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## Supported molybdenum oxides as effective catalysts for the catalytic fast pyrolysis of lignocellulosic biomass†

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The catalytic fast pyrolysis (CFP) of pine was investigated over 10 wt% MoO<sub>3</sub>/TiO<sub>2</sub> and MoO<sub>3</sub>/ZrO<sub>2</sub> at 500 °C and H<sub>2</sub> pressures ≤0.75 bar. The product distributions were monitored in real time using a molecular beam mass spectrometer (MBMS). Both supported MoO<sub>3</sub> catalysts show different levels of deoxygenation based on the cumulative biomass to MoO<sub>3</sub> mass ratio exposed to the catalytic bed. For biomass to MoO<sub>3</sub> mass ratios <1.5, predominantly olefinic and aromatic hydrocarbons are produced with no detectable oxygen-containing species. For ratios ≥1.5, partially deoxygenated species comprised of furans and phenols are observed, with a concomitant decrease of olefinic and aromatic hydrocarbons. For ratios ≥5, primary pyrolysis vapours break through the bed, indicating the onset of catalyst deactivation. Product quantification with a tandem micropyrolyzer–GCMS setup shows that fresh supported MoO<sub>3</sub> catalysts convert ca. 27 mol% of the original carbon into hydrocarbons comprised predominantly of aromatics (7 C%), olefins (18 C%) and paraffins (2 C%), comparable to the total hydrocarbon yield obtained with HZSM-5 operated under similar reaction conditions. Post-reaction XPS analysis on supported MoO<sub>3</sub>/ZrO<sub>2</sub> and MoO<sub>3</sub>/TiO<sub>2</sub> catalysts reveal that ca. 50% of Mo surface species exist in their partially reduced forms (*i.e.*, Mo<sup>5+</sup> and Mo<sup>3+</sup>), and that catalyst deactivation is likely associated to coking.

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## 1. Introduction

The demand for the production of renewable transportation fuels and chemicals from lignocellulosic biomass has increased over the last decade in our efforts to lower the carbon footprint of the transportation and chemicals sectors. Among the many conversion technologies currently available, fast pyrolysis has emerged as a promising avenue to convert low energy density biomass to higher energy density liquid bio-oils with typical yields of *ca.* 65 wt%.<sup>1–3</sup> However, these bio-oils cannot be directly used as or blended with transportation fuels due to their high oxygen, water, and acid content.<sup>4,5</sup> As a result, a catalytic upgrading step to deoxygenate and stabilise bio-oil is required before it can be processed with regular transportation fuels. Recently, increasing research efforts have focused on catalytic fast pyrolysis (CFP)—a single step bio-oil upgrading process wherein the hot pyrolysis

vapours are contacted with a catalytic bed prior to condensation.<sup>6–9</sup> CFP is a promising alternative to the conventional two-step bio-oil upgrading process as it is simpler and avoids cumbersome condensation and re-evaporation steps.<sup>8–10</sup> *Ex situ* CFP takes place when the pyrolysis and upgrading processes are decoupled by placing a catalytic bed downstream of the pyrolysis reactor.<sup>7</sup> In contrast, during *in situ* CFP, the feedstock is mixed with the upgrading catalyst prior to heating.<sup>7</sup> Both strategies have been shown to produce higher quality bio-oils than the non-catalytic pyrolysis process.<sup>6</sup> Although *in situ* CFP features more intimate contact between biomass and the catalyst, the catalyst is exposed to char and ash, which can be detrimental to the catalyst performance.<sup>11,12</sup> Recent techno-economic and uncertainty analyses have also indicated that the *ex situ* operating mode could offset more commercialisation risks than the *in situ* mode.<sup>12</sup>

Proton-exchanged zeolites, such as HZSM-5, are the state-of-the-art catalysts used for the production of hydrocarbons from biomass *via* CFP.<sup>8,13–17</sup> Although gasoline-range aromatics are obtained with these materials, typically low carbon yields, high light gas production, and rapid catalyst deactivation due to coking are observed.<sup>13,18,19</sup> These shortcomings are a consequence of the inherently hydrogen deficient nature of lignocellulosic biomass (it features an effective

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hydrogen to carbon ratio ranging from 0 to 0.3)<sup>20</sup> coupled with the lack of external H<sub>2</sub> gas addition to the process, which forces high degrees of deoxygenation to occur by decarbonylation, decarboxylation, dehydration and coking. As such, large catalyst quantities are needed to achieve high conversions.<sup>13,21–24</sup> Indeed, the development of alternative CFP catalysts that can overcome these technical barriers remains an important challenge.

Hydrodeoxygenation (HDO) is a common upgrading strategy that uses hydrogen to remove oxygen selectively as water without breaking molecular carbon backbones. Recently, Román-Leshkov *et al.* showed that molybdenum trioxide (MoO<sub>3</sub>) is an effective HDO catalyst that produces olefinic and aromatic hydrocarbons at high selectivities (>97%) from various biomass-derived oxygenates under mild conditions ( $T = 320\text{ °C}$  and  $P_{\text{H}_2} \leq 1\text{ bar}$ ).<sup>25,26</sup> These studies revealed that Mo<sup>5+</sup> species were important for maintaining the activity of the catalyst over extended time periods and were stabilised by a partial carburisation of the surface that prevented over-reduction to less reactive Mo<sup>4+</sup> species.<sup>26</sup> Coupled reactivity and characterisation studies showed that dispersing MoO<sub>3</sub> on high surface area oxides, such as ZrO<sub>2</sub> and TiO<sub>2</sub>, significantly improved both the reactivity and stability of the catalyst during the HDO of *m*-cresol.<sup>27</sup> An oxygen vacancy driven mechanism was hypothesised to be responsible for the HDO of oxygenates over both bulk and supported MoO<sub>3</sub> catalysts.<sup>25,27</sup> Similarly, Bhan and co-workers have shown that a combination of metallic and Brønsted acid sites in partially oxidized molybdenum carbide can effectively hydrodeoxygenate biomass-derived molecules using atmospheric H<sub>2</sub> pressures and low temperatures (420–520 K).<sup>28–31</sup>

MoO<sub>3</sub> has been tested in CFP of lignocellulosic biomass with some success. Budhi *et al.* investigated molybdenum supported on KIT-5 mesoporous silica for the CFP of pine in the absence of H<sub>2</sub> gas.<sup>32</sup> The catalysts preferentially produced furans and phenols with small amounts of aromatic hydrocarbons.<sup>32</sup> Nolte *et al.* performed CFP of cellulose, lignin, and corn stover in a tandem micropyrolyzer using bulk MoO<sub>3</sub> at low H<sub>2</sub> pressures and cumulative biomass : catalyst ratios of *ca.* 0.006, mainly producing linear alkanes and aromatics.<sup>33</sup> Although the HDO of model compounds has been demonstrated with supported MoO<sub>3</sub> catalysts, the performance and stability of these catalysts have not been investigated for the CFP of lignocellulosic biomass using atmospheric hydrogen pressures.

