

**Research Article** 

# Mechanisms of isomerization and hydration reactions of typical $\beta$ -diketone at the air-droplet interface

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#### ABSTRACT

Acetylacetone (AcAc) is a typical class of  $\beta$ -diketones with broad industrial applications due to the property of the keto-enol isomers, but its isomerization and chemical reactions at the air-droplet interface are still unclear. Hence, using combined molecular dynamics and quantum chemistry methods, the heterogeneous chemistry of AcAc at the air-droplet interface was investigated, including the attraction of AcAc isomers by the droplets, the distribution of isomers at the air-droplet interface, and the hydration reactions of isomers at the air-droplet interface. The results reveal that the preferential orientation of two AcAc isomers (keto- and enol-AcAc) to accumulate and accommodate at the acidic air-droplet interface. The isomerization of two AcAc isomers at the acidic air-droplet interface is more favorable than that at the neutral air-droplet interface because the "water bridge" structure is destroyed by  $H_3O^+$ , especially for the isomerization from keto-AcAc to enol-AcAc. At the acidic air-droplet interface, the carbonyl or hydroxyl O-atoms of two AcAc isomers display an energetical preference to hydration. Keto-diol is the dominant products to accumulate at the air-droplet interface, and excessive keto-diol can enter the droplet interior to engage in the oligomerization. The photooxidation reaction of AcAc will increase the acidity of the air-droplet interface, which indirectly facilitate the uptake and formation of more keto-diol. Our results provide an insight into the heterogeneous chemistry of  $\beta$ -diketones and their influence on the environment.

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#### Introduction

Oxygenated volatile organic compounds (OVOCs) play an important role in tropospheric chemistry, contributing to the formation of secondary pollutants (ozone and peroxyacetyl nitrate) and secondary organic aerosol (SOA), with implication for air quality, human health, and climate change (Han et al., 2019). The photooxidation of some low-carbon OVOCs can yield extra OVOCs with a larger molecular weight (Zhang et al., 2019), which significantly affect the ability of environmental oxidation (Emmerson et al., 2005; Min et al., 2011; Edwards et al., 2014; Xue et al., 2016). Ketones serve as an important class of OVOCs, with the primary sources involving direct emissions from nature and anthropogenic (such as industrial activities) and secondary production from the environment oxidation of hydrocarbons (Atkinson and Arey, 2003; Romero et al., 2005; Liu et al., 2009; Ji et al., 2018; Brewer et al., 2020). The dominant chemical sink of ketones is photolysis to yield HO<sub>x</sub> radicals (such as OH and HO<sub>2</sub>) (Arnold et al., 2004; Blitz et al., 2004; Romero et al., 2005) or reaction with the atmospheric oxidants (such as OH and  $O_3$ ) (Ji et al., 2018; Bedjanian, 2019; Cheramangalath Balan and Rajakumar, 2019; Ji et al., 2020; Chen et al., 2022). Some recent results have shown that most of ketones can enter the aqueous phase or stay at the air-aqueous interface for the oligomerization and photooxidation reactions due to their highly water-soluble, leading to the formation of fine particulate matter (Chen et al., 2008; Kua et al., 2011; Renard et al., 2013; Herrmann et al., 2015; Ji et al., 2020; Mehrani et al., 2021; Ji et al., 2022). β-Diketones are different from conventional aliphatic ketones, since β-diketones simultaneously exist keto-enol isomers due to the isomerization within molecule. Therefore,  $\beta$ -diketones are widely used as organic reagents, catalysts, and chelating ligands in industrial activities, healthcare, perfume, and cosmetics industries due to their structural characteristics (Li et al., 2016). Therefore, some studies paid attention to the form of  $\beta$ -diketones isomers in the environment and the influence factors (Spencer et al., 1982; Folkendt et al., 1985; Ishida et al., 1999; Yamabe et al., 2004; Alagona et al., 2010; Verma et al., 2014; Li et al., 2016). For example, a larger proportion of ketonic isomer in the aqueous phase was found relative to enolic isomer (Spencer et al., 1982) and ketonic isomer is more soluble in polar solvents than the enolic isomer due to a large polarity of ketonic isomer (Ishida et al., 1999). In addition, the chemical oxidation of  $\beta$ -diketonesis complicated and limited by the keto-enol tautomerism (Shouminng et al., 2008; Verma et al., 2014; Kampf et al., 2016; Wu et al., 2016; Ji et al., 2018; Ji et al., 2020), thereby affecting to understand their environment chemical behaviour.

