isotherms on a TriStar II 3020 (micromeritics). Degassification of the samples was accomplished by first keeping them at 363 K for 1 h and then at 523 K for 4 h, at least, under nitrogen flow. Brunauer–Emmett–Teller (BET) method was used to calculate surface area in the relative pressure ( $P/P_0$ ) range of 0.05–0.30 and Barrett–Joyner–Halenda (BJH) method was applied to the desorption isotherm to measure pore average size and volume. Temperature-programmed reduction ( $\text{H}_2$ -TPR) spectra were analysed on an AutoChem HP 2950 (Micromeritics) equipped with a thermal conductivity detector (TCD). About 90 mg of catalyst was used for each run. Prior to  $\text{H}_2$ -TPR, the sample was oxidized by treating it with  $50 \text{ NmL min}^{-1}$  of 10 vol%  $\text{O}_2/\text{He}$ , heated up from ambient temperature to 773 K, using a ramp of  $10 \text{ K min}^{-1}$  and with a hold of 30 min at that temperature. After the hold time, a flow of  $50 \text{ NmL min}^{-1}$  helium was used to flush the sample and it was cooled down to 308 K with a ramp of  $10 \text{ K min}^{-1}$ . Then, the sample was treated with 12 vol%  $\text{H}_2/\text{Ar}$  at a flow of  $50 \text{ NmL min}^{-1}$  in the temperature range from 308 to 1273 K, with a heating ramp of  $5 \text{ K min}^{-1}$  and a final hold time of 30 min. Thermogravimetric analysis with differential scanning calorimetry (TGA–DSC) of the samples was carried out on a Sensys Evo TG-DSC thermal analyser (Setaram). Fresh catalyst samples of 15–30 mg were heated up from ambient temperature to 1073 K, with a heating rate of  $10 \text{ K min}^{-1}$ , with a flow of  $50 \text{ NmL min}^{-1}$  of synthetic air. The same procedure was repeated but using an inert gas (i.e. argon) instead of synthetic air to elucidate the effect of temperature. Particle size distribution and average

particle size of the catalysts were determined using a Mastersizer 2000 laser scattering unit using a LED type blue-lighted laser (466 nm beam wavelength) coupled with a Hydro 2000G dispersion unit (Malvern Instruments) with water as the dispersant agent.

### Catalytic activity evaluation

Catalytic oxidation of toluene as a model VOC pollutant was carried out in an integral up-flow fixed-bed reactor operated in the temperature range of 373–573 K, at different space times and at atmospheric pressure. Scheme of the experimental system can be found elsewhere (Duplančić et al. 2018, 2020). The space times were studied by varying the total flow rate of the reaction mixture ( $23\text{--}138 \text{ cm}^3 \text{ min}^{-1}$ ) at the fixed catalyst mass (0.05 g). Toluene oxidation was performed at a constant inlet toluene concentration in the reaction mixture (210 ppm toluene in nitrogen) and at a constant ratio of toluene/nitrogen and oxidant (air). The gas flow rates were regulated using two mass flow controllers (Brooks). The reactor temperature was regulated using a thermo-controller (TC208 Series) connected to a K-type thermocouple placed inside the reactor and using the heaters around the reactor. The reactor effluent was analysed by *on-line* gas chromatograph (Shimadzu GC-2014) equipped with a Carbowax 20 M column and with a flame ionization detector (FID). The activity of perovskites for toluene oxidation was evaluated by conversion of toluene at steady-state reaction conditions.

### Fixed-bed reactor modelling

In order to describe the reactor steady-state behaviour under isothermal conditions and to compare activities of the prepared perovskite catalysts simple pseudo-homogeneous one-dimensional (1D) model of the fixed-bed reactor which neglects inter- and intra-phase diffusion was applied (Duplančić et al. 2018). Additional assumptions were considered, such as flat radial velocity profiles (plug flow of the fluid phase) and constant catalyst activity. Due to the large excess of oxidant, the toluene oxidation was described with first-order kinetic model. The corresponding model equations and numerical methods used for their solution may be found elsewhere (Sihai et al. 2017; Duplančić et al. 2018).