In this contribution, 10 wt% MoO<sub>3</sub> supported on TiO<sub>2</sub> and ZrO<sub>2</sub> catalysts are investigated for the CFP of pine at 500 °C and H<sub>2</sub> pressures  $\leq 0.75\text{ bar}$ . A 10 wt% MoO<sub>3</sub> loading was used to obtain a near-monolayer coverage of oligomeric molybdena species on the surface of the support, as reported by Shetty *et al.* during the HDO of *m*-cresol.<sup>27</sup> This study also showed that oligomeric molybdena species supported on TiO<sub>2</sub> and ZrO<sub>2</sub> were the optimal supports for HDO of all oxide supports investigated.<sup>27</sup> For this reason, 10 wt% MoO<sub>3</sub>/TiO<sub>2</sub> and MoO<sub>3</sub>/ZrO<sub>2</sub> catalysts were selected for this work. Catalyst HDO performance is monitored in real time by coupling an *ex situ* catalytic fast pyrolysis unit with a molecular beam mass spectrometer (MBMS). An *ex situ* processing mode was selected to indepen-

dently study the effect of the catalyst on the hydrodeoxygenation of pyrolysis vapours.<sup>11</sup> We use a multivariate analysis of the MBMS data to group products with varying degrees of deoxygenation into “bins”, which are then tracked as a function of the cumulative amount of pyrolysis vapours exposed to the catalytic bed for biomass : MoO<sub>3</sub> mass ratios ranging from 0 to 20. These data are complemented by detailed product identification and quantification using a tandem micropyrolyzer–Gas Chromatography Mass Spectrometry (GCMS) system. The catalysts are compared to a state-of-the-art acid zeolite with the MFI topology (HZSM-5) tested in the micropyrolyzer–GCMS system under similar reaction conditions. The spent catalysts are then characterised using powder X-ray diffraction (PXRD) and X-ray photoelectron spectroscopy (XPS) to provide insights on the changes in the bulk structure and stabilisation of specific surface Mo oxidation states, respectively.

## 2. Experimental

### 2.1 Materials and synthesis

Southern yellow pine (42% cellulose, 21% hemicellulose, and 30% lignin) supplied by Idaho National Laboratory was used as lignocellulosic biomass feedstock for all the experiments.<sup>13</sup> The C, H and N contents were measured using a LECO TruSpec CHN module, as discussed previously,<sup>34</sup> and the oxygen content was measured by difference. The elemental analysis on a dried biomass sample showed that it contains 50% carbon, 43% oxygen, 6% hydrogen, and less than 1% nitrogen. The moisture content was 2%. Bulk molybdenum(vi) oxide (MoO<sub>3</sub>,  $\geq 99.5\%$ ), molybdenum(iv) oxide (MoO<sub>2</sub>,  $\geq 99\text{ wt}\%$ ), and molybdenum carbide (Mo<sub>2</sub>C,  $\geq 99.5\text{ wt}\%$ ) were purchased from Sigma-Aldrich. Molybdenum powder (99.9 wt%) was purchased from Alfa Aesar, and HZSM-5, with a silica-to-alumina ratio (SAR) of 30 and 20 wt% silica binder, was purchased from Nexceris. Titanium(iv) oxide (TiO<sub>2</sub>, anatase phase, 21 nm,  $\geq 99.5\text{ wt}\%$ , Sigma Aldrich) was used directly as a support while zirconium(iv) oxide (ZrO<sub>2</sub>) nanoparticles were synthesised using previously reported methods.<sup>35</sup> Supported 10 wt% MoO<sub>3</sub>/TiO<sub>2</sub> and MoO<sub>3</sub>/ZrO<sub>2</sub> were prepared by wet impregnation of aqueous solutions of ammonium paramolybdate tetra (para)hydrate ((NH<sub>4</sub>)<sub>6</sub>Mo<sub>7</sub>O<sub>24</sub>·4H<sub>2</sub>O, 99%, Alfa Aesar) as described previously.<sup>27</sup> Catalysts were sieved to 500–1000  $\mu\text{m}$  pellets before use in the CFP experiments.

### 2.2 Catalytic fast pyrolysis

**2.2.1 Horizontal reactor–MBMS.** CFP of pine was performed in a horizontal quartz annular reactor coupled to a MBMS (Fig. S1†).<sup>13,32</sup> The reactor was mounted in a five-zone furnace where small boats loaded with pine were pyrolysed in a batch-wise fashion; the pyrolysis vapours were then carried over a catalytic bed in 400 cm<sup>3</sup> min<sup>−1</sup> of 50 vol% H<sub>2</sub>–He mixture. Both the pyrolysis and upgrading zones were typically maintained at 500 °C. More specifically, a total of 40 quartz boats containing *ca.* 50 mg of pine per boat were introduced one by one about every 2 min into the pyrolysis chamber. The



catalytic bed consisted of 1.0 g of catalyst mixed with 0.5 g of an inert (sand) packed between two layers of quartz wool. Prior to sampling by the MBMS, the H<sub>2</sub>–He gas mixture was diluted with more He at the end of the reactor (4000 cm<sup>3</sup> min<sup>−1</sup>) to meet the required flow demands of the MBMS sampling orifice. Upon entering the MBMS, this mixed gas stream undergoes adiabatic expansion through a 250 μm orifice leading into a vacuum chamber held at 0.1 Torr, which cools the gas and quenches any secondary reactions. The gas is then skimmed into a molecular beam for ionisation with an electron impact ionisation source (22.5 eV), producing positive ions that are detected by a quadrupole mass spectrometer. Mass spectra for all compounds with an *m/z* range between 10 and 450 are collected simultaneously every second. A dilute flow of Ar (40 cm<sup>3</sup> min<sup>−1</sup>) mixed into the He diluent stream serves as an internal standard to correct for any shifts in signal due to flow fluctuations. The reactor was operated at a nominal weight hourly space velocity (defined as the ratio between the mass flow rates of pyrolysis vapours and the mass of the catalyst) of 3.6 h<sup>−1</sup>, assuming that a 60% mass yield of pyrolysis vapours from pine pyrolysis is obtained for each boat, and that the pyrolysis event lasts for 0.5 min.<sup>13</sup>

**2.2.2 Multivariate analysis of MBMS spectra.** Multivariate analysis was performed to identify correlated groups of mass spectral peaks in the upgraded vapours and to track their dynamics as a function of the biomass to catalyst ratio in the horizontal reactor–MBMS CFP experiments. The analysis was performed using the multivariate curve resolution optimised by the alternate least squares (MCR-ALS) method found in the software package “The Unscrambler” (Camo Software AS, version 9.7). Multivariate curve resolution (MCR) resolves the principal component analysis (PCA) results into mathematically constructed components, which have mathematically derived sub-spectra that are used to partition the original variance of the data set into the estimates of constituent concentrations.<sup>13,32</sup> As a result, the concentration profiles of each component in an unresolved mixture of two or more constituents can be determined as long as the data has enough degrees of freedom to identify the separate sources of variance.<sup>13,32</sup> This capability is extremely useful to analyse highly complex mixtures where the components are unavailable as pure components (PCs). The Unscrambler MCR algorithm performs the selection of pure-variables from a PCA of independent standard loadings to find the initial estimates of spectral profiles, and then uses alternating least squares to optimise resolved spectral concentration profiles.<sup>13,32</sup> Constraints are placed to ensure non-negative concentration profiles and mass spectra, but no constraints were imposed for unimodality and equality in concentration profiles to ensure accurate representation of the relative variation of PC concentration with respect to the biomass:catalyst ratio. Further details on the application of multivariate analysis can be found in previous reports.<sup>36,37</sup>