In contrast to the isomerization of  $\beta$ -diketones, limited previous work exists on the aqueous chemistry of  $\beta$ -diketones, hindering accurate assessment of their roles in the environment. In particular, the air-droplet interface chemistry plays a significant role in the field of environmental implications (Pillar-Little et al., 2014; Li et al., 2016; Zhong et al., 2018; Song et al., 2019; Zhang et al., 2019, 2023; Jiang et al., 2020; Ruiz-Lopez et al., 2020; Shi et al., 2020a; Wang et al., 2021; Martins-Costa et al., 2022; Tan et al., 2022a; Gruca-Rokosz et al., 2017). Many chemical reactions rapidly occur at the air-aqueous interface via the different mechanisms relative to the reactions in the aqueous or gas phase, affecting the atmospheric budget of trace gases (Li et al., 2016; Jorgensen and Gross, 2009). In addition, the maximum effective interface area is from 0.3 to 60  $m^2/m^3$  in environment (George et al., 2015) to attract and adsorb atmospheric trace gases. Hence, the existence of an enough large area suggests that the air-droplet interface chemistry plays a significant role in environment. A recent study has shown that the formation of BrC products is involved by both keto-enol isomers of  $\beta$ -diketones, leading to the resulting complexity of BrC products, and some of these BrC products can give rise to photosensitization reactions to further promote photochemical reactions (Kampf et al., 2016). Therefore, it is necessary to systematically study the isomerization of β-diketones at the air-droplet interface and the subsequent chemical reaction mechanisms.

In this work, we investigated the isomerization and the subsequent hydration mechanisms of typical  $\beta$ -diketones at the air-droplet interface by combining molecular dynamics (MD) simulation and quantum chemical (QC) calculation. Herein, acetylacetone (AcAc) was selected as the model of  $\beta$ diketones because AcAc was widely detected in environment of developed countries (Japan, America and Europe) and developing countries (China), with its concentration in environment of the parts-per-billion (ppb) level (Ji et al., 2018). The free energy changes with the transformation of the AcAc isomers from the air phase to the droplet interior were calculated and compared at the neutral and acidic air-droplet interfaces. The distribution and proportion of the AcAc isomers in the air phase and droplet interface and interior were assessed. The isomerization and subsequent hydration mechanisms of the keto- and enol-AcAc at the air-droplet interface were explored, and the implications of the hydration and photooxidation reactions at the air-droplet interface and aqueous-phase hydration reaction on the contribution of environment were discussed.

#### 1. Methods

#### 1.1. Classical molecular dynamics simulations

All classical molecular dynamics (MD) simulations were performed using the NAMD software package (Phillips et al., 2005), and all dynamical configurations were visualized via VMD software (Humphrey et al., 1996). Since the nucleation of the sub-3-nanometer particle is the critical step of aerosol formation (Yao et al., 2018), the neutral and acidic droplet models with 2.5  $\times$  2.5  $\times$  2.5  $nm^3$  size were constructed. The number of 499 water molecules was used to simulate the neutral droplet because the density of water is 1.0 g/cm<sup>3</sup> and the same water molecules were used in the 24.662  $\times$  24.662  $\times$  24.662  ${\rm \AA^3}$ in the previous studies (Martins-Costa et al., 2012; Shi et al., 2020b). In addition, sulfuric acid solution with 30 wt.% concentration was selected to emulate the acidic droplet, because the atmospheric aerosol exhibits the moderate acidity (Margarella et al., 2013) and the concentration of the sulfuric acid is less than 60 wt.% (Curtius et al., 2001; Zhang et al., 2021). According to the dissociation of sulfuric acid in the experimental study (Margarella et al., 2013), the number of 420

