



Article Numerical Modeling of Droplet Aerosol Coagulation, Condensation/Evaporation and Deposition Processes

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Abstract: The differentially weighted operator-splitting Monte Carlo (DWOSMC) method is further developed to describe the droplet aerosol dynamic behaviors, including coagulation, deposition, condensation, and evaporation processes. It is first proposed that the droplet aerosols will experience firstly condensation and then evaporation, and this phenomenon is first implemented into the Monte Carlo method and sectional method with considering coagulation, deposition, and condensation/evaporation processes in both single-component and two-component aerosol particle systems. It is found that the calculated results of the DWOSMC method agree well with both the analytical solutions and the sectional method. The further developed DWOSMC method can predict the variation of particle number density, total particle volume, mean particle diameter, particle size distributions, and the component-related particle volume densities in both single component and two-component droplet aerosol systems considering coagulation, deposition, and condensation/evaporation processes.

Keywords: DWOSMC method; droplet aerosol; condensation/evaporation; deposition; coagulation

1. Introduction

Respiratory infections caused by droplet aerosol transmission are major killers of humans. The outbreak of SARS, MERS, and the Novel Coronavirus SARS-CoV-2 illustrates that virus transmission and infection are very complex problems. Droplet aerosol is one of the crucial ways for most microorganisms (including viruses, bacteria and fungi) to spread in the air [1–4]. People usually release droplet aerosols by coughing or breathing, and then the droplet aerosols spread through the air until they are inhaled into the body or deposited on surfaces [5,6]. In the transmission process, droplet aerosols will experience a series of dynamical behaviors, such as coagulation, deposition, condensation, and evaporation processes, which significantly affect the particle size distributions and the transportation mechanism of aerosols [7–10].

Another characteristic of droplet aerosols is that they cannot be regarded as singlecomponent particles. Wells' study showed that droplet aerosols evaporate and contract during propagation, and eventually evolve into a condensation core [11]. Besides water, which can evaporate, the droplet aerosols also contain compositions that do not evaporate such as proteins and ions, which could be regarded as a solid condensation nucleus. Therefore, the droplet aerosols can be considered as solid–liquid two-phase multicomponent aerosol particles [12,13]. Furthermore, as the relative humidity of human exhaled gas is close to 100% with relatively high temperature, water is likely to condense on the droplet aerosols when they are just exhaled, and afterward evaporate. The deposition mechanism of droplet aerosols on different surfaces is also different [14]. Thus, the evolutionary process of the droplet aerosols is complicated and the study of the propagation and spread process,



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Copyright: © 2022 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). deposition behavior, evolution of particle size distributions, and the dynamical evolutions of the droplet aerosols is significant.

Since the toxicity, sedimentation rate, capture strategy, and hazard to human beings of aerosol particles are all related to the size distribution, the aerosol particle size distribution is determined by dynamical events, and it is very difficult to find the analytical solutions of equations for describing particle dynamics considering such complicated behaviors, the establishment of efficient and accurate numerical algorithms to solve aerosol dynamic equations has become the focus of researchers. At present, the most popular numerical methods include the method of moment (MOM) [15,16], sectional method (SM) [7,17], and Monte Carlo (MC) method [18,19]. Compared with the MC method, the MOM method and sectional method both have their own advantages and disadvantages.

The SM tends to be more accurate; however, the sectional representations may lead to complicated algorithms. MOM is relatively computational time-saving and simple. Nevertheless, the initial form of the particle size distribution should be assumed to obtain the closure of the moment equations, and it is difficult to give particle size distributions. Moreover, it becomes complicated and difficult when solving multi-component particle systems using the MOM and SM [20–22]. While the MC method is relatively straightforward for solving the complex multidimensional and multicomponent particle systems, it is also easy to find the internal information and the historical trajectory of the aerosols [23,24].