**2.2.3 Tandem micropyrolyzer–GCMS.** Since the MBMS cannot differentiate ions with the same nominal mass, a tandem micropyrolyzer–GCMS system was used complementa-

rily to identify and quantify the products of CFP (Fig. S2†). The tandem micropyrolyzer (Rx-3050TR, Frontier Laboratories) is equipped with an autosampler (AS-1020E) and a microjet cryo-trap (MJT-1030Ex). The micropyrolyzer has two vertical heating zones in series: one for pyrolysis and one for upgrading of the pyrolysis vapours. Helium (57 cm<sup>3</sup> min<sup>−1</sup>) was used as the carrier gas in the pyrolysis zone, with H<sub>2</sub> (140 cm<sup>3</sup> min<sup>−1</sup>) added prior to the upgrading zone. The temperatures of pyrolysis and upgrading zones were typically maintained at 500 °C. Stainless steel boats containing *ca.* 0.5 mg of pine were dropped in the pyrolysis zone using the autosampler. The pyrolysis vapours were then carried over a fixed bed of 40 mg of the catalyst, supported on a plug of quartz wool. In a typical experiment, 3–4 boats of 0.5 mg of pine were sequentially pyrolysed over the same catalytic bed. The upgraded vapours passed through the microjet cryo-trap that was housed inside the GC oven and maintained at −196 °C. Most of the product vapours were adsorbed, before being rapidly desorbed into the capillary column of the GC (7890B, Agilent Technologies) interfaced with the MS (5977A, Agilent Technologies). These trapped vapours were separated along a capillary column (Ultra Alloy-5, Frontier Laboratories) with a 5% diphenyl and 95% dimethylpolysiloxane stationary phase. The GC oven was set to hold at 40 °C for 4.5 min and then ramped to 300 °C at 20 °C min<sup>−1</sup>. The trapped vapours were identified and quantified using the MS and the flame ionisation detector (FID) respectively. The GC analysis took *ca.* 31 min before the next pine boat was introduced to the reactor. During this time, H<sub>2</sub> and He continued to flow over the catalyst bed. Though most of the products were quantified using FID, it is unable to detect light gases such as CO<sub>2</sub>. To do so, the experiments were repeated with the cryo-trap temperature set at −80 °C to prevent condensation of CO<sub>2</sub> and analyzed using a thermal conductivity detector (TCD).

The furnace heat transfer rates in both the reactor configurations are comparable to that typically seen for fast pyrolysis. Although no direct measurement of the pine heating rate was performed in the current study, both the horizontal reactor and the micropyrolyzer were connected to the MBMS in two separate experiments. In both cases, the pyrolysis products appeared within 1–2 seconds after introducing the pine boat into the reactors set to 500 °C. The total mass spectral ion counts, which can be used to profile the duration of pyrolysis of each boat, took on average 33 seconds. Based on the rise time to peak pyrolysis vapour evolution observed by the total mass spectral ion count curves, the heating rates were estimated to be greater than 30 °C s<sup>−1</sup>, which are typical for fast pyrolysis. Similar conclusions for fast pyrolysis have been reported for such reactor configurations in a previous study.<sup>36</sup>

### 2.3 Spent catalyst characterisation

PXRD patterns were collected using a Bruker D8 diffractometer with nickel-filtered Cu–Kα radiation ( $\lambda = 1.5418$  Å). Diffraction data were recorded on a 2D image plate rotated at a speed of 15 rpm, between 2θ values of 20–90° with a step size of 0.2° s<sup>−1</sup>.



XPS spectra were collected on a PHI Versaprobe II instrument equipped with a multi-channel hemispherical analyser and an aluminum anode X-ray source operating at 100 W, featuring a 100  $\mu\text{m}$  beam scanned over a 1.4 mm line across the sample surface. A dual-beam charge neutralisation system was used with an electron neutraliser bias of 1.2 eV and an Ar ion beam energy of 10 eV. The spent catalysts were mixed with niobium oxide ( $\text{Nb}_2\text{O}_5$ , 99.99%, Sigma Aldrich) as an internal standard for charge correction. The binding energies were corrected to 207.4 eV ( $\text{Nb } 3d_{5/2}$ ). A 7-point Shirley background correction was then applied to the Mo 3d XPS spectra after charge correction. The Mo 3d spectra were deconvoluted to estimate the composition of Mo oxidation states. The following constraints were used for deconvolution: (1) a splitting energy of 3.15 eV for Mo  $3d_{5/2}$ –Mo  $3d_{3/2}$ , (2) an area intensity ratio of 3 : 2 for Mo  $3d_{5/2}$ –Mo  $3d_{3/2}$ , and (3) an equal full width at half maximum (FWHM) of Mo  $3d_{5/2}$  and Mo  $3d_{3/2}$ .

The amount of carbonaceous species on the spent supported  $\text{MoO}_3$  catalysts was quantified using a CHNS analyser (Elementar, Vario EL cube). Sulfanilamide was used to calibrate the equipment prior to carbon content measurements. Similarly, coke deposited on the spent HZSM-5 catalyst was quantified by thermogravimetric analysis in a TGA Instruments Q500 analyser using a previously reported protocol.<sup>18</sup>

### 3. Results and discussion

#### 3.1 Horizontal reactor–MBMS

The CFP of pine was investigated in a horizontal reactor–MBMS set up using 10 wt%  $\text{MoO}_3/\text{TiO}_2$ , 10 wt%  $\text{MoO}_3/\text{ZrO}_2$ , and bulk  $\text{MoO}_3$  catalysts. A total of 40 quartz boats containing 50 mg of pine per boat were sequentially pyrolysed over 1.0 g of catalyst. Fig. 1(a) shows the mass spectra of a control sample obtained by pyrolysing 50 mg of pine in the absence of a catalyst. As expected, oxygenated hydrocarbons, such as aldehydes, ketones, carboxylic acids, alcohols and phenolics, were detected in addition to water, carbon monoxide and carbon dioxide ( $m/z$  18, 28 and 44). Guaiacol, methyl guaiacol, vinyl guaiacol, isoeugenol and coniferyl alcohol ( $m/z$  124, 137, 150, 164 and 180) are pyrolysis products from the lignin portion of pine, while acetic acid/glycoaldehyde, furfuryl alcohol and levoglucosenone/5-hydroxymethyl furfural ( $m/z$  60, 98 and 126) are pyrolysis products from the cellulose and hemicellulose portions of pine.<sup>13</sup> The peaks at  $m/z$  43, 55 and 73 are known carbohydrate fragments.<sup>13,36,37</sup>

Fig. 1(b), (c) and (d) show the products obtained during the CFP of pine using the  $\text{MoO}_3/\text{TiO}_2$  catalyst after the 40<sup>th</sup>, 8<sup>th</sup> and 1<sup>st</sup> boat, respectively. The 1<sup>st</sup> boat was predominantly converted into fully deoxygenated products, including alkenes (butene,  $m/z$  56) and aromatic hydrocarbons such as benzene, toluene, xylenes, trimethylnaphthalenes, naphthalene, methylnaphthalenes, dimethylnaphthalenes and trimethylnaphthalenes ( $m/z$  78, 91, 106, 120, 128, 142, 156 and 170).<sup>13</sup> A carbohydrate-based fragment ( $m/z$  55) and furan ( $m/z$  68) were also detected. After the 8<sup>th</sup> boat, additional peaks corres-

