

## A binary gas transport model Improves the prediction of mass transfer in freeze drying

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2	A binary gas transport model improves the prediction of mass
3	transfer in freeze-drying
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5	Short title: Binary gas transport model in freeze-drying
6	
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20	
21	Abstract
22	Monitoring partial vapor pressure in the freeze-drying chamber is a cheap,
23	global and non-intrusive way to assess the end of the primary drying stage.
24	Most existing dynamic freeze-drying models which predict this partial
25	pressure describe mass transfer between the product and the condenser via
26	a mass transfer resistance or a mass transfer coefficient. Experimental
27	evidence suggests that such models can be significantly in error for some

values of the sublimation flux, leading to physically inconsistent 28 29 predictions and possibly incorrect assessment of primary drying termination, with potential risk of product damage if moving to secondary 30 drying and increasing shelf temperature while some ice is still present. 31 32 Assuming a binary gas transport model for vapor and inert gas leads to 33 improved and consistent predictions and explains the apparent variation of 34 the mass transfer resistance with total pressure, shelf temperature and product sublimation area. 35

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*Keywords*: lyophilization, dynamic model, mass transfer, convection,
diffusion

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- 40
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#### INTRODUCTION

Freeze-drying (lyophilization) is widely used for long term preservation of thermosensitive biological material and pharmaceuticals, such as proteins, vaccines, bacteria, mammalian cells and high quality food.<sup>[1, 2]</sup> It removes water or an organic solvent in a way that minimizes the modification of the molecular structure of the active ingredient and creates a porous matrix with high rehydration properties. Freeze-drying remains a costly process, however, and lot of research was devoted to its optimization, often based on mathematical modeling.<sup>[2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12]</sup>

The process consists of three main steps: freezing, ice removal by sublimation (primary 49 50 drying) and unfrozen water removal by desorption from the solid matrix (secondary drying). 51 The primary drying stage is usually the most time and energy consuming part of a freeze-52 drying cycle. A lot of research has been devoted to the development of methods to precisely 53 and consistently identify the end of the primary drying. Most of these methods rely on the 54 monitoring of the vapor partial pressure in the freeze-drying chamber, either directly 55 (moisture sensors such as aluminum oxide probes) and/or indirectly (Pirani gauge, mass spectrometer, Tunable Diode Laser Absorption Spectroscopy (TDLAS)).<sup>[13, 14]</sup> Moreover, 56 57 abundant literature is available concerning modeling of primary freeze-drying for optimizing

this step of the process off line and also more recently in real time.<sup>[11, 12, 15]</sup> Models often 58 59 predict the product temperature and the sublimation flux. The rate of solvent vapor removal from the product is usually described as being governed by three barriers or resistances: 60 resistance of the dried-product layer, resistance of the containers (vials and stoppers), and 61 62 resistance of the chamber to condenser pathway. Since the gas phase is mainly vapor during 63 the primary drying and gradients of concentrations are small, true diffusion, or flow under the influence of a concentration gradient, is often considered of minor importance and models 64 focus on bulk flow mechanisms.<sup>[16]</sup> The resistance of the dried product layer and of the 65 containers has been studied both theoretically and experimentally by many groups. These 66 studies present two limitations, however. Firstly, the chamber resistance is usually neglected 67 because of measurement difficulties, or it is estimated by rather complex approaches 68 involving Computational Fluid Dynamics (CFD) simulations.<sup>[17, 18, 19, 20]</sup> Secondly, the partial 69 70 vapor pressure is usually not predicted but taken as fixed and equal to the total chamber pressure, despite its importance for real time optimization and freeze-drying control.<sup>[3, 10, 21, 22, 24]</sup> 71 23, 24] 72

Our group previously developed a one-dimensional heat and mass transfer model, which can accurately represent both the primary and secondary drying stages and the gradual transition between them.<sup>[9]</sup> When adapting it to other freeze-dryers and to bacterial suspensions, however, it turned out that the determined chamber resistance strongly varied with total pressure and shelf temperature. Moreover, for a sufficiently high sublimation flux, e.g. generated by a high shelf temperature at the beginning of the primary drying, the model can predict a partial vapor pressure higher than the total one, which is obviously incorrect.

In the present study the chamber resistance was experimentally determined and a model of mass transfer between the freeze-drying chamber and the condenser is proposed for the solvent vapor and inert gas pair. The model is based on the mass transfer theory in binary gas mixtures and includes bulk flow and mutual diffusion terms. This model improved the prediction of the chamber vapor pressure and of the primary drying termination. It also accounted for apparent variations of the effective mass transfer resistance with total pressure, shelf temperature and product sublimation area.