The disadvantage of the MC method is that it is difficult to balance computational accuracy and computational cost. To solve this problem, researchers put forward the concept of "weighted fictitious particles", meaning that each fictitious particle can represent a certain number of real particles of the same physical properties, which dramatically reduces the computational consumption of the MC methods [25,26]. In order to reduce use of computing memory and simulation time of the MC algorithm, Zhao et al. [27–29] put forward a differentially weighted Monte Carlo (DWMC) method to solve the particle balance equation. Based on this DWMC method, Liu et al. further developed a differentially weighted operator-splitting Monte Carlo (DWOSMC) method which tends to be more efficient and precise in predicting the variation of aerosol particles [24,30,31].

Herein, the DWOSMC method is further updated to describe the droplet aerosol dynamical behaviors including coagulation, deposition, condensation, and evaporation processes. It is first proposed that the droplet aerosols will experience condensation first and then evaporation, and this phenomenon is first implemented into the Monte Carlo method and sectional method while considering coagulation and deposition processes in both single-component and two-component aerosol systems. This paper is organized as follows: Section 2 briefly introduces the droplet aerosol dynamics and the DWOSMC method. Section 3 presents the simulation and validation results of the DWOSMC method in predicting the evolution of aerosol particles considering different dynamical processes. Section 4 presents the conclusions of the present study.

2. Materials and Methods

2.1. Description of the Droplet Aerosol Dynamics

Respiratory droplet aerosols are the primary carriers of respiratory infectious pathogens and the aerosols will experience coagulation, condensation or evaporation, and deposition behaviors in the process of spreading. Figure 1 shows the mechanism of droplet aerosol diffusion, coagulation condensation/evaporation, and deposition processes. Considering the large difference between the relative humidity of human exhaled gas and the atmosphere, the droplet aerosols will first experience condensation, then evaporation.

The evolution of the particle number density considering coagulation, deposition, and condensation/evaporation processes is expressed by the following equation [32],

$$\frac{\partial n(v,t)}{\partial t} = \frac{1}{2} \int_0^v \beta(v',v-v') n(v,t) n(v-v',t) \mathrm{d}v - n(v,t) \int_0^\infty \beta(v,v') n(v',t) \mathrm{d}v' - R(v) n(v,t) - \frac{\partial I(v) n(v,t)}{\partial v}$$
(1)

where n(v,t) is the particle number density of size v at time t, $\beta(v, v')$ is the coagulation rate between particles with size v and particles with size v', R(v) is the deposition rate of particles with volume v, and I(v) is the condensation/evaporation rate of particles with volume v.



Figure 1. Droplet aerosol diffusion and coagulation-condensation/evaporation-deposition mechanism.

If a two-component aerosol system is considered, Equation (1) becomes the following,

$$\frac{\partial n(v_{X},v_{Y},t)}{\partial t} = \frac{1}{2} \int_{0}^{v_{X}} \int_{0}^{v_{Y}} \beta(v_{X}',v_{Y}',v_{X}-v_{X}',v_{Y}-v_{Y}')n(v_{X}',v_{Y}',t)n(v_{X}-v_{X}',v_{Y}-v_{Y}',t)dv_{X}'dv_{Y}'
-n(v_{X},v_{Y},t) \int_{0}^{\infty} \int_{0}^{\infty} \beta(v_{X},v_{Y},v_{X}',v_{Y}')n(v_{X}',v_{Y}',t)dv_{X}'dv_{Y}' - R(v_{X},v_{Y})n(v_{X},v_{Y},t)
-\frac{\partial(I_{X}n)}{\partial v_{X}}(v_{X},v_{Y},t) - \frac{\partial(I_{Y}n)}{\partial v_{Y}}(v_{X},v_{Y},t)$$
(2)

where v_X and v_Y are the size of X-component and Y-component within particle *i* whose total size is $v_X + v_Y$, respectively; I_X and I_Y are the condensation/evaporation rate coefficients correspondingly.

2.2. Implementation of the DWOSMC Algorithm

In this study, the DWOSMC method is further developed to describe droplet aerosol dynamics, including coagulation, deposition, and condensation/evaporation processes in both single-component and two-component systems. In this further developed DWOSMC algorithm, the effect of relative humidity of gas on the phase transformation behavior is considered. Condensation is considered in the first half of the simulation time, and then evaporation is considered in the remaining simulation time.