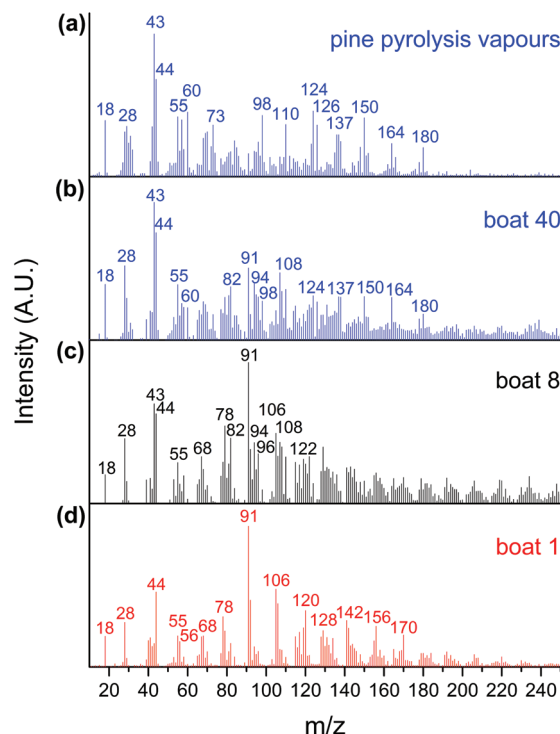


Fig. 1 Averaged mass spectra obtained in the absence of a catalyst (a) and from CFP of pine over  $\text{MoO}_3/\text{TiO}_2$  at different stages of the experiment in the horizontal reactor–MBMS setup (b–d). Reaction conditions: catalyst = 1.0 g  $\text{MoO}_3/\text{TiO}_2$ , biomass = 40 boats of 50 mg pine,  $T$  = 500  $^{\circ}\text{C}$ ,  $P_{\text{total}}$  = 1.013 bar (50%  $\text{H}_2$ , He).

ponding to methyl furan, dimethyl furan, phenol, cresol and xylenol ( $m/z$  82, 96, 94, 108 and 122) were detected.<sup>13,32</sup> These furanic and phenolic components are likely partially hydrodeoxygenated intermediates formed during the CFP of pine with a catalyst bed that has begun deactivating.<sup>13</sup> The spectrum obtained after the 40<sup>th</sup> boat mostly shows peaks analogous to those observed during the control experiment with no catalyst, including peaks associated with primary pyrolysis vapours from both lignin ( $m/z$  124, 137, 150, 164, 180) and carbohydrates ( $m/z$  43, 55, 60, 98, 126). The presence of primary pyrolysis components in combination with furans, toluene, and phenol indicates drastic, but not total, catalyst deactivation. Taken together, these data show that the catalyst effectively hydrodeoxygenates pyrolysis vapours into olefinic and aromatic products, but undergoes progressive deactivation that results in products with increasing amounts of oxygen, with increasing cumulative amounts of pyrolysis products in contact with the catalyst bed.

A multivariate analysis was performed to identify, group, and track the relative yield of the hundreds of species produced during the CFP experiments. This analysis allows us to follow the complex change in product distributions as the catalyst undergoes deactivation. Specifically, the MCR-ALS approach reported by Mukarakate *et al.* and Budhi *et al.* for tracking the distribution of CFP products over HZSM-5<sup>13</sup> and BEA zeolites,<sup>18</sup> as well as molybdenum supported on meso-





porous silica<sup>32</sup> was used in the present study to extract pure components from the data set with overlapping mass spectra.<sup>32</sup> We used the top 100 masses with the largest variances for each of the 40 boats to produce a 4000-point data set. The objective of MCR is to mathematically decompose our data set of overlapping mass spectra into pure contribution of each component involved during the CFP of the 40 boats.<sup>13</sup> We optimised the MCR-ALS analysis for 3 pure components (PCs): hydrocarbons, furans/phenols, and primary vapours. We note that attempts to further increase the number of PCs did not lead to significant changes in the residual error.

Effectively, the MCR-ALS analysis allows us to reconstruct the complex CFP mass spectrum into 3 separate spectra where molecules for each PC are binned (Fig. 2). The hydrocarbons PC is comprised of fully deoxygenated products, including olefins and aromatic hydrocarbons, similar to the products identified after the CFP of the 1<sup>st</sup> boat (*vide supra*). The furans/phenols PC represents partially deoxygenated products, including the products observed during the CFP of the 8<sup>th</sup> boat (methyl furan, dimethyl furan, phenol, cresol, xylene) as well as trimethylphenol ( $m/z$  136).<sup>32</sup> Note that the peaks associated with primary pyrolysis vapours from lignin ( $m/z$  150 and 164) and sugars ( $m/z$  43) are also seen in this PC. The primary vapours PC includes carbohydrate oxygenated fragments, acetic acid/glycoaldehyde, furfuryl alcohol, guaiacol, levoglucosenone or 5-hydroxymethylfurfural, methyl guaiacol, vinyl guaiacol, isoeugenol and coniferyl alcohol.

Fig. 3 shows a scores plot for the 3 PCs as a function of the increasing biomass : MoO<sub>3</sub> mass ratio for both MoO<sub>3</sub>/TiO<sub>2</sub> and

MoO<sub>3</sub>/ZrO<sub>2</sub> catalysts. Initially, only products associated with the hydrocarbons PC are observed for both catalysts, demonstrating their capability of fully deoxygenating the primary pyrolysis vapours of pine. This behaviour is similar to that of HZSM-5 during the CFP of pine performed in the horizontal reactor-MBMS set up as reported previously.<sup>13</sup> Note that for HZSM-5, aromatic hydrocarbons such as benzene, toluene, xylene and naphthalene are produced as major products.<sup>13</sup> The intensity of the hydrocarbons PC increases until biomass : MoO<sub>3</sub> ratios of 1 and 2 are reached for MoO<sub>3</sub>/TiO<sub>2</sub> and MoO<sub>3</sub>/ZrO<sub>2</sub>, respectively, and then decreases gradually. Products associated with furans/phenols start forming at biomass : MoO<sub>3</sub> ratios of *ca.* 1 and 2 for MoO<sub>3</sub>/TiO<sub>2</sub> and MoO<sub>3</sub>/ZrO<sub>2</sub>, respectively. The proportion of the furans/phenols PC increases steadily until biomass:MoO<sub>3</sub> ratios of 5 and 6 are reached for MoO<sub>3</sub>/TiO<sub>2</sub> and MoO<sub>3</sub>/ZrO<sub>2</sub>, respectively, decreasing slightly before reaching a steady state. These data suggest that although the catalysts produce fewer fully deoxygenated products at biomass:catalyst ratios above 5, they are still active for HDO. For biomass : MoO<sub>3</sub> ratios  $\geq 5$ , the amount of furans/phenols starts to decline and the primary vapours start breaking through the catalyst bed. We hypothesise that at this point both MoO<sub>3</sub>/TiO<sub>2</sub> and MoO<sub>3</sub>/ZrO<sub>2</sub> undergo severe deactivation likely due to coke deposition on the surface and over-reduction of Mo<sup>6+</sup> species to lower oxidation states that feature lower reactivity. Note that for HZSM-5 operated in the horizontal