water, 45 hydronium, 23 bisulfate and 11 sulfate ions was determined. The initial positions of the corresponding molecules involved in the neutral and acidic droplets were constructed, respectively, via PACKMOL procedure (Martínez et al., 2009). Subsequently, a 1000 steps optimization and 2.5 ns equilibrium at a time step of 0.5 fs were carried out successively in the isothermal-isochoric (NVT) ensemble and isothermalisobaric (NPT) ensemble to ensure the stability of the neutral and acidic droplet models. N, V, T and P represent the number of atoms, volume, temperature (T = 298 K), and pressure (P = 1 bar), respectively. A vacuum layer of 30 Å was added at the equilibrated droplet models along the z-axis direction to simulate the atmospheric process for gaseous acetylacetone (AcAc) approaching into the aqueous phase. In the simulation, the TIP3P, OPLS-AA and CHARMM force fields are determined for water, involved ions and AcAc, respectively. The periodic boundary condition was applied in three dimentions, and a 12 Å cut-off distance was used for Lennard-Jones and real space coulombic interactions. The free-energy profiles of AcAc migrating from the air phase to aqueous phase were obtained by using the umbrella sampling (Torrie and Valleau, 1977; Becke, 1988) and weighted histogram analysis method (WHAM) (Liu et al., 2017). AcAc was initially placed at 2.0 nm above the center of mass (COM) of the neutral and acidic droplets. In the umbrella sampling, 21 windows were set and AcAc moves distance of 1.0 Å each time. The trajectory was carried out for 500 ps at each new position of AcAc. On the other hand, a 50 ns NVT simulation for unfixed AcAc at the zdirection was performed to assess the probability distribution of AcAc in the air phase and droplet interface and interior.

#### 1.2. Born-oppenheimer MD simulations

To clarify the isomerization and hydration reaction mechanisms of AcAc at the air-droplet interface, the Born-Oppenheimer MD (BOMD) simulations based on the density functional theory (DFT) method were carried out in the CP2K software package (VandeVondele et al., 2005). The exchange and correlation interactions were treated with Becke-Lee-Yang-Parr (BLYP) functional (Lee et al., 1988). The double- $\zeta$  Gaussian basis set (DZVP) combined with an auxiliary basis set (VandeVondele and Hutter, 2007) and the Goedecker-Teter-Hutter (GTH) norm-conserved pseudopotentials (Goedecker et al., 1996; Hartwigsen et al., 1998) were used to treat the valence and the core electrons. The Grimme's dispersion correction (DFT-D3) method was adopted to explain the weak dispersion interactions (Grimme, 2004, 2006). A cutoff energy of 280 Rydberg was programmed for the plane wave basis set, and 40 Rydberg was adopted for the Gaussian basis set. The radii of neutral and acidic droplet models were 4.3 Å (Zhong et al., 2017, 2019; Li et al., 2021). In addition, the models with radii of 3.3 and 6.0 Å were also established to prove the selected model's insensitivity to free energy calculation, the details of illustration were presented in Appendix A Fig. S1. The models were placed in cubic boxes greater than 20 Å, which are large enough to eliminate the interaction of adjacent repeat units. Firstly, the droplet models were pre-optimized for 4-5 ps using BOMD simulation to guarantee system stability, and then AcAc molecule was randomly placed above the airdroplet interface. All BOMD simulations were implemented in

NVT ensemble and the temperature was maintained at 298 K using a Nose-Hoover chain thermostat. The integration step was set to 1.0 fs, which has been proved to achieve good performance for the air-droplet interface reaction (Zhong et al., 2015; Kumar et al., 2017; Tan et al., 2022b). In order to accelerate the some reactions of AcAc at the air-droplet interface, the metadynamics (MTD) simulation was used to calculate the activation free energy (Ensing et al., 2006; Laio and Gervasio, 2008). For each free energy calculation, three sets of parallel metadynamics simulations were conducted to avoid inaccurate results by the instability of the initial configuration. Subsequently, the mean values of the free energies for three sets of simulations were taken to act as the final free energy values discussed. The details of MTD simulation were presented in the Appendix A Supplementary data.

#### 1.3. Quantum mechanical calculations

All the geometric optimization and energy calculation for aqueous-phase reactions were performed using Gaussian 09 (Frisch et al., 2013) package suite. The geometric optimization of all stationary points (SPs), including reactants, complex, transition states (TSs), and products, was carried out using the hybrid density functional M06-2X method (Zhao and Truhlar, 2008) with the 6-311G(d,p) basis set (Ji et al., 2017). The method of solvation model based on solute electron density (SMD) (Marenich et al., 2009) was also applied to consider the aqueous effect. The harmonic vibrational frequencies of SPs were calculated to confirm that whether SP is a TS (with only one imaginary frequency) or a minimum (without imaginary frequencies). The intrinsic reaction coordinate (IRC) calculation was performed to confirm that TSs accurately connect with corresponding reactants and products. Based on the above geometries of SPs, single-point energy calculations were further conducted at the M06-2X/6-311+G(3df,3pd) level to refine the energetics and obtain more accurate potential energy surfaces.