The implementation of the DWOSMC algorithm is described as follows.

- (1) Start with a predetermined total MC loop number, *M*.
- (2) Predetermine the simulation stopping time, $T_{\text{stop.}}$
- (3) Initialize the particle system. The weight, component, and size distribution of the droplet aerosols are initialized first. The weight of numerical particle *i*, w_i is defined as

$$w_i = \frac{N_{\rm r}(v_{\rm X}, v_{\rm Y})}{N_{\rm n}(v_{\rm X}, v_{\rm Y})} \tag{3}$$

where $N_r(v_X, v_Y)$ is the real particle number of particles with volume (v_X, v_Y) and $N_n(v_X, v_Y)$ is the numerical particle number that representing the corresponding real particles.

(4) Determine a time step τ for the simulation.

The timescales for coagulation, deposition, and condensation/evaporation processes are determined as follows, respectively.

The characteristic time step of the coagulation behavior is described as Equation (4) [29,33],

$$\tau \operatorname{coag} = \min|_{\forall i} (Vs / \sum_{j=1, j \neq i}^{N_s} \beta'_{ij})$$
(4)

where N_s and V_s are the numerical particle number and the volume of simulation system, respectively. β'_{ij} is the normalized coagulation rate of simulated particles *i* and *j*, which is described as Equation (5).

$$\beta'_{ij} = 2\beta_{ij}w_j \max(w_i, w_j) / (w_i + w_j)$$
(5)

The characteristic time step of the deposition behavior is expressed as Equation (6):

$$\tau \text{depo} = \min|_{\forall i} (1/Ri(v)) \tag{6}$$

where R_i is the deposition kernel.

For condensation/evaporation processes, the characteristic time step is shown as

$$\tau \text{cond} = \min|_{\forall i} (vi/Ii(v)) \tag{7}$$

The selected time step should ensure both the accuracy and efficiency for simulating all the dynamical processes mentioned above. Thus, the following equation is used to determine the time step.

$$\tau = \alpha \times \min(\tau \operatorname{coag}, \tau \operatorname{depo}, \tau \operatorname{cond})$$
(8)

The empirical parameter, α is usually set as smaller than 0.01 to ensure that the several aerosol dynamical processes are uncoupled within a time step [25,31,34].

(5) Algorithm integration. In this DWOSMC method, the coagulation event is simulated by the stochastic Monte Carlo method; and the deposition and condensation/evaporation events are calculated by the deterministic method. Then, the simulation results are integrated by the operator splitting method expressed by Equation (9) [35], which means that in one time step, the deposition and condensation/evaporation events will be firstly calculated within the first half time step. Then, the coagulation events will be calculated, at last, the deposition and the condensation/evaporation events will be calculated within the second half time step.

$$\exp(\tau\psi) = \exp(\frac{\tau}{2}\psi_d)\exp(\frac{\tau}{2}\psi_c)\exp(\tau\psi_s)\exp(\frac{\tau}{2}\psi_c)\exp(\frac{\tau}{2}\psi_d) + (\tau^3)$$
(9)

where ψ represents the total particle dynamical processes, ψ_d represents the deposition event, ψ_c represents the condensation/evaporation event, and ψ_s represents the coagulation event.

Herein, the treatment of coagulation, deposition, and condensation/evaporation processes in two-component systems is described as follows.

(a) Coagulation

The probability of coagulation process occurring on particle *i* is the following [25,27]:

$$P \operatorname{coag}_{i} = 1 - \exp(-VsCi\tau/2) \tag{10}$$

where C_i is the coagulation rate of simulated particle *i* which is written as:

$$Ci = \frac{1}{V_s^2} \sum_{j=1, j \neq i}^{N_s} \beta'_{ij}$$
(11)

Particle *i* is selected as the first coagulation partner when P_i meets the following inequality,

$$l \le Pi$$
 (12)

The second coagulation partner j is chosen when Equation (13) is satisfied, then the coagulation process is treated between particles i and j; otherwise, the remaining particles will be checked until Equation (13) is satisfied.

 r^{1}

$$r2 \le \beta_{ij}' / \max(\beta_{mn}') \Big|_{\forall m \,\forall n} \tag{13}$$

where r_1 and r_2 are both random numbers that satisfy a uniform distribution between 0 and 1.