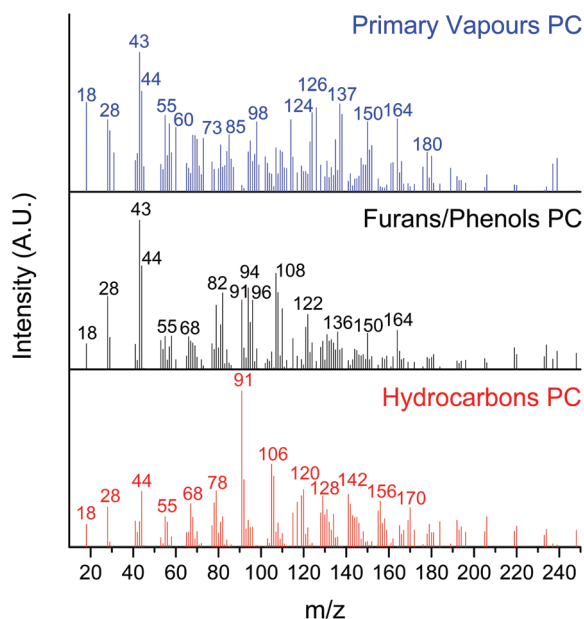


Fig. 2 Reconstructed spectra for each pure component (hydrocarbons, furans/phenols, and primary vapours) from MCR-ALS analysis in the horizontal reactor-MBMS set up. Reaction conditions: catalyst = 1.0 g MoO<sub>3</sub>/TiO<sub>2</sub>, biomass = 40 boats of 50 mg pine,  $T = 500^\circ\text{C}$ ,  $P_{\text{total}} = 1.013$  bar (50 vol% H<sub>2</sub>-He).

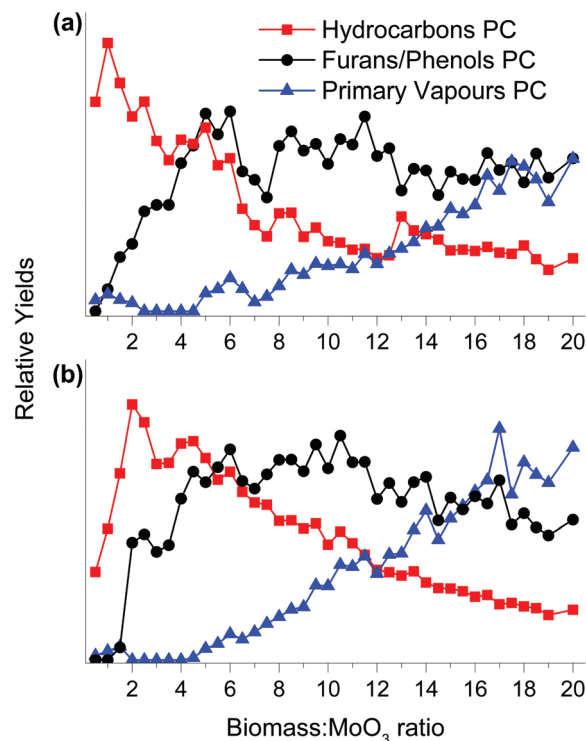


Fig. 3 Scores plot for each pure component from MCR-ALS analysis in the horizontal reactor-MBMS set up over (a) MoO<sub>3</sub>/TiO<sub>2</sub> and (b) MoO<sub>3</sub>/ZrO<sub>2</sub>. Reaction conditions: catalysts = 1.0 g, biomass = 40 boats of 50 mg pine,  $T = 500^\circ\text{C}$ ,  $P_{\text{total}} = 1.013$  bar (50 vol% H<sub>2</sub>-He).



reactor-MBMS setup, the primary vapours PC started breaking through the bed at biomass : catalyst ratios  $\leq 1$ .<sup>13,18</sup> Control experiments with bare supports showed no appreciable HDO activity, thus ascribing the observed activity to Mo species.

Bulk MoO<sub>3</sub> was tested under identical reaction conditions. Primary vapours and no HDO products were detected after pyrolysis of the 1<sup>st</sup> boat. Note that bulk MoO<sub>3</sub> was not activated under a H<sub>2</sub> flow before the reaction, and previous reports have shown that bulk MoO<sub>3</sub> undergoes an induction period during the HDO of *m*-cresol without a prior activation step.<sup>26,27</sup>

### 3.2 Tandem micropyrolyzer-GCMS

To gain further information regarding product distribution and overall mass balances attained with supported molybdenum oxide catalysts, the CFP of pine was investigated in a tandem micropyrolyzer-GCMS set up. The gas chromatograms after sequential pyrolysis of 3 boats loaded with *ca.* 0.5 mg of pine each over 40 mg of the MoO<sub>3</sub>/TiO<sub>2</sub> catalyst show that the catalyst predominantly produces aromatic hydrocarbons, alkenes and alkanes (see Fig. 4). Specifically, benzene, toluene, ethylbenzene, xylenes, propylbenzene, 1-ethyl-3-methylbenzene, trimethylbenzenes, indane, indene, naphthalene, methylnaphthalenes, dimethylnaphthalenes, propene, 2-methylpropene, butene, 2-methyl-2-butene and ethane were identified. Other than a very small amount of acetaldehyde,

acetone, butanone and furan, no other oxygenates were detected (see Table S1† for the full list of products). This product distribution remains relatively constant across the 3 boats, which corresponds to a total biomass : MoO<sub>3</sub> mass ratio of 0.375. These GCMS data are in close agreement with the MBMS data (Fig. 1(d)), indicating that when the catalyst is still fresh, it is able to fully deoxygenate the primary pyrolysis vapours to form mostly aromatic hydrocarbons and alkenes under the reported reaction conditions. In contrast to the MBMS analysis, the GCMS-based analysis helps in distinguishing structural isomers. For example, the peak at *m/z* 120 in MBMS can be separated in the GCMS into methyl-ethylbenzene, trimethylbenzene and propylbenzene. We note that, akin to the MoO<sub>3</sub>/TiO<sub>2</sub>, the MoO<sub>3</sub>/ZrO<sub>2</sub> catalyst (Fig. S3†) displayed a similar hydrocarbon product distribution across the 3 pine boats (see Table S2† for the full list of products). Similar to the MBMS experiments, control experiments with bare supports showed no appreciable HDO activity (see Fig. S4 and S5†).

Bulk MoO<sub>3</sub> was investigated for CFP of pine in the same set up. Although no products were observed after the first pine boat (see Fig. S6†), the same aromatic hydrocarbon products as those obtained with the supported MoO<sub>3</sub> catalysts were observed after the pyrolysis of the 2<sup>nd</sup> pine boat. These peaks increased in intensity as more pine boats were introduced up to a total of 4 boats. Taken together, these data suggest bulk MoO<sub>3</sub> undergoes an induction period similar to that previously reported during the CFP of cellulose<sup>33</sup> and HDO of bio-oil model compounds.<sup>26</sup> Therefore, the difference in reactivity data from the MBMS and GCMS instruments for bulk and supported MoO<sub>3</sub> catalysts could be rationalised by the favourable metal-support interaction for the latter. Indeed, Shetty *et al.* demonstrated that TiO<sub>2</sub> and ZrO<sub>2</sub> accelerate the generation and stabilisation of intermediate Mo oxidation states, which appear to promote reactivity during the HDO of *m*-cresol.<sup>27</sup>