## Results and discussion

### Physico–chemical properties of the prepared perovskites

#### XRD results

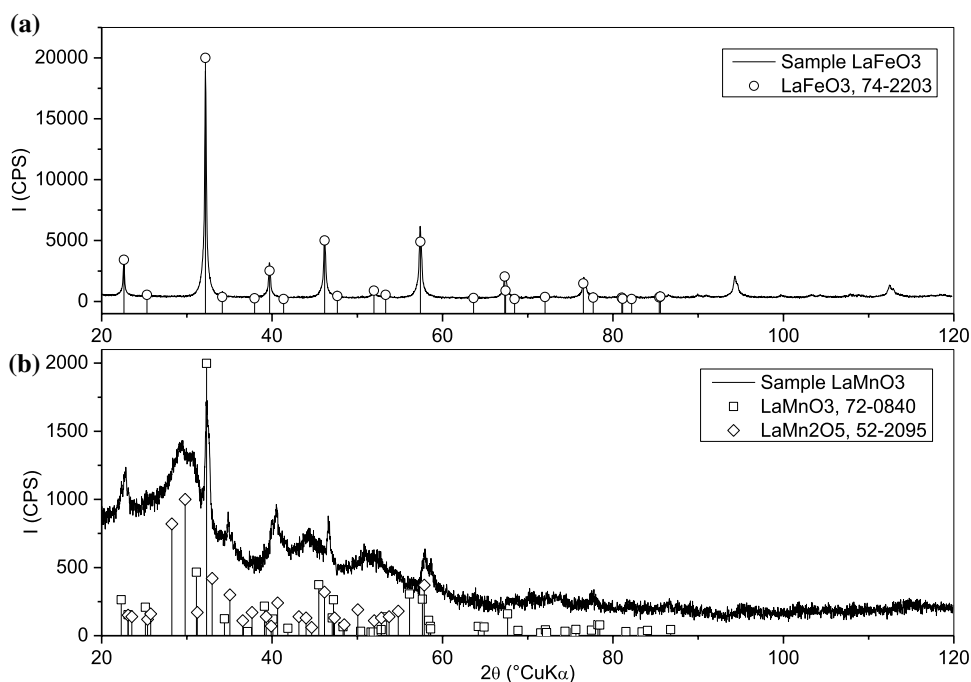
The crystal structure of the catalysts was analyzed via XRD analysis and results are given in Fig. 1. The presence of a single LaFeO<sub>3</sub> perovskite phase (orthorhombic; Pbnm space group, ICDD PDF #74-2203) was evident from the presence of diffraction peaks characteristic for this phase. Most prominent diffraction peaks are assigned to crystallographic planes as follows: 22.61°2θ (002) and (110), 32.17°2θ (112) and (220), 39.7°2θ (002) and (200), 46.16°2θ (004) and (220), 57.41°2θ (204) and (312), 67.3°2θ (040) and (224). No additional peaks revealing the presence of a second phase were apparent. On the other hands, LaMnO<sub>3</sub> catalyst showed LaMnO<sub>3</sub> cubic phase (Pm $\bar{3}$ m space group, ICDD PDF #72-0840) and monoclinic LaMn<sub>2</sub>O<sub>5</sub> (P21/c, ICDD PDF #52-1095). Most prominent diffraction peaks of LaMnO<sub>3</sub> at 22.29, 31.12 and 32.31°2θ are assigned to (101), (002) and (200) planes, while most prominent diffraction peaks of LaMn<sub>2</sub>O<sub>5</sub> at 28.24, 29.8, 35.05, 40.64, 46.15 and 57.85°2θ are assigned to (121), (211), (112), (212), (141) and (332) crystallographic planes. The RMn<sub>2</sub>O<sub>5</sub> (R = rare-earth metal like La) family is attractive as having two different oxidation states for Mn, which are located at distinct oxygen atmospheres (Muñoz et al. 2005). Although the same preparation

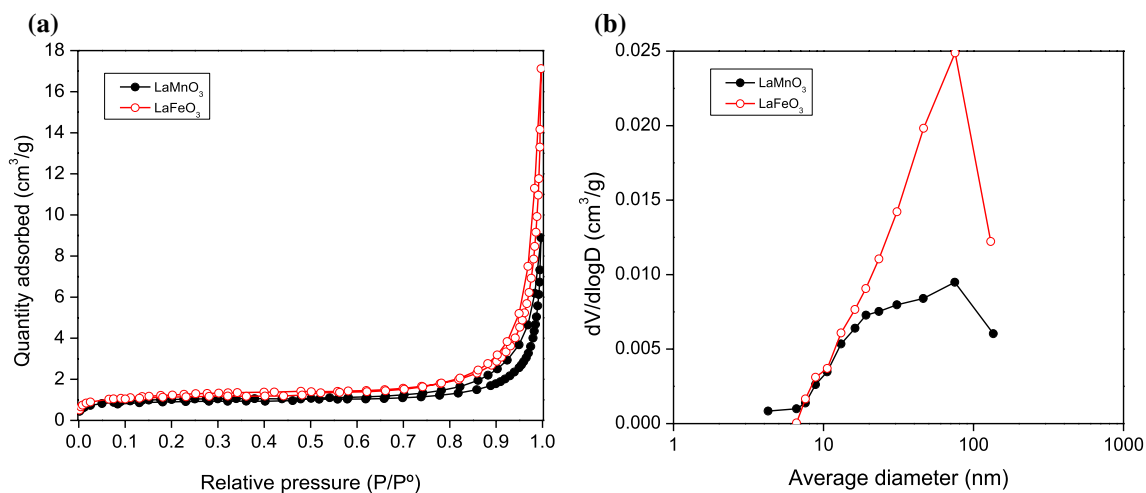
procedures applied, LaFeO<sub>3</sub> sample showed purity and far better crystallinity in comparison with LaMnO<sub>3</sub> sample. The remark on crystallinity is based on the comparison of diffraction maxima intensities and the appearance of amorphous hump on which peaks in sample LaMnO<sub>3</sub> are superimposed on. As can be seen the peak intensities in pattern of LaFeO<sub>3</sub> sample are 10 times larger than LaMnO<sub>3</sub> sample peak intensities. Such great difference for the samples analyzed under the same conditions makes claim on better crystallinity of sample LaFeO<sub>3</sub> plausible although no comparisons should be made without the addition of standards. Most of peaks in sample LaMnO<sub>3</sub> seem broad but which could be the consequence of small crystallite size but peaks are overlapped and inappropriate for Scherrer analysis.

#### Textural properties of the catalysts

Adsorption–desorption isotherms of N<sub>2</sub> at 77 K are shown in Fig. 2a. It can be seen that both curves correspond to type H3 hysteresis loops, which can be associated with non-rigid aggregates of plate-like particles with a macroporous pore network (Thommes et al. 2015). The metal type in B-position of the perovskite did not affect the total volume of N<sub>2</sub> adsorbed, which was quite similar for LaFeO<sub>3</sub> and LaMnO<sub>3</sub>. On the other hands, the greatest contribution to pore volume can be attributed to the macroporous zone (> 50 nm) for both materials (Fig. 2b). Table 1 lists main textural properties of the materials. While LaMnO<sub>3</sub> catalyst showed a BET surface area of 3.72 m<sup>2</sup>/g, LaFeO<sub>3</sub> catalyst had 4.45 m<sup>2</sup>/g. As expected, very small BET surface areas were obtained,