When the coagulation pair particles *i* and *j* are selected, coagulation event would be treated and calculated as Equation (14) [36].

If
$$w_{i} = w_{j}$$
,

$$\begin{cases}
w_{i}' = w_{i}/2; v_{i}' = v_{i} + v_{j}; v_{i,X}' = v_{i,X} + v_{j,X}; v_{i,Y}' = v_{i,Y} + v_{j,Y}; \\
w_{j}' = w_{j}/2; v_{j}' = v_{i} + v_{j}; v_{j,X}' = v_{i,X} + v_{j,X}; v_{j,Y}' = v_{i,Y} + v_{j,Y}; \\
w_{i}' = \max(w_{i}, w_{j}) - \min(w_{i}, w_{j}); v_{i}' = v_{m} \Big|_{w_{m} = \max(w_{i}, w_{j})}; \\
w_{i,X}' = v_{m,X} \Big|_{w_{m} = \max(w_{i}, w_{j})}; v_{i,Y}' = v_{m,Y} \Big|_{w_{m} = \max(w_{i}, w_{j})}; \\
w_{j}' = \min(w_{i}, w_{j}); v_{j}' = v_{i} + v_{j}; \\
v_{j,X}' = v_{i,X} + v_{j,X}; v_{j,Y}' = v_{i,Y} + v_{j,Y};
\end{cases}$$
(14)

where w'_i , w'_j , v'_i , and v'_j represent the weight or volume of newly updated simulation particles *i* and *j* after the coagulation process. $v'_{i,X}$, $v'_{i,Y}$, $v'_{j,X}$ and $v'_{j,Y}$ are the volumes of components X and Y in the updated simulation particles *i* and *j* after the coagulation process.

(b) Deposition

The probability of deposition on particle *i* is calculated by Equation (15) [37].

$$P_{\text{depo},i} = 1 - \exp(-R_i(v_X, v_Y)\tau) \tag{15}$$

where τ is the simulation time step, $R_i(v_X, v_Y)$ is the deposition kernel of particles with the volume of (v_X, v_Y) .

The following equation will be used to update the weight of the particles after deposition.

$$w'_i = w_i \times (1 - P_{\text{depo},i}) \tag{16}$$

(c) Condensation and evaporation

In two-component aerosol systems, the condensation/evaporation kernels for the two components X and Y are different. In the DWOSMC method, the total volume of particle *i* is summation of the two components after the condensation/evaporation process, which is described as Equation (17).

$$\frac{dv_i(v_X, v_Y, t)}{dt} = I_X(v_X) + I_Y(v_Y)$$
(17)

After the condensation/evaporation event, the total volume of particle *i*, the volume of component X, and component Y in particle *i*, the particle weights are calculated as the following equations, respectively.

$$v'_{i} = v_{i} + (I_{X}(v_{X}) + I_{Y}(v_{Y}))\tau$$
(18)

$$v_{i,\mathrm{X}}' = v_{i,\mathrm{X}} + I_{\mathrm{X}}(v_{\mathrm{X}})\tau \tag{19}$$

$$v_{i,Y}' = v_{i,Y} + I_Y(v_Y)\tau$$
(20)

$$v_i' = w_i \tag{21}$$

In the present study, the effect of relative humidity of gas to the phase transformation behavior is considered. Condensation is considered in the first half of the simulation time, $T_{\text{stop}}/2$, then evaporation is considered in the remaining simulation time, where the particle surface growth rate will be minus $I_i(v)$.