We note that the reactivity and catalytic performance data cannot be compared quantitatively between the MBMS and the micropyrolyzer-GCMS reactor configurations, given that the reaction conditions are drastically different in both set ups. For example, the hydrogen flow rate to catalyst mass is about 18 times higher in the micropyrolyzer-GCMS system than in the horizontal reactor MBMS system. Also, although the feed is introduced in a pulse-like fashion in both systems, the frequency of these events is much lower in the micropyrolyzer-GCMS (every 30 min) compared to that used for the MBMS (every 2 min). Thus, the catalysts are exposed to greater amounts of hydrogen over a longer duration before a subsequent pulse of biomass is introduced in the micropyrolyzer-GCMS system than in the horizontal reactor-MBMS configuration. Indeed, while hydrogen is crucial for retaining HDO activity in bulk MoO<sub>3</sub>, it can also change the speciation of active species on the catalyst surface by over-reduction.<sup>25</sup> Despite these differences, both instruments generate data showing that MoO<sub>3</sub>/TiO<sub>2</sub> and MoO<sub>3</sub>/ZrO<sub>2</sub> are clearly better catalysts for CFP of pine than bulk MoO<sub>3</sub>, since they are active under both reactor conditions using only a tenth of the equi-

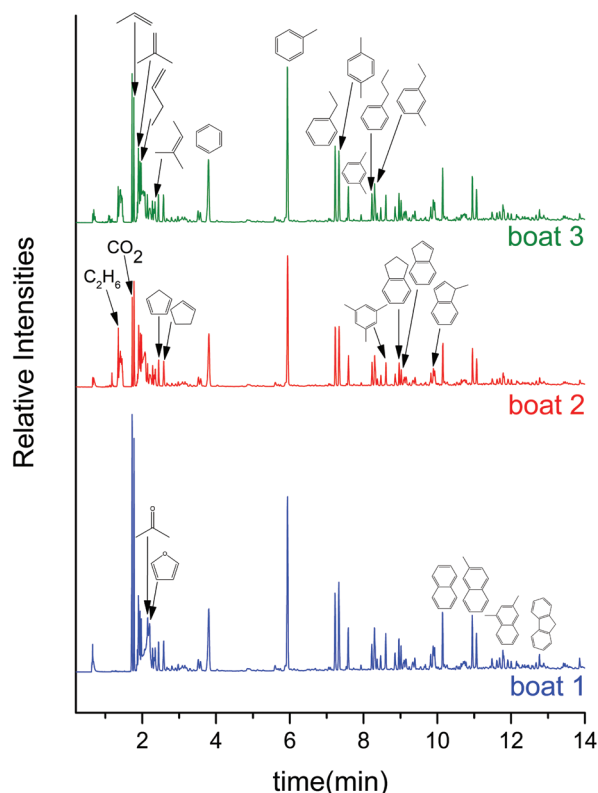


Fig. 4 GCMS chromatograms of CFP of pine over 40 mg of 10 wt% MoO<sub>3</sub>/TiO<sub>2</sub> in the tandem micropyrolyzer-GCMS set up. Reaction conditions: catalyst = 40 mg, biomass = 3 boats of 0.5 mg pine, *T* = 500 °C, *P*<sub>total</sub> = 1.013 bar (71 vol% H<sub>2</sub>-He).



valent mass of bulk  $\text{MoO}_3$ . The reactivity data also suggest that the supported  $\text{MoO}_3$  catalysts are active over a wider operating window than bulk  $\text{MoO}_3$  under the reaction conditions investigated here.

### 3.3 Quantification of products

Most of the products were identified with MS and quantified using FID while  $\text{CO}_2$  was quantified using TCD. Average product yields were obtained by pyrolysing 3 pine boats over each supported catalyst (Fig. 5). Overall, both catalysts showed similar product distributions of *ca.* 7 C% aromatic hydrocarbons, 17–19 C% alkenes, 2 C% alkanes, 3–5 C%  $\text{CO}_2$ , 7 C% coke and 39 C% char. Comparing the two supported catalysts, we note that both are equally effective for the CFP of pine as they produce equal amounts of most products, except for the slight difference (*ca.* 2%) observed in the amounts of alkenes and  $\text{CO}_2$  produced. Among the aromatic hydrocarbons, benzene and toluene are produced in similar yields and account for a total of 56–60% of the total aromatic hydrocarbon yield over both catalysts. The remaining aromatics include xylenes (10–11%), multisubstituted benzenes (14–16%), naphthalenes (9–10%) and indanes/indenenes (4–7%). Butane and ethane comprise the majority of the alkanes (67–80%), while propene is the predominant alkene (62–69%). The remaining alkenes are butene (14%), methylbutene

(4–5%), methylpropene (5%), cyclopentadiene (2–4%), cyclopentene (3–4%), ethylene (2%) and pentene (2–3%).  $\text{CO}$  and  $\text{CH}_4$  are the other light gases. A detailed list of the identified products is shown in Table S3.† Coke yield was determined by CHNS analysis of several spent catalyst samples. The char content was measured by averaging the weight of pine remaining after pyrolysis across 10 boats. An independent elemental analysis of char revealed that it contained approximately 85% carbon. A very small fraction of oxygenates (<0.5 C%) was observed only for  $\text{MoO}_3/\text{TiO}_2$ , including acetone, acetaldehyde, butanone and furan. Overall, the carbon balance is in the range of 80%. The unaccounted carbon could have been either lost during condensation of the light gases in the liquid nitrogen trap or some of the coke could have been scavenged by a hydrogen flow between successive pulses of biomass. Assuming a 60% mass yield of pyrolysis vapours from pine pyrolysis<sup>13</sup> (*i.e.*, excluding char and light gases) and similar carbon composition as pine, the catalysts can be assessed for their effectiveness to perform HDO. Both supported  $\text{MoO}_3$  catalysts yield about 12 C% aromatic hydrocarbons, 31 C% alkenes, 4 C% alkanes, 6 C%  $\text{CO}_2$  and 12 C% coke based on the carbon content of the pyrolysis vapours. These values translate to >40 C% of upgraded products for supported Mo catalysts when char is excluded. Overall, both  $\text{MoO}_3/\text{TiO}_2$  and  $\text{MoO}_3/\text{ZrO}_2$  showed similar product distributions during CFP of pine. They produced *ca.* 30 C% hydrocarbon products, with the remaining carbon in the form of  $\text{CO}_2$ , char and coke on the catalysts. Although the upgrading temperature used in this study is 100 °C higher than that used by Nolte *et al.* during the CFP of corn stover over bulk  $\text{MoO}_3$ , the product distributions are similar.<sup>33</sup> Importantly, in contrast to bulk  $\text{MoO}_3$ , supported  $\text{MoO}_3$  catalysts are capable of working at high biomass: catalyst ratios without requiring a hydrogen pre-activation step.