**Fig. 1** XRD data for (a) LaFeO<sub>3</sub> and (b) LaMnO<sub>3</sub> catalysts





**Fig. 2**  $N_2$  adsorption–desorption isotherms (a) and BJH pore size distribution from  $N_2$  desorption isotherm (b) for  $LaMnO_3$  and  $LaFeO_3$ , respectively

**Table 1** Textural properties of the prepared perovskite samples

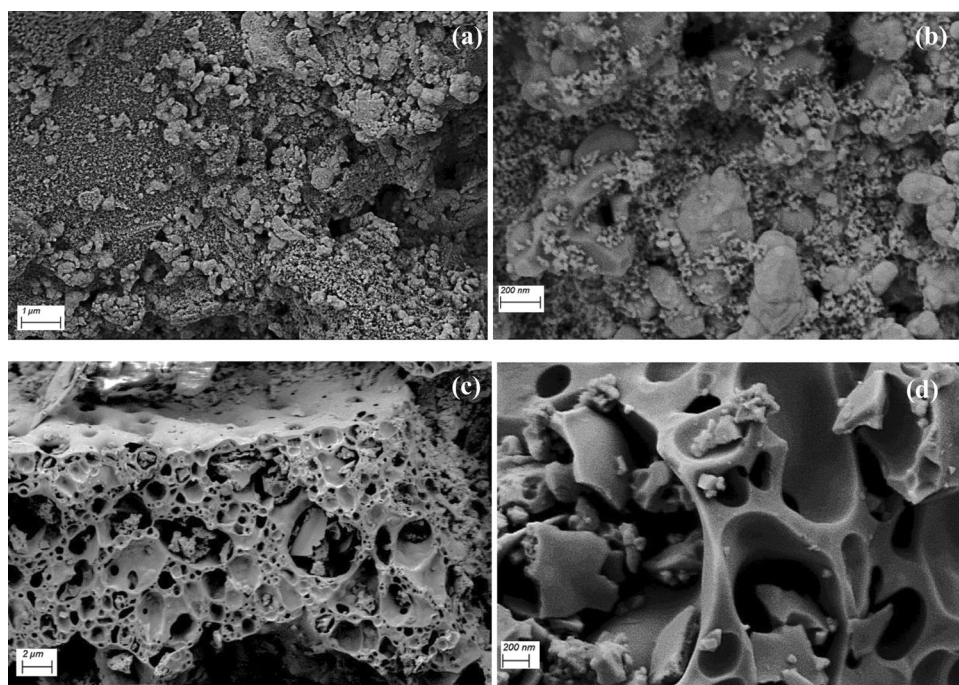
Catalyst	BET surface area ( $m^2 g^{-1}$ )	Pore volume ( $cm^3 g^{-1}$ )	Average pore size (nm)
$LaFeO_3$	4.45	0.017	75.4
$LaMnO_3$	3.72	0.009	75.1

which is common for perovskite materials. Thus, additional effort should be made to develop nanostructured perovskite oxides and to increase the number of active sites per unit of their geometric area.

### SEM results

The SEM micrographs of the catalysts are shown in Fig. 3. Two prepared samples exhibit the entirely different morphologies. The  $LaFeO_3$  sample is consisted of particles of different sizes, from a few tens to a few hundred nanometers (Fig. 3a). Smaller particles exhibit some loose agglomeration

**Fig. 3** SEM images of  $LaFeO_3$  at (a)  $\times 10KX$ , (b)  $\times 50KX$  and  $LaMnO_3$  at (c)  $\times 3KX$  and (d)  $\times 30KX$



but greater compact particles are void-free (Fig. 3b). On the other hands, the morphology of the  $\text{LaMnO}_3$  sample could be described as sponge-like having voids partially filled with some crumbled particles (Fig. 3c). Such morphology is a consequence of gasses released in the course of synthesis and thermal treatment (Machin et al. 2008). The voids exhibit various dimensions, from submicron to few microns in diameter, while most of the crumbles, also exhibiting loose agglomeration, are in size range above 100 nm (Fig. 3d).

### TGA–DSC results

Results of the TGA–DSC analysis (Figs. 4 and 5) under different gases flows (e.g. synthetic air and argon) show similar profiles for both perovskite catalysts. Mass losses of 15% and 27% were recorded for  $\text{LaFeO}_3$  and  $\text{LaMnO}_3$ ,

respectively, when treated with synthetic air. When argon was used as the flow gas, mass losses were slightly reduced to 13% for  $\text{LaFeO}_3$  and 21% for  $\text{LaMnO}_3$ . As seen in the figures, two regions can be distinguished in TGA curves, initial mass losses below 500–600 K can be related to water release and above 600 K oxygen losses would appear, which would be lower for Ar atmosphere (Santos 2010).

### $\text{H}_2$ -TPR results

Temperature-programmed reduction profiles of  $\text{LaFeO}_3$  and  $\text{LaMnO}_3$  samples are shown in Fig. 6. Two reduction steps can be observed for the  $\text{LaFeO}_3$ . First, there is a small peak at about 650 K, which would correspond to reduction of  $\text{Fe}^{3+}$  to  $\text{Fe}^{2+}$  and then a second reduction band, starting above 1000 K, which can be related to reduction of  $\text{Fe}^{2+}$  to  $\text{Fe}^0$ . These results are in agreement