#### 2. Results and discussion

## 2.1. Gaseous acetylacetone approaching the air-droplet interface

According to the previous studies (Ji et al., 2018), there is an equilibrium between ketonic and enolic isomers of acetylacetone (denoted as *keto*-AcAc and *enol*-AcAc, respectively). Appendix A Fig. S2 presents the relative concentration distribution profiles of *keto*- and *enol*-AcAc from the air phase to the neutral and acidic droplets. As shown in Appendix A Fig. S2, the relative concentration of neutral and acidic droplets sharply changes from 8.5 to 15.0 Å and 8.0 to 15.0 Å, respectively. Hence, the interfacial width of air and the neutral droplet and that of air and the acidic droplet are estimated to be 6.5 and 7.0 Å, respectively, which can accommodate and adsorb *keto*- and *enol*-AcAc.

The free-energy distribution profiles shown in Appendix A Fig. S3 reveal that the interfaces of the neutral and acidic droplets exhibit the preference to accommodate *keto-* and *enol-*AcAc. To quantify the ability of the interface to adsorb and

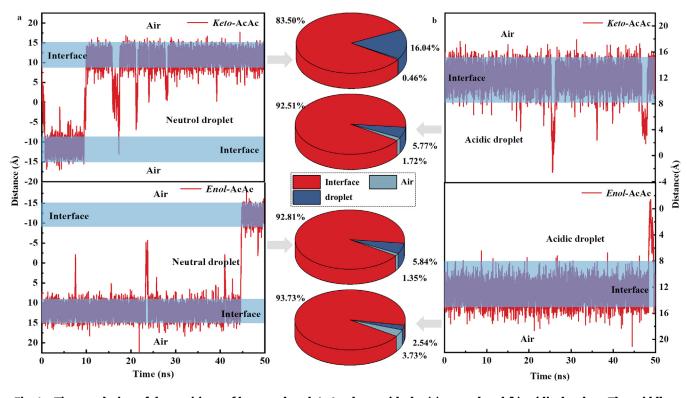


Fig. 1 – Time evolution of the positions of keto- and enol-AcAc along with the (a) neutral and (b) acidic droplets. The middle data are the corresponding percentages in the air, interface, and interior regions of the droplet.

accommodate two AcAc isomers, the free-energy differences ( $\Delta G$ ) of gaseous AcAc to the interface (air $\rightarrow$ interface, Process 1) and the interface to the bulk water (interface $\rightarrow$ aqueous, Process 2) are defined as  $\Delta G(Process 1) = G_{interface} - G_{air}$  and  $\Delta G(Process2)$  =  $G_{aqueous}$  -  $G_{interface},$  respectively, where  $G_{air}$ represents the maximum values in the air phase (a and a' points in Appendix A Fig. S3), G<sub>interface</sub> refers to the minimum values at the interface (b and b' points in Appendix A Fig. S3), and Gaqueous corresponds to the stable values of keto- or enol-AcAc in the interior region of droplet (c and c' points in Appendix A Fig. S3). The  $\Delta G$  value reflects the above two processes are endothermic or exothermic (Shi et al., 2020a). For the acidic droplet, the  $\Delta G_{air \rightarrow interface}$  values of keto- and enol-AcAc are -7.49 and -5.99 kcal/mol, respectively, which are more negative than the corresponding values in the neutral droplet. Also, their  $\Delta G_{\text{interface} \rightarrow \text{aqueous}}$  values of 3.70 and 3.08 kcal/mol, respectively, are larger than those in the neutral droplet. It indicates that AcAc prefers to be adsorbed to the acidic airdroplet interface if AcAc molecules collide with the droplets.

Fig. 1 shows the time evolution of the positions (z coordinate) of keto- and enol-AcAc in the neutral and acidic droplets in every residence event. The probabilities of ketoand enol-AcAc staying at the acidic air-droplet interface are presented at 92.51% and 93.73% of the whole simulated time (Fig. 1a), respectively, in line with the analysis of the free energy calculations mentioned above. The duration time of keto-AcAc in the interior region of acidic air-droplet interface accounts for 5.77% of the whole simulated time, which is two times larger than that of enol-AcAc (Fig. 1a), attributable to the stronger polarity of keto-AcAc than enol-AcAc in the bulk water (Ishida et al., 1999). That is, for  $\beta$ -diketones, the ketonic and enolic isomers are prone to accumulate at the air-droplet interface, especially at the acidic air-droplet interface; while relative to the enolic isomer, the ketonic isomer prefers to stay in the interior region of the droplet.