In order to assess the performance of the supported  $\text{MoO}_3$  catalysts with respect to state-of-the-art HZSM-5 catalysts, the zeolite was tested under identical CFP reaction conditions (Fig. 5). HZSM-5 yielded 17 C% aromatic hydrocarbons, 6 C% alkenes, 6 C%  $\text{CO}_2$ , 12 C% coke and 39 C% char. Overall, HZSM-5 produced *ca.* 23 C% hydrocarbon products, comparable to the hydrocarbon yield from supported  $\text{MoO}_3$  catalysts (*ca.* 27 C%). A full list of products identified is shown in Table S3.† These results are comparable to those obtained by Thangalazhy-Gopakumar *et al.*<sup>38</sup> and Wang *et al.*<sup>39</sup> for the *ex situ* CFP of pinewood chips and hybrid poplar, respectively, over HZSM-5 in a micropyrolyzer set up under reaction conditions (Table S4†) similar to those used in this study. Although supported  $\text{MoO}_3$  catalysts produced less aromatic hydrocarbons than HZSM-5, the combined selectivities to BTX (67–70%) were higher than those obtained with HZSM-5 (51%) in this study. Furthermore, the supported  $\text{MoO}_3$  catalysts produced about 3 times more olefins than HZSM-5. These olefins are valuable as they can be further treated with aromatics to form more useful alkylated aromatic products. As expected, HZSM-5 also showed a higher propensity to coking (12 C%) than supported  $\text{MoO}_3$  catalysts (7 C%). Although the reaction

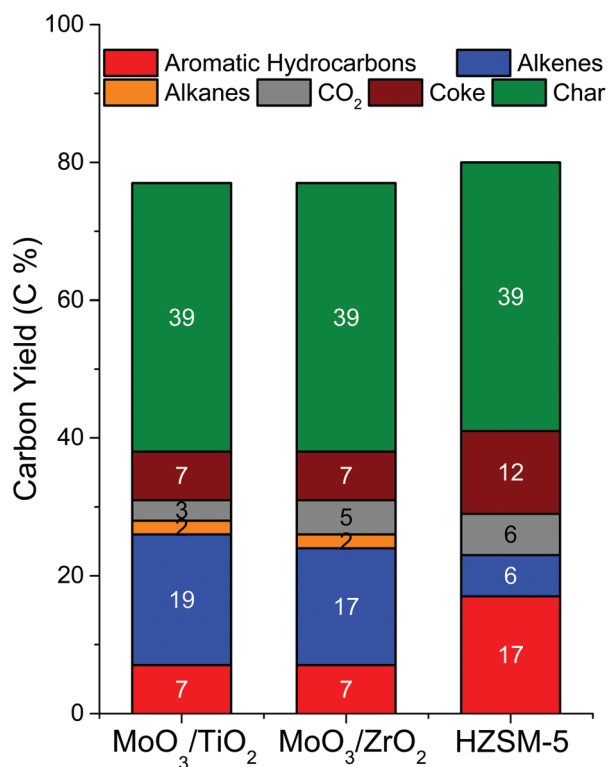


Fig. 5 Average product distribution from CFP of pine over  $\text{MoO}_3/\text{TiO}_2$ ,  $\text{MoO}_3/\text{ZrO}_2$  and HZSM-5 in the tandem micropyrolyzer–GCMS system. Reaction conditions: catalysts = 40 mg of  $\text{MoO}_3/\text{TiO}_2$  and  $\text{MoO}_3/\text{ZrO}_2$ , 30 mg of HZSM-5, biomass = 3 boats of 0.5 mg pine,  $T = 500$  °C,  $P_{\text{total}} = 1.013$  bar (71 vol%  $\text{H}_2$ –He).



conditions were kept identical across the supported  $\text{MoO}_3$  and HZSM-5 catalysts, the effective catalyst mass used was different (4 mg  $\text{MoO}_3$  in supported  $\text{MoO}_3$  catalysts vs. 24 mg HZSM-5 in HZSM-5/ $\text{SiO}_2$ ) to obtain comparable conversions. Taken together, these results indicate that supported  $\text{MoO}_3$  catalysts are indeed promising alternative CFP catalysts to zeolites as they can operate at high biomass:catalyst ratios and produce hydrocarbons under mild conditions with yields comparable to those obtained with state-of-the-art catalysts.

### 3.4 Post-reaction characterisation

The catalysts were characterised post-reaction to reconcile the differences in reactivity observed in both reactor setups. PXRD patterns of fresh and spent  $\text{MoO}_3/\text{TiO}_2$ ,  $\text{MoO}_3/\text{ZrO}_2$  and bulk  $\text{MoO}_3$  are shown in Fig. 6, S7,<sup>†</sup> and Fig. 7, respectively. Only  $\text{MoO}_3/\text{TiO}_2$  and bulk  $\text{MoO}_3$  show appreciable changes in the PXRD patterns after the reaction. Fresh  $\text{MoO}_3/\text{TiO}_2$  features mostly peaks corresponding to the support  $\text{TiO}_2$  but two additional peaks are observed at  $2\theta = 23.7^\circ$  and  $34.2^\circ$  associated with crystalline  $\text{MoO}_3$  clusters. These diffractions disappear after the reaction in both reactors, similar to the PXRD diffractions observed after HDO of *m*-cresol.<sup>27</sup> Although no diffractions associated with molybdenum oxycarbohydride ( $\text{MoO}_x\text{C}_y\text{H}_z$ ) are detected, their presence cannot be ruled out given that these species might be below the detection limit of the diffractometer.

The PXRD patterns for spent bulk  $\text{MoO}_3$  from the MBMS experiment feature peaks associated with fully oxidised  $\text{MoO}_3$ . We note that  $\text{MoO}_3$  was not activated under  $\text{H}_2$  thus explaining the lack of catalytic activity (Fig. 7). In contrast, after the reaction in the microreactor–GCMS set up, only diffractions corresponding to  $\text{MoO}_2$  and metallic Mo are present. These results are consistent with the previously observed phase transformation of bulk  $\text{MoO}_3$  to a mixture of  $\text{MoO}_2$  and molybdenum oxycarbohydride ( $\text{MoO}_x\text{C}_y\text{H}_z$ ) during the HDO of

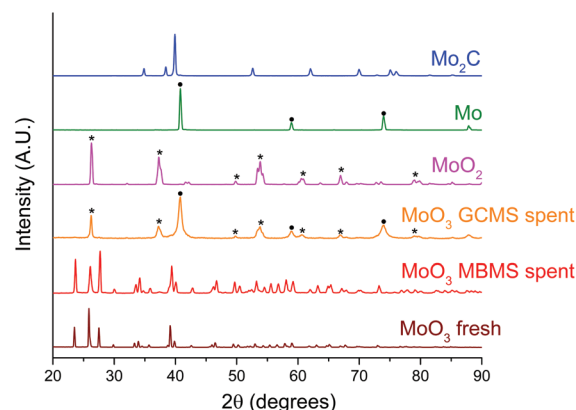


Fig. 7 Normalised PXRD patterns of the spent bulk  $\text{MoO}_3$  catalysts in comparison with fresh  $\text{MoO}_3$ ,  $\text{MoO}_2$ , Mo and  $\text{Mo}_2\text{C}$  samples. The symbol (\*) and (●) indicates the peak assignment corresponding to  $\text{MoO}_2$  and Mo respectively. The spent bulk  $\text{MoO}_3$  sample from microreactor–GCMS setup was retrieved after the experiment shown in Fig. S6.<sup>†</sup>

*m*-cresol.<sup>26</sup> However, since the temperature in this study is 180 °C higher than that used for the HDO of *m*-cresol, the full reduction of  $\text{MoO}_3$  to metallic Mo without the presence of oxycarbohydride or carbide peaks is expected.