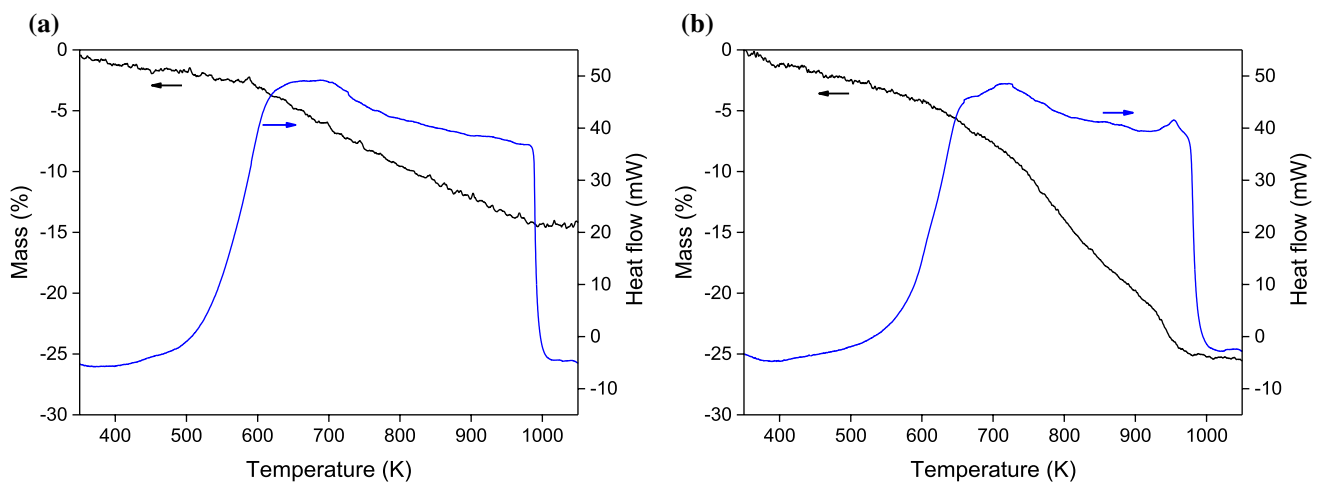


Fig. 4 TGA–DSC curve for  $\text{LaFeO}_3$  (a) and for  $\text{LaMnO}_3$  (b) catalysts under synthetic air flow

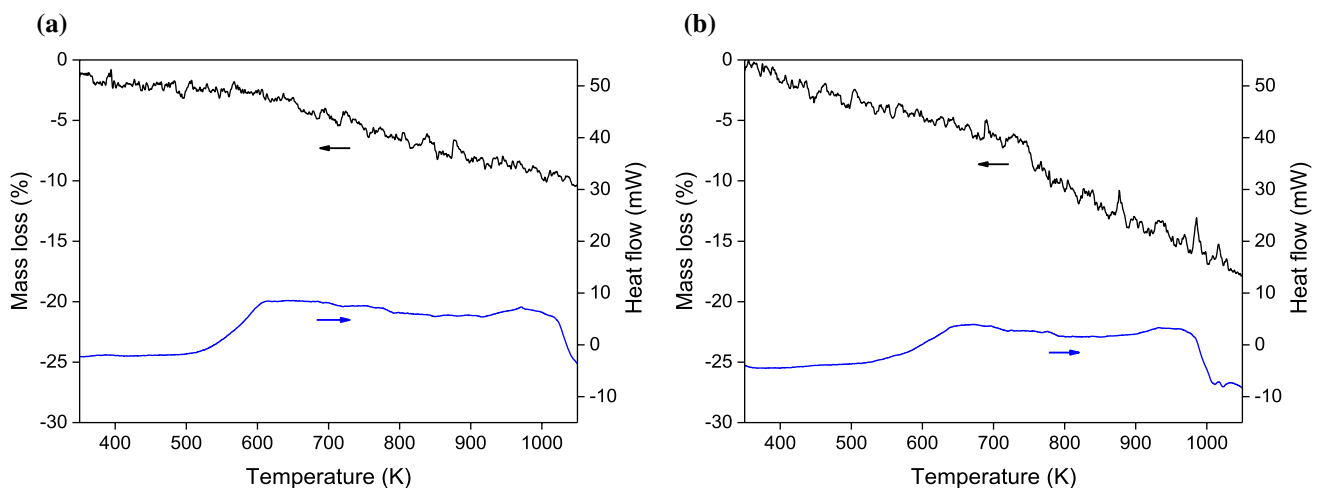
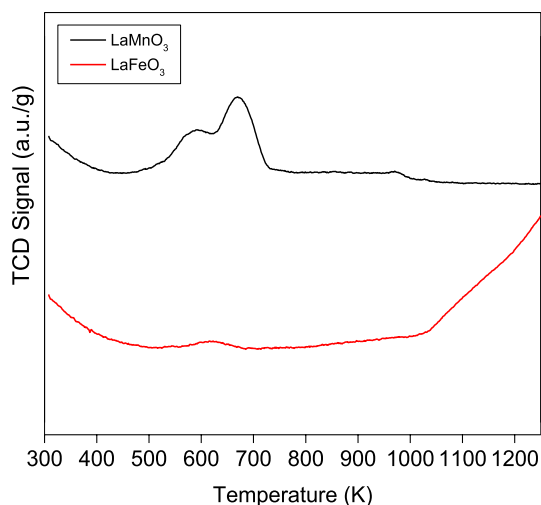


Fig. 5 TGA–DSC curve for  $\text{LaFeO}_3$  (a) and for  $\text{LaMnO}_3$  (b) catalysts under Ar flow