#### 2.2. Isomerization between keto- and enol-AcAc

The isomerization of  $\beta$ -diketones can affect the interpretation of chemical mechanisms occurring on the nanoparticle interfaces. Therefore, to clarify the distribution of keto- and enol-AcAc at the air-droplet interfaces, we investigated the isomerization reactions between keto- and enol-AcAc at the neutral and acidic air-droplet interface. Fig. 2 shows the free-energy landscape and the schematic diagram of the corresponding structures for the isomerization from keto-AcAc to enol-AcAc. Appendix A Fig. S4 displays the time variation of bond lengths between relevant atoms of the isomerization. Appendix A Fig. S4 suggests that the small water clusters are formed around AcAc to mediate the isomerization. There are three-step reactions in the isomerization from keto-AcAc to enol-AcAc (Appendix A Fig. S4a): the first H-shift from keto-AcAc to water molecule (R1), the second H-shift in the water cluster (R2), and the enol-AcAc formation from the third H-shift (R3).

For R1 (along blue dashed arrow), the methylene H atom ( $H_{\rm K}$ 1) of *keto*-AcAc is transferred to the first water molecule (W1) to form a H-bond ( $H_{\rm K}$ 1-O<sub>W1</sub>) at 6.12 ps, with the  $H_{\rm K}$ 1-O<sub>W1</sub> distance of 2.00 Å. Subsequently, a maximum of free energy (27.00 kcal/mol) is observed at 7.02 ps, corresponding to form the  $H_{\rm K}$ 1-O<sub>W1</sub> bond and break the  $C_{\rm K}$ 1- $H_{\rm K}$ 1 bond in *keto*-AcAc,

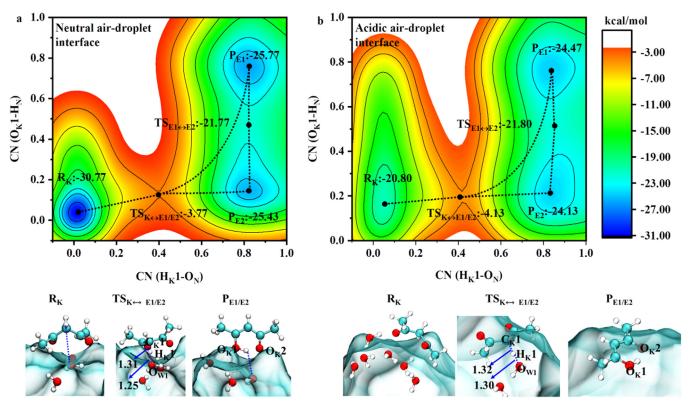


Fig. 2 – Free energy landscapes and the schematic diagrams of the corresponding structures in the isomerization of keto-AcAc to enol-AcAc at the (a) neutral and (b) acidic air-droplet interfaces. R, TS and P represent reactants, transition states and products, respectively.

suggesting the transition state formation. The lengths of the  $H_{K}1-O_{W1}$  and  $C_{K}1-H_{K}1$  bonds in the transition-state are 1.25 and 1.31 Å, respectively (Fig. 2a). As for R2 (from 7.03 to 7.21 ps, along green dashed arrow), an extra H-shift reaction proceeds via the second water (W2) to the third water (W3) to yield hydronium ion ( $H_3O^+$ ). For R3 (along yellow dashed arrow), the shift of  $H_{W3}$ 1 atom to the carbonyl O atom of keto-AcAc (O<sub>K</sub>1/2) yields enol-AcAc, and the system reaches equilibrium at 7.22 ps. As shown in Fig. 2a, two local minimums of the free energies are observed because the H atom is moved between carbonyl and hydroxyl O atoms, corresponding to one enol-AcAc formation. It implies that *enol*-AcAc has a conjugated  $\pi$ electron character and enhances the stability of enol-AcAc. As discussed above, R2 acts as a "bridge" between R1 and R3, suggesting that the presence of a water-loop-structure has a catalytic effect on the isomerization from keto-AcAc to enol-AcAc.