U

- (6) The properties of the numerical particles (component composition, size distribution, weight, etc.) are updated.
- (7) If the present simulation time, *T*, reaches *T*_{stop}, stop the present MC loop. Otherwise, repeat step (4) to step (6).
- (8) If the current MC loop number *N* equals *M*, the mean value of the particle parameters should be calculated and output. Otherwise, start a new MC loop.

In the present study, the simulation results of the DWOSMC method are compared with the sectional method (SM) [38] in some complicated cases and two-component aerosol systems. Herein, the SM is further developed to describe aerosol coagulation, deposition, and condensation/evaporation behaviors in two-component aerosol systems.

3. Results

The DWOSMC method is validated in both single component and two-component aerosol systems. In single component aerosol systems, the particles can be regarded as water droplets that condense or evaporate; in two-component aerosol systems, besides water, the droplet aerosols also contain compositions that do not evaporate, which could be regarded as a solid condensation nucleus. In the first two cases, the DWOSMC method is verified by analytical solutions [39,40] considering coagulation and condensation/evaporation behaviors for single-component aerosols. Next, the DWOSMC method is verified by the more developed sectional method considering coagulation, condensation/evaporation, and deposition behaviors for both single-component and two-component aerosols.

3.1. Coagulation and Condensation/Evaporation Processes in Single Component Aerosol Systems

In Cases I and II, the initial particles have a uniform diameter of 1.5µm and the DWOSMC method is validated by analytical solutions [39,40]. In Case I, constant rate coagulation kernel ($\beta = \beta_0$) and linear rate condensation/evaporation kernel ($I = I_1 v$) are considered; in Case II, linear rate coagulation kernel ($\beta = \beta_1 (v_1 + v_2)$) and linear rate condensation/evaporation kernel ($I = I_1 v$) are considered; and the analytical solutions for Cases I and II are shown as Equations (22,23) and (24,25), respectively. In Cases I and II, the simulation time is 4s. It is assumed that condensation and coagulation occurred in the first half of the simulation, and evaporation and coagulation occurred in the second half of the simulation.

$$\frac{N(t)}{N_0} = \frac{1}{1 + \beta_0 N_0 t/2} \tag{22}$$

$$\frac{V(t)}{V_0} = \exp(\sigma_1 t) \tag{23}$$

$$\frac{N(t)}{N_0} = \exp[-\frac{\beta_1 V_0}{\sigma_1} (\exp(\sigma_1 t) - 1)]$$
(24)

$$\frac{V(t)}{V_0} = \exp(\sigma_1 t) \tag{25}$$

where *N* and *V* are the particle number density and total particle volume, respectively; N_0 and V_0 are the initial particle number density and total particle volume, respectively.

The evolution of the normalized particle number density and total particle volume for Cases I and II are shown in Figures 2 and 3.



Figure 2. Evolution of N/N_0 and V/V_0 for Case I.



Figure 3. Evolution of N/N_0 and V/V_0 for Case II.

It can be seen that in Cases I and II, the particle number density decreases and the total particle volume initially increases, and then decreases over time. This is because condensation occurs in the first half and evaporation occurs in the second half, and the coagulation process does not have influence on the total particle volume. In Case I, the total particle volume varies linearly over time because of the condensation kernel and the constant coagulation kernel. In case II, the total particle volume has the same variation tendency as Case I, but does not show a linear relationship over time. This is because both the coagulation kernel and the condensation/evaporation kernel are related to the particle volume, which will affect the particle size distribution and the condensation/evaporation behaviors. From Figures 2 and 3, the calculated results of the DWOSMC method are consistent with the analytical solutions.

In Case III, the particles initially have an exponential size distribution which satisfies Equation (26). The coagulation kernel in the free molecular regime is used which is expressed as Equation (27). The condensation/evaporation kernel used is $I = I_1 v$. The simulation time is 4 s.

$$n_{\rm p}(v,0) = (N_0/v_{\rm g0}) e^{-v/v_{\rm g0}}$$
⁽²⁶⁾

$$\beta_{ij} = (3/4\pi)^{1/6} (6k_b T/\rho)^{1/2} \left(\frac{1}{v_i} + \frac{1}{v_j}\right)^{1/2} \left(v_i^{1/3} + v_j^{1/3}\right)^2 \tag{27}$$

where $N_0 = 1 \times 10^{14}$ /m³ and $v_{g0} = 2.7 \times 10^{-18}$ m³ are the initial particle number density and initial geometric mean particle volume, respectively.