**Fig. 6** Temperature-programmed reduction profiles for  $\text{LaMnO}_3$  and  $\text{LaFeO}_3$

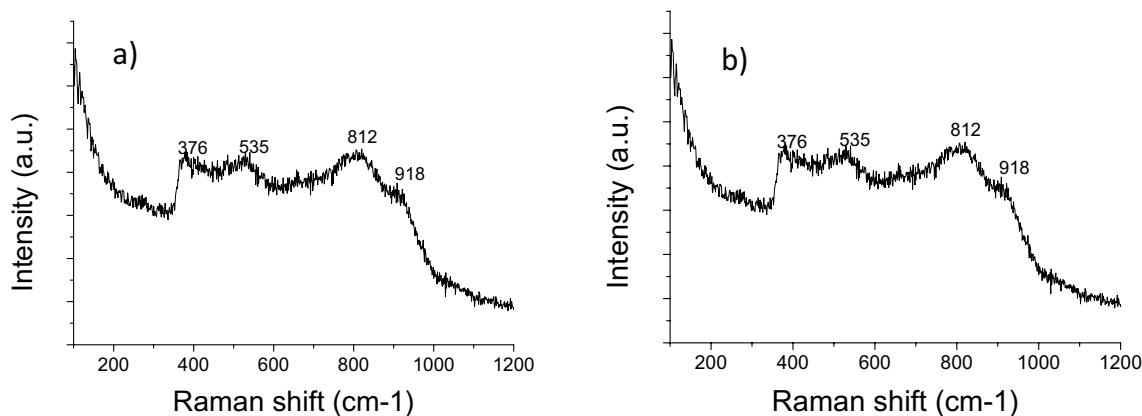
with the literature (Heidinger et al. 2019). With regards to the  $\text{H}_2$ -TPR profile for the  $\text{LaMnO}_3$  sample, first peak appears in the temperature range between 500 and 700 K and a second one, with a significantly smaller intensity, centered at around 950 K. The first one is typically related to  $\text{Mn}^{4+}$  to  $\text{Mn}^{3+}$  reduction and the second peaks show the reduction of  $\text{Mn}^{3+}$  to  $\text{Mn}^{2+}$  (Ansari et al. 2019). The shoulder in the first peak of the  $\text{LaMnO}_3$  sample indicates different Mn species in the perovskite. According to the literature, the redox performance of  $\text{ABO}_3$  perovskites is mainly driven by the B-site transition-metal element character and the role of the rare-earth ions in the A-site (such as La) is accepted as secondary (Nitadori et al. 1988; Zhu et al. 2015).

## Raman results

Raman spectroscopy is a powerful technique for the phase structural analysis. Compared to XRD, its excitation energy which is less penetrating than X-ray makes it more surface-sensitive (Feng et al. 2011). Figure 7 shows Raman spectra of  $\text{LaFeO}_3$  and  $\text{LaMnO}_3$ . Similar results were observed in the previous studies approving the formation of the phases in crystal systems (Palimar et al. 2016). Raman spectra showed a strong broadening of bands for  $\text{LaMnO}_3$  compared to  $\text{LaFeO}_3$ . The vibrational modes frequencies found can be classified as follows: (1) vibrations of A-site cations (below  $200 \text{ cm}^{-1}$ ), (2) octahedral bending modes ( $250\text{--}450 \text{ cm}^{-1}$ ) and (3) octahedral stretching modes ( $500\text{--}600 \text{ cm}^{-1}$ ) (Runka and Berkowski 2012; Palimar et al. 2016). In addition to the perfect  $\text{LaFeO}_3$  crystal structure verified by XRD analysis, additional information was obtained based on Raman spectra, i.e. three clear bands at about  $764$ ,  $941$  and  $1477 \text{ cm}^{-1}$ . The band at  $764 \text{ cm}^{-1}$  indicated to Fe–O and La–O stretch vibrations. Broad bands with high intensity were detected at  $\sim 941$  and  $\sim 1477 \text{ cm}^{-1}$ . These bands can be explained as second-order scattering of IR-active longitudinal optic phonon modes (Nandi et al. 2018).

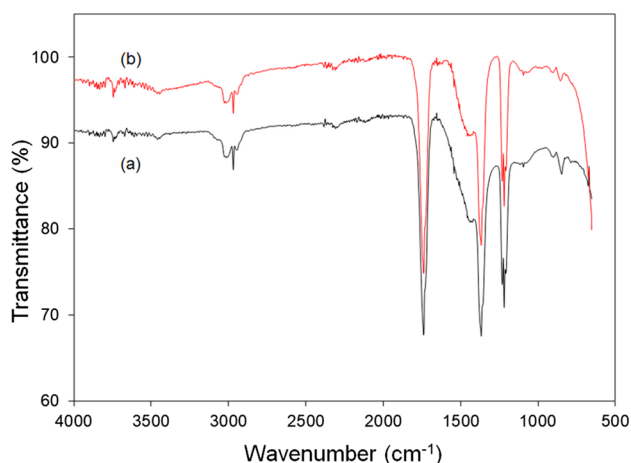
The perovskite which has excellent cubic structure does not keep Raman active phonons due to all the five atoms of the unit cell reside in centrosymmetrical positions. Raman active phonons can be shown in (a) mismatch of the ions ionic radii in the unit cell and the (b) Jahn–Teller effect related to the  $\text{Mn}^{3+}$  ions ensure origin to the orthorhombic (Pnma) and the rhombohedral (R-3c) structures (Varshney and Shaikh 2014). The broad bands between  $375$  and  $920 \text{ cm}^{-1}$  in the Raman spectra of orthorhombic  $\text{LaMnO}_3$  link to lattice vibrations initiated by the dynamic Jahn–Teller effect and the existence of small polarons round the  $\text{Mn}^{3+}$  sites.