However, no water-loop-structure event at the acidic airdroplet interface is observed in the isomerization because of two water clusters around AcAc. As shown in Appendix A Fig. S4b, one two-water cluster engages in the first H-shift to form keto-anion (R1, in blue dashed arrow), and one three-water cluster simultaneously participates in the second H-shift to yield  $H_3O^+$  (R2, in green dashed arrow). The  $H_3O^+$  formed in R2 is transferred to keto-anion in R1 to form *enol*-AcAc (R3, yellow dashed arrow). A transition state-like structure is observed at 8.96 ps, with the corresponding free-energy barrier of 16.67 kcal/mol (Fig. 2b), which is 10.33 kcal/mol lower than that at the neutral air-droplet interface. It is explained by the proton affinity ( $\Delta PA$ ) of H<sub>2</sub>O according to that  $\Delta PA$  increases with increasing the numbers of water molecules (n), since at n more than 3, the  $\Delta PA$  of H<sub>2</sub>O + H<sub>3</sub>O<sup>+</sup> reaction is larger than that of *enol*-AcAc + H<sub>3</sub>O<sup>+</sup> reaction (Mauney et al., 2017). Combined with the analysis of Section 2.1, it implies that *enol*-AcAc is enhanced in favor of the enolic isomer at the acidic air-droplet interface relative to the neutral air-droplet interface.

### 2.3. Hydration reactions of AcAc at the air-droplet interface

Considering the results mentioned above and the acidity in real aerosols, we focus on investigating the hydration reaction of *enol*-AcAc at the acidic air-droplet interface, since the hydration reaction is considered to be the first step of the oligomerization for OVOCs (Mauney et al., 2017), leading to oligomeric products which contribute to SOA growth. For comparison, the hydration reaction of *keto*-AcAc is also studied. Fig. 3 shows a schematic diagram of three stepwise pathways of the hydration reactions for *enol*-AcAc. Appendix A Figs. S5-S6 display the free-energy distribution diagram of the hydration reactions of *enol*-AcAc. Fig. 4 displays the change curves of key distances, the two-dimensional free-energy distribution diagram, and the geometry diagrams of the key stability points in the hydration reactions of *keto*-AcAc.

The interfacial hydration of *enol*-AcAc involves fourstep reactions: (I) H-shift process (blue line), (II) cationintermediate formation (green line), (III) transition-state for-

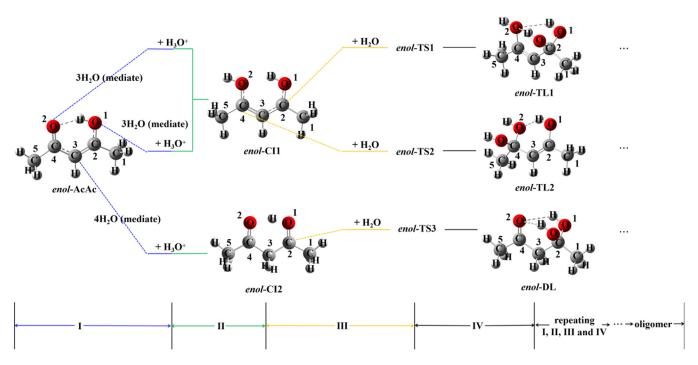


Fig. 3 – A schematic diagram of three stepwise pathways of the hydration reactions for *enol*-AcAc at the acidic air-droplet interface.

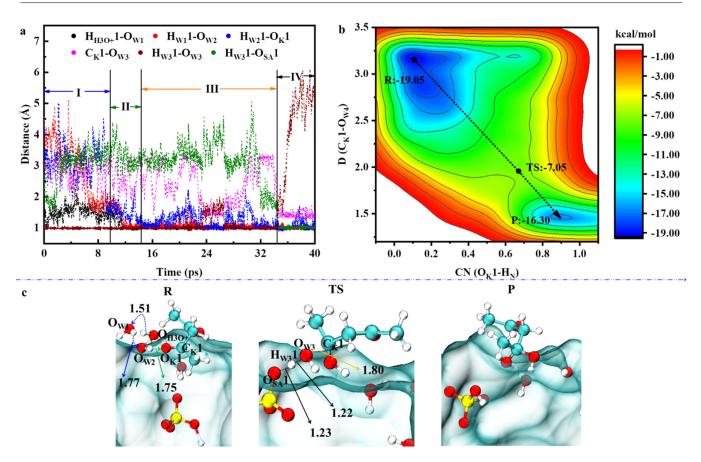


Fig. 4 – (a) Change curves of key distances, (b) two-dimensional free energy distribution diagram, and (c) geometry diagrams of key stability points in the hydration reactions of *keto*-AcAc at the acidic air-droplet interface. R, TS and P represent the reactant, transition state and product, respectively, and the unit of bond length is Å.