#### MATERIALS AND METHODS

88 Determination of the mass transfer resistance (vapor flow) of the chamber to condenser 89 pathway

Experiments were carried out on a LyoBeta special freeze-dryer (Telstar, Terrassa, Spain)
 equipped with 5 thermocouples, a capacitive manometer and a Pirani gauge. Purified water
 and bacterial cell suspensions were successively considered.

A stainless steel tray was filled with purified water to a thickness of 3 cm. The evaporative flow was determined using the gravimetric method. After freezing the water at -50°C (cooling rate of 0.6 °C/min), and sublimation time between 4 and 8 hours depending on the experimental conditions, the process was stopped and the tray was weighted to determine the amount of water removed and thus the evaporative flux ( $F_V$ , in kg s<sup>-1</sup>). The mass transfer coefficient ( $k_m$ , kg s<sup>-1</sup> Pa<sup>-1</sup>), or, equivalently, resistance of the chamber to condenser pathway ( $r_m$ , Pa s kg<sup>-1</sup>) was determined from Eq. 1:

100 Eq. 1 
$$F_{V} = k_{m} (P_{V1} - P_{V2}) = \frac{P_{V1} - P_{V2}}{r_{m}}$$

101 with  $P_{V1}$ , the water vapor partial pressure just above the product (Pa), estimated from the ice 102 temperature and  $P_{V2}$ , the water vapor partial pressure at the condenser (Pa), estimated from 103 the condenser temperature.

104 The effect of three process variables on the effective mass resistance  $(r_m)$  value was 105 investigated: sublimation area (0.033, 0.074 and 0.15 m<sup>2</sup>), chamber pressure (10, 20, 40 and 106 60 Pa) and shelf temperature (-15, 0 and 15°C).

#### 107 Freeze-drying experiments with bacterial suspensions

Lactic acid bacteria were produced by fermentation in controlled conditions of pH and 108 temperature.<sup>[25]</sup> After concentration, the bacterial cells were re-suspended in a 1:2 109 110 cells/protective medium ratio. The protective medium was composed of 200 g/L of sucrose 111 and 0.15 M of NaCl. A stainless steel tray was filled with 450g of bacterial suspension and the following freeze-drying protocol was applied: freezing at -50°C (cooling rate of 112 113 0.6°C/min); primary drying at -20, 0 or 25°C; secondary drying at 25°C for 8 hours. The total 114 chamber pressure was controlled at either 20 or 60Pa. Thermocouples were placed at the 115 bottom of the product in the centre of the tray.

#### 116 Estimation of partial vapor pressure from the Pirani gauge

117 The reading of a Pirani gauge in a pure gas is proportional to the pressure of the gas and to the 118 molecular heat conductivity of the gas.<sup>[26]</sup> The main gases present in the freeze-drying 119 chamber are solvent vapor (usually water) and an inert gas such as nitrogen or air. Let

120 Eq. 2 
$$\alpha = \frac{\lambda_v}{\lambda_N}$$

be the ratio of the molecular heat conductivities. This ratio is equal to 1.6 for the water vapor and nitrogen pair. If the Pirani gauge is calibrated with inert gas, nitrogen in the present case, then the reading in pure solvent vapor will be:

124 Eq. 3 
$$P_V^P = \alpha P_V$$

In a gas mixture, the Pirani gauge will measure the sum of heat fluxes due to conduction in each gas. The reading will be:

127 Eq. 4 
$$P^P = \alpha P_V + P_N$$

128 In contrast, the capacitive sensor will give the true total pressure:

129 Eq. 5 
$$P_t = P_V + P_N$$

130 From these two readings, one can determine the partial pressures of vapor and inert gas:

131 Eq. 6 
$$P_V = \frac{P^P - P_t}{\alpha - 1}$$

132 Eq. 7 
$$P_N = \frac{\alpha P_t - P^P}{\alpha - 1}$$

133 *Numeric calculations* 

Calculations were performed with Matlab<sup>™</sup> 8 software (The MathWorks Inc., Natick, MA)
equipped with the Statistics Toolbox and the Global Optimization Toolbox.

#### 136 MASS TRANSFER MODELS BETWEEN CHAMBER AND CONDENSER

137 Mass transfer resistance model

In most previously developed freeze-drying models, the mass flux between the freeze-dryingchamber containing the product (location 1) and the condenser (location 2) was either

ignored, considering the vapor pressure in the freeze-drying chamber as given, [3, 10, 21, 22, 23] or expressed via a mass transfer coefficient ( $k_m$ ) or, equivalently, via a mass transfer resistance ( $r_m$ ), [9, 12, 27, 28, 29] as given by Eq. 1.