XPS spectra were acquired to determine the oxidation states of the supported molybdenum oxide catalysts (Fig. 8). Pre-reaction spectra show only peaks associated with  $\text{Mo}^{6+}$  valence states, while after reaction, both catalysts show the presence of  $\text{Mo}^{5+}$  states, and, for  $\text{MoO}_3/\text{TiO}_2$ , a  $\text{Mo}^{3+}$  state as assigned by Choi *et al.*<sup>40</sup> Both catalysts show that ca. 50% of Mo species on the surface exist in their intermediate oxidation states ( $\text{Mo}^{5+}$  and  $\text{Mo}^{3+}$ ). Such distribution of oxidation states on the supported catalysts is very similar to that observed for the same catalysts after the HDO of *m*-cresol.<sup>27</sup> Taken together, these

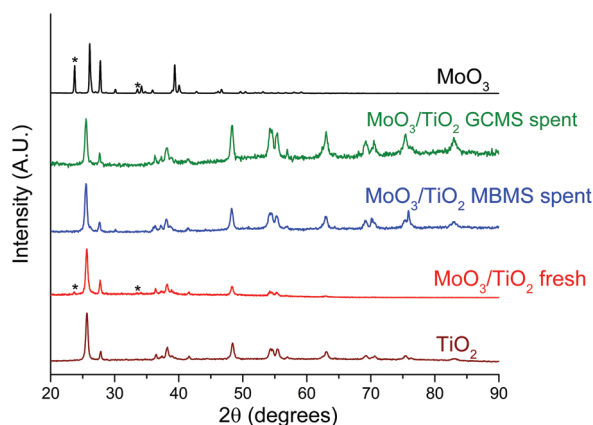


Fig. 6 Normalised PXRD patterns of the fresh and spent  $\text{MoO}_3/\text{TiO}_2$  catalysts in comparison with fresh  $\text{TiO}_2$  and  $\text{MoO}_3$  samples. The spent  $\text{MoO}_3/\text{TiO}_2$  samples from both reactor systems were obtained at the end of the experiments shown in Fig. 3(a) and 4.

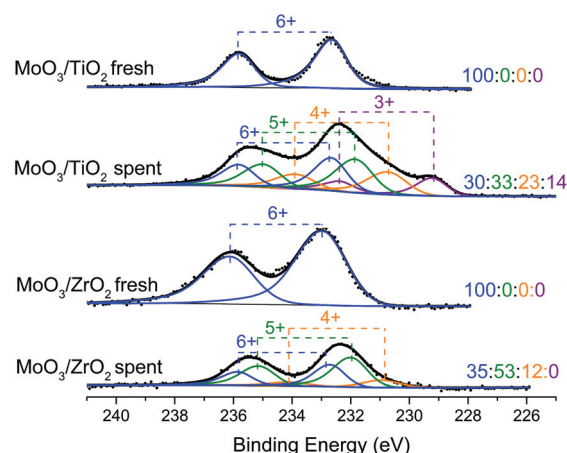


Fig. 8 XPS spectra showing the Mo (3d) binding energy region of fresh and spent  $\text{MoO}_3/\text{TiO}_2$  and  $\text{MoO}_3/\text{ZrO}_2$  from the horizontal reactor–MBMS system. The spent catalysts were retrieved at the end of the experiments shown in Fig. 3. The ratios displayed correspond to the proportion of oxidation states  $\text{Mo}^{6+}$ ,  $\text{Mo}^{5+}$ ,  $\text{Mo}^{4+}$ , and  $\text{Mo}^{3+}$  respectively.





data suggest that the prevalence of  $\text{Mo}^{5+}$  and  $\text{Mo}^{3+}$  could lead to higher HDO activity and on-stream stability even after the catalyst observes a biomass :  $\text{MoO}_3$  ratio of 20. Since the reactivity data from the horizontal reactor-MBMS set up is not quantitative, a semi-quantitative approach was used to gain insight on the deactivation kinetics. The relative yields for hydrocarbons, furan/phenols and primary vapours PCs (Fig. 3) were normalized by their total sum to determine the fractional conversion of primary vapours to hydrocarbons/furans/phenols. The deactivation rates for both catalysts follow a first order deactivation model (see Fig. S8†). This deactivation behaviour is consistent with our observations from previous studies on the HDO of model compounds.<sup>25–27</sup> A first order deactivation profile is strong evidence that coking is responsible for the observed loss in activity.<sup>41</sup> However, we note that this analysis is semi-quantitative in nature and further studies are needed to obtain quantitative deactivation rates and to determine the exact nature of coke deposits on the catalyst surface.

### 3.5 Potential industrial scale application

The current study was performed to show that supported  $\text{MoO}_3$  catalysts can serve as alternative upgrading catalysts to zeolites (e.g., HZSM-5) and that they can be indeed used for the CFP of lignocellulosic biomass. Although our direct comparison results (Fig. 5 and Table S3†) show that more favourable catalyst-to-biomass ratios can be achieved with these Mo-based catalysts when compared to zeolites, this ratio needs to be optimised further. The catalyst lifetime can be prolonged when it is operated in a FCC-like fluidized bed system where the vapour residence time is minimised to prevent secondary reactions, which can lead to excessive coking on the catalyst surface. Supported  $\text{MoO}_3$  catalysts can be regenerated by simple calcination in air.<sup>27</sup> The FCC-like reactor system typically has a regenerator, which burns off the coke and regenerates the catalyst, which can then be recycled back into the *ex situ* CFP reactor.<sup>42,43</sup> This mode of operation lowers the cost associated with purchasing a fresh catalyst. Moreover, supported  $\text{MoO}_3$  is also an economical catalyst that can be manufactured at scale. The current price for bulk  $\text{MoO}_3$  is ca. \$0.02 per gram.<sup>44</sup> We note that sulphided cobalt molybdenum (CoMo) and nickel molybdenum (NiMo) catalysts supported on  $\text{Al}_2\text{O}_3$  are already being synthesised and used industrially in hydrodesulphurisation of petroleum fractions.<sup>42</sup> These catalysts are initially synthesised in oxide forms, and presulphided to obtain sulphides prior to reaction.<sup>42</sup> In contrast to zeolite catalysts, however, these supported  $\text{MoO}_3$  catalysts have not been formulated into attrition-resistant pellets compatible with FCC-like fluidized bed reactors.<sup>43</sup> Further studies in this direction will be critical in optimising the catalyst performance before being used industrially. Process parameters<sup>45</sup> such as temperature, biomass : catalyst ratio, biomass residence time, pyrolysis vapour residence time and catalyst regeneration conditions also need to be optimised prior to scale-up.<sup>43</sup>

## 4. Conclusions

Supported molybdenum oxide catalysts,  $\text{MoO}_3/\text{TiO}_2$  and  $\text{MoO}_3/\text{ZrO}_2$ , are effective HDO catalysts capable of producing olefins and aromatic hydrocarbons from the CFP of pine. As the cumulative biomass to  $\text{MoO}_3$  mass ratio exposed to the catalytic bed increases, the catalysts become less effective for HDO, forming partially deoxygenated intermediates such as furans and phenols. Though the primary pyrolysis vapours break through at biomass : catalyst ratios  $\geq 5$ , the catalysts remain active for HDO, as furans, toluene and phenols were observed even at a biomass :  $\text{MoO}_3$  ratio of 20. Both supported catalysts yielded about 30 C% hydrocarbon products, which are comparable yields to those obtained with HZSM-5 operated under similar reaction conditions. Supported  $\text{MoO}_3$  catalysts are more effective CFP catalysts than bulk  $\text{MoO}_3$ . Post-reaction XPS analyses of the supported catalysts reveal that about half of the Mo surface species exist in their intermediate oxidation states ( $\text{Mo}^{3+}$  and  $\text{Mo}^{5+}$ ), which could explain the higher reactivity and stability as compared to bulk  $\text{MoO}_3$ . Catalyst deactivation is likely associated to coking. Optimising the CFP reaction conditions as well as tuning the synthesis of the supported  $\text{MoO}_3$  catalysts are important parameters for improving HDO performance.

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