mation (yellow line), (IV) diol formation (black line), and details of the multi-step hydration reactions are illustrated in Fig. 3. For the first step, the H-shift can be occurred at three reactive sites of enol-AcAc, hydroxyl ( $O_E 1$ ) and carbonyl ( $O_E 2$ ) Oatoms and double-bond C-atom ( $C_E$ 3). Therefore, the  $O_E$ 1-H<sub>W</sub>3, O<sub>E</sub>2-H<sub>W</sub>3, and C<sub>E</sub>3-H<sub>W</sub>4 bonds are formed via the H-shift processes from hydronium ion to water molecules to three reactive sites of enol-AcAc, with the corresponding lengths of 2.08, 2.01, and 1.50 Å, respectively. Subsequently, the O<sub>E</sub>1-H<sub>W</sub>3, O<sub>E</sub>2- $H_W$ 3, and  $C_E$ 3- $H_W$ 4 bonds are shorten to 1.02, 1.02, and 1.07 Å, respectively, to form two enol-cation intermediates (enol-CI1 and enol-CI2). For the step III, a transition-state-like structure for the reaction starting with the double-bond (enol-TS3) is observed, corresponding to the free-energy maximum with 43.67 kcal/mol (Appendix A Fig. S5), which is larger than those starting with hydroxyl/carbonyl group (enol-TS1 and enol-TS2) (Appendix A Fig. S6). It suggests that the hydroxyl/carbonyl Oatoms are the most energetically favorable position to proceed via hydration for enol-AcAc, to form the enol-triols (enol-TLs).

Similarly, the hydration of keto-AcAc also contains the same four-step reactions (Fig. 4a). However, the H-shift process of keto-AcAc starts with carbonyl O atom group based on the structural characteristics of keto-AcAc. Through two H-shift processes from hydronium ion to water molecules (W1 and W2), the  $O_{K}$ 1- $H_{W2}$ 1 bond is formed at 9.36 ps, with the length of 2.02 Å. During a period from 14.60 to 34.40 ps (III), the maximum of free energy (12.00 kcal/mol) is observed at 34.37 ps (Fig. 4b), corresponding to a transition-state-like structure (Fig. 4c), which is 7.33 kcal/mol lower than that of the dominate hydration pathway for enol-AcAc starting with hydroxyl/carbonyl group, suggesting the more favorable formation of keto-diol (keto-DL) than enol-TL1 and enol-TL2. Combined with the above analysis about the isomerization reaction of AcAc, it indicates that enol-AcAc accumulated at the interface is preferentially converted to form keto-AcAc, and keto-DL is subsequently yielded by the proton-mediated hydration reaction of keto-AcAc.

Subsequently, keto-DL proceeds the hydration reaction via the similar four-step reactions (Appendix A Fig. S7a): (I) H-shift process (t < 15.91 ps); (II) cation-intermediate formation (15.91  $\leq$  t < 16.06 ps); (III) transition-state formation (16.06  $\leq$  t < 22.36 ps); (IV) tetrol formation (t  $\geq$  22.36 ps). As illustrated in the SI, the process of keto-DL to form keto-tetrol via the proton-mediated hydration reaction is endothermic with a large free-energy barrier of 16.67 kcal/mol (Appendix A Fig. S7b). It indicates that the proton-mediated hydration reaction of keto-DL is an energetically unfavorable pathway, leading to the accumulation and accommodation of keto-DL at the acidic airdroplet interface.