For Case III, the further developed DWOSMC method is validated by the sectional method, and the evolution of the normalized particle number density, total particle volume, and the average particle diameter for Cases III are shown in Figure 4; the evolution of particle size distribution is shown in Figure 5.



Figure 4. Variation of N/N_0 , V/V_0 and d_a/d_{a0} for Case III.



Figure 5. Evolution of PSDs for Case III.

In Case III, the variations of particle number density and total particle volume are similar with Cases I and II. The particle number density decreases and the total particle volume initially increases, then decreases over time. From Figure 4, it can be seen that the particle average diameter increases over time over the whole simulation. It can be concluded that, in the second half of the simulation time, the coagulation process dominated the entire process because the particle diameter would increase due to the coagulation effect, while the particle diameter would decrease due to the evaporation effect. From Figure 5, it can be seen that the curve of the particle size distribution (PSD) becomes lower and wider over time, and the peak volume of the PSD becomes larger distinctly at the first half simulation time. During the second half of the simulation, the peak volume becomes larger very slightly because the evaporation process makes the particle diameter smaller. From Figures 4 and 5, the simulation results of the DWOSMC method are consistent with the sectional method.

3.2. Coagulation, Deposition, and Condensation/Evaporation Processes in Single Component Aerosol Systems

In Case IV, particle dynamical behaviors including coagulation, deposition, and condensation/evaporation processes are considered. The coagulation kernel in the free molecular regime is used which is expressed as Equation (25). The condensation/evaporation kernel used is $I = I_1 v$. The constant rate deposition kernel is used as R = 0.32/s. The initial particle size distribution is the same with Case III, and the simulation time is also 4 s. The variation of the normalized particle number density, total particle volume, and the mean particle diameter for Cases IV are shown in Figure 6; the evolution of particle size distribution is shown in Figure 7. The simulation results are compared with the sectional method.



Figure 6. Variation of N/N_0 , V/V_0 and d/d_0 for Case IV.



Figure 7. Evolution of PSDs for Case IV.

Compared with Case III, the particle number density decreases faster, the total particle volume does not increase in the first half simulation time, and the mean particle diameter increases slower in Case IV. Since the deposition process will contribute to the decrease in both the particle number and total particle volume. It demonstrates that in the first half of the simulation time, the deposition effect exceeded the condensation effect because the total particle volume decreases over time. The deposition process also weakened the coagulation process, as the average particle diameter shows a slower growth rate. From

Figure 7, the PSD curves are narrower and lower than those in Case III and the peak volume of the PSD curve is smaller, which is consistent with the conclusions from Figure 6. From Figures 6 and 7, the calculated results of the DWOSMC method are consistent with the sectional method.

3.3. Coagulation, Deposition and Condensation/Evaporation Processes in Two-Component Aerosol Systems

Besides water, it is found that the droplet aerosols released by people also contain compositions that do not evaporate, which could be regarded as a solid condensation nucleus [12,13]. Therefore, in Cases V and VI, particle dynamical behaviors including coagulation, deposition, and condensation/evaporation processes in two-component aerosol systems are examined. For a two-component particle system, $q_{m,n}$ is used to express the component-related volume density. The particles are divided into several sections according to their size. The component-related volume density of particles with volume, $v_{l,k} < v_k < v_{u,k}$ in the *k*-th section is

$$q_{m,n}^{k}(v,t) = \int_{v_{l,k}}^{v_{u,k}} v_{X}^{m} v_{Y}^{n} n(v,t) dv$$
(28)

where $v = v_X + v_Y$. Specifically, $q_{1,0}^k$ and $q_{0,1}^k$ are the particle volume densities, where "0" represents component X and "1" represents component Y in the *k*-th section.