The Raman results indicate that the relationship between the Jahn–Teller distortion and the phonon



**Fig. 7** Raman spectra of **a**  $\text{LaFeO}_3$  and **b**  $\text{LaMnO}_3$  catalyst





**Fig. 8** FT-IR spectra of LaMnO<sub>3</sub> (a) before and (b) after the catalytic oxidation of toluene

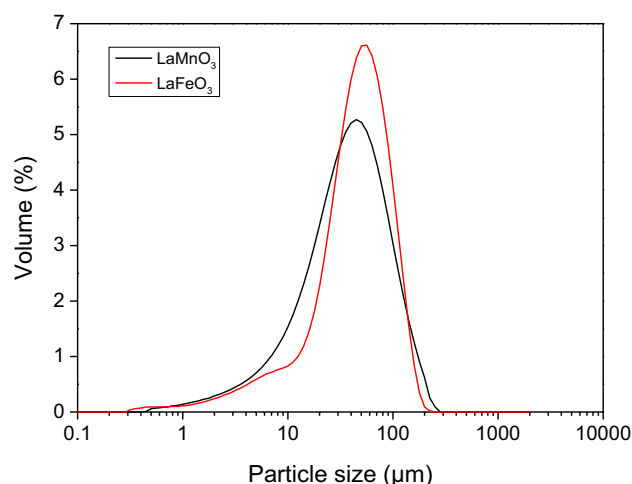
intensity is acceptable over a large temperature range. But, especially the peaks are apparent at and above the phase transition temperature as Mn–O octahedra are consistent according to diffraction. The atomic movements in Fig. 8 are consistent with the results conducted by Martin-Carron et al. There is a structural phase transition at about 800 K to a quasicubic structure and, considering that a cubic perovskite has no Raman modes permitted, the Raman peaks are expected to eliminate at or close the phase transition temperature (Martín-Carrón and De Andrés 2001).

### FT-IR results

The FT-IR analysis was employed to investigate the changes in the chemical composition of the LaMnO<sub>3</sub> catalyst before and after toluene oxidation. The FT-IR spectra given in Fig. 8 revealed that there was no significant adsorption of the reactants or possible reaction intermediates on the surface of the LaMnO<sub>3</sub> during the toluene oxidation. While the peak at 1380 cm<sup>-1</sup> (M–O rocking in plane) indicated the presence of metal-oxide group, the peaks at 1740 cm<sup>-1</sup> (C=O or M-H stretching) and at 1210 cm<sup>-1</sup> (C–O stretching) implied some carbon-containing molecules.

### Particle size analysis results

Particle size distributions of the two catalysts, as determined by laser scattering, are shown in Fig. 9. Both catalysts show very narrow distributions and average values of 55.588 μm and 51.432 μm for LaMnO<sub>3</sub> and LaFeO<sub>3</sub>, respectively. Main results, expressed as the average of four separate runs, are listed in Table 2.



**Fig. 9** Average particle size for LaMnO<sub>3</sub> and LaFeO<sub>3</sub>

### Catalytic experiments

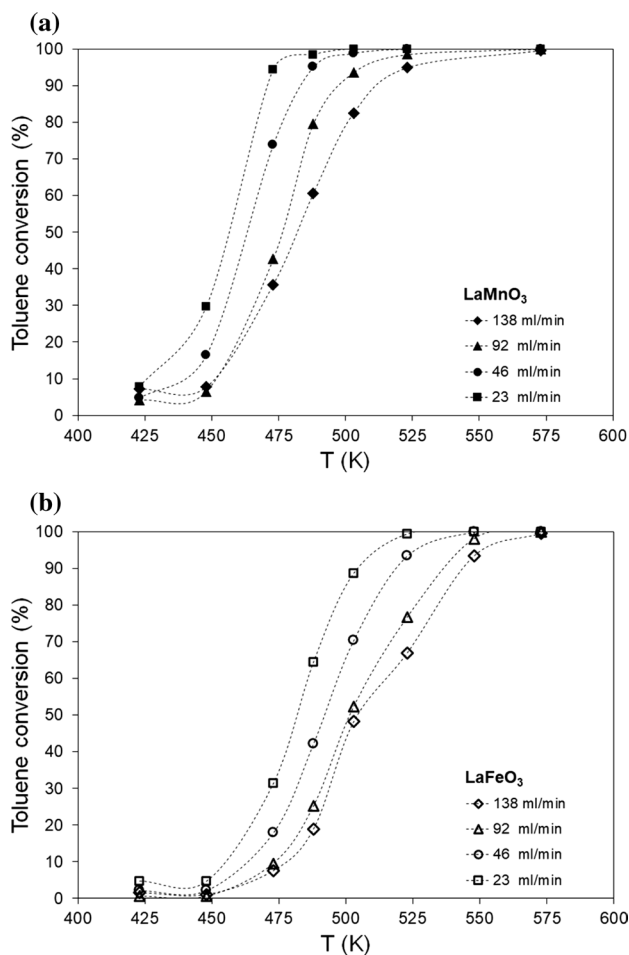
Oxidation of toluene was used as a model reaction to compare the activity of the prepared perovskite catalysts. The influence of the reaction temperature and total flow rate of the reaction mixture on the conversion of toluene over LaFeO<sub>3</sub> and LaMnO<sub>3</sub> catalysts is shown in Fig. 10. With the increase in temperature, the conversion of toluene increased and reached a maximum value depending on the operating conditions, i.e. depending on the space time. As expected, at larger space times (i.e. at lower total flow rate of the reaction mixture), the maximum conversion of toluene was achieved at lower temperatures. The LaMnO<sub>3</sub> perovskite was more active catalyst for toluene oxidation than LaFeO<sub>3</sub> and achieved lower T<sub>10</sub>, T<sub>50</sub> and T<sub>90</sub> temperatures, e.g. temperatures corresponding to the 10%, 50% and 90% of toluene conversion (Fig. 11, Table 3), regardless of the total flow rate of the reaction mixture. Data for the commercial Pt–Al<sub>2</sub>O<sub>3</sub> were taken from (Duplancic 2018).

The observed curves with characteristic S-shape in Fig. 10 represent dependence of toluene conversion on reaction temperature, which indicates that toluene conversion increases sharply with increasing temperature until the inflection point is reached, followed by a slower increase in toluene conversion with further increase in temperature.