#### 3. Conclusions and atmospheric implications

 $\beta$ -Diketones are a special class of ketones, which are widely used as organic reagents, catalysts, and chelating ligands in industrial activities, healthcare, perfume, and cosmetics industries due to the property of the simultaneous presence of keto-enol isomers. Acetylacetone (AcAc) is a typical kind of  $\beta$ -diketones, but its isomerization and chemical behavior at the air-droplet interface are still unclear, leading to affect to

assess its environmental effects. Hence, we investigated the heterogeneous chemistry of AcAc at the neutral and acidic airdroplet interfaces by combining molecular dynamics (MD) and quantum chemistry (QC), and the influence of interfacial acidity on the chemical behavior of AcAc was also evaluated. Our MD simulation results reveal that two AcAc isomers, enol-AcAc and keto-AcAc, are prone to be adsorbed by the neutral and acidic air-droplet interfaces, but the acidic air-droplet interface exhibits a better ability to accumulate and accommodate two AcAc isomers, especially for enol-AcAc. The isomerization of two AcAc isomers at the air-droplet interface all involves three-step reactions, the H-shift of AcAc to the interfacial water, the H-shift between the water clusters, and the formation of other AcAc isomer. At the neutral air-droplet interface, the isomerization of AcAc isomer undergoes a "water bridge" mechanism, while the "water bridge" structure is destroyed by much  $H_3O^+$  at the acidic air-droplet interface. Therefore, the isomerization from keto-AcAc to enol-AcAc is more favorable than that from enol-AcAc to keto-AcAc, and the enolic isomer is the dominant form of the accommodation for AcAc at the acidic air-droplet interface.

Subsequently, *enol*-AcAc undergoes the H-shift via water molecules to form low-volatile compounds at the acidic airdroplet interface. Hydration at the carbonyl or hydroxyl Oatom of *enol*-AcAc is the most energetically favorable pathway, forming the *enol*-triols (*enol*-TLs). However, its free-energy barrier is larger than that of the isomerization from *enol*-AcAc to *keto*-AcAc. Alternatively, the hydration of *keto*-AcAc starting with the carbonyl O-atom mainly produces *keto*-DL, with a low free-energy barrier. Hence, the main product of the hydration reaction of AcAc at the acidic air-droplet interface is *keto*-DL, whose proton-mediated hydration reaction is an energetically unfavorable pathway, leading to the accumulation and accommodation of *keto*-DL at the acidic air-droplet interface.

To assess the contribution of the interface chemical behavior of AcAc to the whole aqueous chemistry, the hydration reaction of keto-DL in bulk water is further investigated, to simulate the main interface product entering the acidic droplet interior (Appendix A Fig. S8). There exists two-steps hydration reaction of keto-DL: protonation and nucleophilic addition. As shown in Appendix A Fig. S8, protonation at the carbonyl Oatom site of keto-DL is slightly exergonic to form cationic intermediate, with the reaction energy value of -2.87 kcal/mol. Nucleophilic addition between cationic intermediate and water molecules possesses a TS with the activation barrier of 10.69 kcal/mol, which is 5.98 kcal/mol lower than that at the airdroplet interface (Appendix A Fig. S7b). It indicates that excessive keto-DL can enter the droplet interior to engage in the oligomerization, thereby facilitating the air-droplet interface to accommodate and yield more keto-DL.

On the other hand, to systematically understand the interface chemistry of AcAc, the oxidation reaction of keto-DL with OH radical (·OH) at the acidic air-droplet interface is also evaluated to simulate the photooxidation (Appendix A Fig. S9). H-abstraction from the methyl or methylene group of keto-DL forming keto-DL radical is barrierless. However, H-abstraction from the hydroxyl group of keto-DL is barrierless, accompanied by the breakage of  $C_b$ - $C_c$  bond to rapidly form acetic acid (AA). The breakage of  $C_b$ - $C_c$  bond needs to overcome the activation barrier of 8.47 kcal/mol (Appendix A Fig. S9a and b). Alternatively, an adduct is yielded by OH-addition to the carbonyl Catom of *keto*-DL, with the free-energy barrier of 9.40 kcal/mol. Subsequently, the  $C_c$ - $C_d$  bond in the adduct is broken to yield AA, with the activation barrier of 4.04 kcal/mol (Appendix A Fig. S9a and c). It suggests that the photooxidation reaction of AcAc will increase the acidity of the air-droplet interface, further promoting the accommodation and the proton-mediated hydration reaction of AcAc. Our work reveals that we should focus on not only the isomerization and chemical reactions of the  $\beta$ -diketones (such as AcAc) at the air-droplet interface, but also their photooxidation reactions in the future studies. Our results provide an insight into the heterogeneous reaction mechanisms of  $\beta$ -diketones and their influence on the environment.

#### **Declaration of Competing 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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#### Appendix A Supplementary data

Supplementary material associated with this article can be found in the online version at doi:10.1016/j.jes.2023.04.013.

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