In Case V, the initial PSD is set as the same with Case IV; the initial particle number density is $N_0 = 1 \times 10^{15}/\text{m}^3$. The initial particles consist of two components X and Y, and the volumes of components X and Y are $v_{X0} = v_0/3$ and $v_{Y0} = 2v_0/3$, respectively. The constant rate coagulation kernel ($\beta = \beta_0 = 1 \times 10^{-14} \text{ m}^3/\text{s}$) and linear rate condensation/evaporation kernel ($I = I_1 v$) are considered, where $I_X = 0.1/\text{s}$ and $I_Y = 0.2/\text{s}$ are the condensation/evaporation kernel is used as R = 0.32/s. The simulation time is 4s; condensation is considered in the first 2 s, and evaporation is considered in the last 2 s.

The evolution of the normalized particle number density and total particle volume for Case V is shown in Figure 8, the evolution of PSDs (t = 0 s, 2 s, 4 s) is shown in Figure 9. The component-related particle volume density distributions (PVDD) of $q_{1,0}$, and $q_{0,1}$ obtained at t = 2 s and t = 4 s are shown in Figures 10 and 11, respectively.

It can be seen that the curves of particle volume density for components X and Y both become wider and lower, and the peak volume becomes larger distinctly in the first 2 s of simulation time. In the second half of the simulation, the curves evolve relatively slowly because the evaporation process makes the particle volume smaller and also weakens the coagulation effects. From Figures 8–11, it can be concluded that the calculated results of the DWOSMC method are consistent with the sectional method.

In Case VI, two component droplet aerosols are examined, where component X is considered as a condensation nucleus, which means that no condensation/evaporation would occur, and component Y is considered as water on which condensation/evaporation phenomena usually occur. The initial volumes of components X and Y are $v_{X0} = v_0/3$ and $v_{Y0} = 2v_0/3$, respectively. The coagulation kernel in the free molecular regime is used, which is expressed as Equation (25). The condensation/evaporation kernel used for component Y is $I = I_1 v$. The constant rate deposition kernel is used as R = 0.32/s. The initial particle size distribution is the same with Case IV, and the simulation time is also 4s. The simulation results for Case VI are shown in Figures 12–15.

From Figures 14 and 15, the evolutions of the PVDD curve of X-component and Y-component share the same variation tendency: the peak volume becomes larger over time, and the shape of the curve do not change much from 2 s to 4 s. From Figures 12–15, the Variation of N/N_0 and V/V_0 , PSDs and PVDDs from the DWOSMC method agree well with the sectional method.



Figure 8. Evolution of N/N_0 and V/V_0 for Case V.



Figure 9. Evolution of PSDs for Case V.



Figure 10. Evolution of PVDDs at t = 2 s for Case V.



Figure 11. Evolution of PVDDs at t = 4 s for Case V.



Figure 12. Evolution of N/N_0 and V/V_0 for Case VI.



Figure 13. Evolution of PSDs for Case VI.



Figure 14. Evolution of PVDDs of X-component for Case VI.



Figure 15. Evolution of PVDDs of Y-component for Case VI.

4. Conclusions

In this study, the DWOSMC algorithm is further updated to describe the droplet aerosol dynamic behaviors including coagulation, deposition, condensation and evaporation processes in both single component and two component systems. During simulation, the aerosols will firstly experience condensation, and then the evaporation will be considered during the second half of the simulation. The further developed DWOSMC method is firstly validated by the analytical solutions in single component aerosol systems for some relatively simple cases. Then, the calculated results are verified by the sectional method for relatively complicated cases in both single-component and two-component aerosol particle systems. It is concluded that the calculated results of the DWOSMC method show good consistency with both the analytical solutions and the sectional method. The further developed DWOSMC method is found to be able to describe the evolution of particle number density, total particle volume, average particle diameter, particle size distributions, and component-related particle volume densities in both single-component and two-component aerosol systems considering coagulation, deposition and condensation/evaporation processes.

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