**Table 2** Particle size distribution results

	LaFeO <sub>3</sub>	LaMnO <sub>3</sub>
Average particle size (μm)	55.588	51.432
Uniformity	0.588	0.781
< 10 vol% (μm)	11.594	9.065
< 50 vol% (μm)	48.951	39.878
< 90 vol% (μm)	107.302	109.714

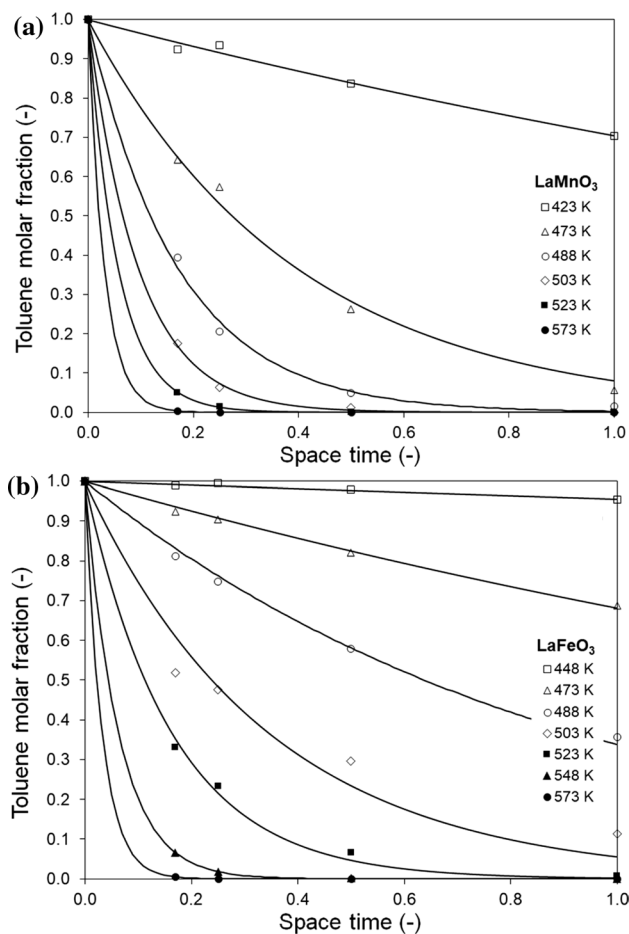




**Fig. 10** Catalytic performance of (a)  $\text{LaMnO}_3$  and (b)  $\text{LaFeO}_3$  at different temperatures and total flow rates of reaction mixture

This form of curve is well-known and characteristic for the exothermal reactions of oxidation, which results in the rapid release of the reaction heat and transition from the kinetic to the diffusion region during the reaction path. Extremely exothermic reactions are often present in industrial practice and therefore a great care must be taken during the reactor design, because of the risk connected with this kind of reactions. Based on the shape of the S-curve, it is possible to get an additional insight into the kinetic properties of the catalyst and to draw conclusions about the reaction order as well as about the influence of both the intra-phase and inter-phase diffusion on the overall reaction rate. From the shape of the curves obtained on the catalysts employed in this study, it seems that toluene oxidation is a first-order reaction (Duprat 2002).

Characteristic values  $T_{10}$ ,  $T_{50}$  and  $T_{90}$ , e.g. temperatures corresponding to the 10%, 50% and 90% of toluene conversion over  $\text{LaMnO}_3$  and  $\text{LaFeO}_3$  at different total flow rates of the reaction mixture are shown in Table 3. For comparison purposes, Table 3 also contains  $T_{10}$ ,  $T_{50}$  and  $T_{90}$  for the



**Fig. 11** Comparison between experimental data (points) and values predicted by the 1D pseudo-homogeneous model (lines) for (a)  $\text{LaMnO}_3$  and (b)  $\text{LaFeO}_3$  catalyst

**Table 3** Comparison of the activities of perovskite catalysts and commercial  $\text{Pt-Al}_2\text{O}_3$  catalyst based on  $T_{10}$ ,  $T_{50}$  and  $T_{90}$  at different total flow rates of the reaction mixture

$v_0$ , $\text{cm}^3 \text{min}^{-1}$		138	92	46	23
$\text{LaFeO}_3$	$T_{10}$ , K	477	474	460	453
	$T_{50}$ , K	506	502	492	481
	$T_{90}$ , K	545	540	520	505
$\text{LaMnO}_3$	$T_{10}$ , K	450	450	435	425
	$T_{50}$ , K	481	477	462	456
	$T_{90}$ , K	515	500	485	471
$\text{Pt-Al}_2\text{O}_3^a$	$T_{10}$ , K	397	393	384	378
	$T_{50}$ , K	411	404	396	387
	$T_{90}$ , K	423	415	403	393

<sup>a</sup>Data for the commercial  $\text{Pt-Al}_2\text{O}_3$  were taken from (Duplancic 2018)

commercial  $\text{Pt-Al}_2\text{O}_3$  catalyst that served as a benchmark. The characteristic value of  $T_{50}$  for the  $\text{LaMnO}_3$  catalyst is 456–481 K, while for  $\text{LaFeO}_3$ , it is between 481–506 K,



depending on the total flow of the reaction mixture (or space time). Comparing the  $T_{90}$  values obtained with perovskite catalysts and commercial  $\text{Pt-Al}_2\text{O}_3$ , it can be seen that  $\text{LaMnO}_3$  achieves 90% conversion at temperatures that are 78–92 K (depending on the total flow rate) higher than that for  $\text{Pt-Al}_2\text{O}_3$ , while in the case of  $\text{LaFeO}_3$ , these differences are even more pronounced (112–125 K, depending on total flow rate). These temperature differences indicate that perovskite catalysts have poorer catalytic properties in the catalytic oxidation of toluene in comparison to the commercial  $\text{Pt-Al}_2\text{O}_3$  catalyst. However, a possible strategy to further improve activity of perovskite catalyst for toluene oxidation involves incorporating or impregnating a precious metal such as Pt or Pd into its structure, as shown by Giebler et al. (Giebler et al. 2007).

The higher activity of the  $\text{LaMnO}_3$  compared to  $\text{LaFeO}_3$  origins from different Mn species as described previously based on the characterization results, i.e. XRD (Fig. 1),  $\text{H}_2$ -TPR (Fig. 6) and Raman analysis (Fig. 7). Therefore, the results obtained by comparing the catalytic activity of two perovskites for toluene oxidation are consistent with the results of their characterization.

Although the presence of highly dispersed oxide phases with reduced crystallinity and medium crystallite size is not desirable, the presence of  $\text{LaMn}_2\text{O}_5$  on the surface of  $\text{LaMnO}_3$  crystallites leads to the improved catalyst activity. In addition, the co-presence of  $\text{LaMn}_2\text{O}_5$  provides a synergistic effect, i.e. improves the reducibility of the catalyst, promotes the formation of abundant lattice oxygen and thus improves catalytic activity for the oxidation of toluene. Based on the results of the particle size distribution (Fig. 9, Table 2) it is confirmed that the oxidation of toluene is a structure-sensitive reaction, like the oxidation of benzene (Garcia et al. 2014).

### Pseudo-homogeneous one-dimensional (1D) model of the fixed-bed reactor

Evaluations of experimental data and theoretical values predicted by the applied mathematical models are graphically shown in Fig. 11a for the  $\text{LaMnO}_3$  and in Fig. 11b for the  $\text{LaFeO}_3$  catalyst. A very good agreement between simulation and experimental data was attained, demonstrating that applied mathematical model produced acceptable outcomes for the catalytic oxidation of toluene in the described experimental settings. The values of the estimated rate constants,  $k$  and the root-mean-square deviations, SD at different temperatures are assumed in Table 4 for both catalysts. The activation energies,  $E_A$  and frequency factors,  $A_r$  calculated from the Arrhenius plots (not shown here) are also reported in Table 4. The obtained  $E_A$  values are  $83.71 \text{ kJ mol}^{-1}$  and  $99.16 \text{ kJ mol}^{-1}$  for the  $\text{LaMnO}_3$  and  $\text{LaFeO}_3$ , respectively. Similar, but higher values of activation energies ranging

**Table 4** Estimated rate constants at different temperatures for the  $\text{LaMnO}_3$  and  $\text{LaFeO}_3$  catalyst

	$T$ (K)	$k$ ( $\text{min}^{-1}$ )	$\text{SD} \times 10^3$	
$\text{LaMnO}_3$	423	47.17	12.04	
	448	171.05	5.42	
	473	1232.16	10.68	
	488	2858.14	7.71	
	503	5089.61	2.57	
	523	8489.34	0.46	
	573	15,856.69	0.06	
	$A_r = 1.52 \times 10^{12} \text{ min}^{-1}$ ; $E_A = 83.71 \text{ kJ mol}^{-1}$			
	$\text{LaFeO}_3$	423	20.13	2.01
		448	22.43	1.25
473		185.80	3.07	
488		524.35	6.22	
503		1399.89	25.34	
523		2951.50	6.8	
548		7704.09	0.35	
573		14,997.18	0.12	
$A_r = 1.98 \times 10^{13} \text{ min}^{-1}$ ; $E_A = 99.16 \text{ kJ mol}^{-1}$				

from 126 to  $164 \text{ kJ mol}^{-1}$  are reported for  $\text{LaBO}_3$  (B: Mn, Fe) perovskites prepared using a three-step reactive grinding process (Heidinger et al. 2019). Obviously, the perovskite with a lower  $E_A$  value exhibits the better catalytic performance for toluene oxidation.

## Conclusions

The study deals with catalytic oxidation of toluene over  $\text{LaMnO}_3$  and  $\text{LaFeO}_3$  perovskite type catalysts prepared by Pechini method. It is observed that  $\text{LaMnO}_3$  displays better catalytic activity for toluene oxidation which is attributed to its physico-chemical properties determined by different instrumental techniques. According to the obtained results,  $\text{LaMnO}_3$  contains different Mn species and oxygen vacancies which are probably critical in maintaining the high activity and stability. Different Mn species are confirmed by XRD and  $\text{H}_2$ -TPR analysis, while oxygen vacancies that outcomes from the broadening of vibrational bands are confirmed by Raman analysis. The Raman spectrum of  $\text{LaMnO}_3$  also showed the contribution of additional phase, such as monoclinic  $\text{LaMn}_2\text{O}_5$ . The coexistence of  $\text{LaMn}_2\text{O}_5$  and  $\text{LaMnO}_3$  causes a synergistic action, which results in better reducibility of perovskite catalyst, the formation of active lattice oxygen and thus improved the activity of the catalyst.

A good agreement of the experimentally observed results with the values predicted by the proposed one-dimensional (1D) pseudo-homogeneous model of the fixed bed reactor is achieved, indicating that the proposed

model can be successfully applied to describe the experimental system. The calculated apparent activation energies for toluene oxidation on the  $\text{LaMnO}_3$  and  $\text{LaFeO}_3$  catalyst were  $84 \text{ kJ mol}^{-1}$  and  $99 \text{ kJ mol}^{-1}$ , respectively. The lowest apparent activation energy of  $\text{LaMnO}_3$  is in good agreement with its better catalytic behaviour for toluene oxidation under conditions employed in this study. Finally, based on the obtained results, it follows that  $\text{LaMnO}_3$  is a potential catalyst for the catalytic oxidation of volatile organic compounds in real systems.

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## Compliance with ethical standards

**Conflict of interest** The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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