143 Note that in Eq. 1 the mass flux is proportional to the partial vapor pressure difference 144 between the two locations. Vapor pressure  $P_{V2}$  is usually fixed by the condenser temperature, 145 while the mass flux  $F_V$  is mostly determined by the heat transfer flux from the temperature-146 controlled shelf to the product, i.e. by the shelf temperature and the product sublimation area. 147 If the mass transfer resistance was constant, as it is usually assumed, then the partial vapor pressure in the chamber  $P_{V1}$  would result from Eq. 1. If the mass flux was high enough, due 148 149 for example to high shelf temperature, a model based on Eq. 1 could even give a vapor 150 pressure higher that the total chamber pressure, which is obviously impossible. A more 151 consistent mass transfer model is developed in the next section.

#### 152 Binary gas transport model

153 Consider a mixture of two gases at low pressure; in the case of freeze-drying these gases 154 would be solvent vapor, usually water, released from the product and captured by the 155 condenser and the inert gas, usually nitrogen, used to control the total chamber pressure. To 156 determine the relevant mass transport theory, the Knudsen number, defined as the ratio of the 157 free mean path of the molecules and the characteristic dimension of the system, was 158 estimated. In the considered conditions, the free mean path is of order of 0.5mm at 20Pa, 159 while the typical diameter of the chamber to condenser duct is 100mm. Knudsen diffusion can 160 thus be safely neglected for the chamber to condenser pathway considered here, since  $K_n \approx 5 \times 10^{-3}$ . Note that this is usually not the case in the porous product layer where the pore 161 size can be much less than 0.5mm, but mass transport in the porous layer is out of the scope 162 163 of the present study.

- 164 The classical theory of binary diffusion in gases states that the molar flux density of solvent 165 vapor, in stationary coordinates, is given by:<sup>[30]</sup>
- 166 Eq. 8  $N_V = x_V (N_V + N_N) (c_V + c_N) D_{VN} \nabla x_V$

167 where  $N_V$  and  $N_N$  are molar flux densities,  $c_V$  and  $c_N$  molar concentrations of vapor and 168 nitrogen respectively,  $x_V$  is the molar fraction of vapor and  $D_{VN}$  is the mutual diffusion 169 coefficient. The first term on the right-hand side of Eq. 8 results from the bulk motion of the 170 fluid while the second one expresses the diffusion of vapor due to its molar fraction gradient. Assuming pseudo-stationary conditions, compared to the duration of a freeze-drying cycle which is of one or several days, and assuming insignificant leaks in the freeze-drying chamber, the net inert gas flux is negligible compared to the vapor flux:

174 Eq. 9 
$$N_N \approx 0$$

Usual variables in freeze-drying are mass fluxes instead of molar fluxes and partial pressuresinstead of molar fractions and concentrations. Using the ideal gas law one gets:

177 Eq. 10 
$$x_V = \frac{P_V}{P_V + P_N} = \frac{P_V}{P_t}$$

178 Eq. 11 
$$c_v + c_n = \frac{P_v + P_n}{RT} = \frac{P_t}{RT}$$

 $179 \qquad \text{Eq. 12} \qquad \qquad f_V = M_V N_V$ 

With these substitutions, and assuming that the variation of total pressure between freezedrying chamber and condenser is small compared to the variation in vapour partial pressure,
Eq. 8 becomes:

183 Eq. 13 
$$f_V(P_t - P_V) = -\frac{M_V}{RT} P_t D_{VN} \nabla P_t$$

To solve Eq. 13, it is assumed that the vapour flux between the product and the condenser is essentially one-dimensional. This assumption is relatively sound for freeze-driers equipped with a condenser separated from the main freeze-drying chamber by a pipe, as is the case in the present study, but it is questionable when the product and the condenser are situated in the same cavity. With this assumption, Eq. 13 can be integrated between the freeze-drying chamber (location 1) and the condenser (location 2) giving:

190 Eq. 14 
$$F_{V} = Af_{V} = \frac{AM_{V}}{l_{eff}RT}P_{t}D_{VN}\ln\frac{P_{t}-P_{V2}}{P_{t}-P_{V1}}$$

where  $F_V$  is the vapor mass flux, while A and  $l_{eff}$  are the diffusion cross-section area and effective duct length respectively. The effective length accounts for the presence of inlet and outlet sections, bends, valve and other elements that can introduce additional resistances. 194 The mutual gas diffusion coefficient  $D_{VN}$  is inversely proportional to the total pressure, thus 195 the product  $P_t D_{VN}$  is constant.<sup>[30]</sup> For a given freeze-dryer geometry ( $l_{eff}$ , A) a constant  $\beta$  can 196 be introduced:

$$\beta = \frac{l_{eff}R}{AM_V P_t D_{VN}}$$

198 so that

199 Eq. 16 
$$F_{V} = \frac{1}{\beta T} \ln \frac{P_{t} - P_{V2}}{P_{t} - P_{V1}}$$

The dependence of the mass flux on the partial vapor pressures given by Eq. 16 appears quite different from Eq. 1. It can be shown, however, using a first order Taylor series expansion of the logarithm function, that Eq. 1 is an approximation of Eq. 16 in the case when the vapor pressures are much less than the total pressure:

204 Eq. 17 
$$\ln \frac{P_t - P_{V2}}{P_t - P_{V1}} \approx \frac{P_{V1} - P_{V2}}{P_t} \quad \text{if } P_{V1} << P_t$$
and  $P_{V2} << P_t$ 

It should be noted, however, than in freeze-drying the condition  $P_{V1} \ll P_t$  is usually *not* satisfied as the gas in the freeze-drying chamber during primary drying is mostly solvent vapor. The approximation given by Eq. 17 is thus not expected to be valid. This can explain the mentioned inconsistency with Eq. 1 and the apparent variation of the effective mass transfer resistance with total pressure and mass flux, as further discussed below. For now, note that Eq. 16 can accommodate arbitrarily large vapor fluxes without  $P_{V1}$  exceeding  $P_t$ , provided that the difference  $P_t - P_{V1}$  becomes small enough, while remaining positive.

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#### **RESULTS AND DISCUSSION**

#### 214 Experimental determination of chamber to condenser mass transfer resistance

Table 1 summarizes the experimental values of the mass transfer resistance of chamber to condenser pathway measured for various process conditions.

The effective mass transfer resistance appeared to increase when increasing chamber pressure, decreasing shelf temperature and decreasing sublimation area. The mass transfer resistance was thus inversely correlated with the sublimation flux. Increasing the sublimation rate resulted in an apparent decrease of the effective mass transfer resistance of the chamber to condenser pathway. These observed variations support the idea that the mass transfer resistance is only an effective model parameter and a different perspective is needed to get a more physically meaningful description of the transfer phenomena. This is further discussed in the next sections.

225 Prediction of partial vapor pressure in the chamber by the two modeling approaches:
226 resistance vs. binary gas transport

The predictions of the previously developed freeze-drying model,<sup>[9]</sup> adapted for bacterial 227 228 suspension conditioned in trays, were compared to experimental measurements acquired in 229 freeze-drying experiments performed as described in the "Materials and methods" section. 230 Two versions of the model were tested, one based on a mass transfer resistance between the 231 chamber and the condenser (Eq. 1) and the other based on the binary gas transport assumption (Eq. 16). Details of the existing model<sup>[9]</sup> adaptation to the new freeze-dryer, container and 232 product, as well as implementation details of the new chamber-to-condenser mass transport 233 model based on Eq. 16 are given in the Appendix. The model parameters (notably  $k_m$  and  $\beta$ ) 234 were determined by fitting the models to some of the experimental data obtained in bacterial 235 236 suspension experiments (Appendix and Table 2)

An example of the predictions of the two versions of the model are shown in Figure 1, for two experiments performed at 0°C shelf temperature/60Pa chamber pressure and 25°C/20Pa, respectively. These are validation experiments not used for model parameter identification. Dotted lines represent calculations based on the mass transfer resistance model and solid lines correspond to the binary gas transport model.

242 The experiment at 0°C/60Pa (Figure 1, left panels) illustrates a situation where the prediction 243 of the primary drying termination differs by about 2 hours between the considered models. 244 The end of the primary drying was arbitrarily defined here as the moment when the 245 sublimation flux (Figure 1C) decreased below 5% of its maximum value. The resistance 246 model predicts the end of the primary drying at about 11h, in agreement with measured 247 product temperature approaching the shelf temperature (Figure 1A), while the binary gas 248 model predicts the end at bout 13h, in agreement with the decrease of vapor pressure in the 249 chamber (Figure 1B). Note that product temperature measurement is a local one, potentially 250 disturbed by the presence of the probe, while partial vapor pressure measurement is a global 251 one, representative of the whole product in the freeze-dryer. Vapor pressure should thus be

- preferred to assess the end of the primary drying.<sup>[14]</sup> It is also non intrusive and usually more conservative, minimizing the risk of premature temperature increase and product damage, if some ice was still present when starting the secondary drying step.
- 255 The experiment at 25°C/20Pa (Figure 1, right panels) illustrates a situation where both models 256 predict the same end point of the primary drying (11h), but the vapor pressure predicted by 257 the resistance model is completely in error. Compared to the previously described experiment 258 (0°C/60Pa), in this case the heat transfer resistance from the shelf to the product is higher due 259 to lower chamber pressure (lower contribution of the gas conduction), but this is nearly 260 compensated by a higher shelf temperature, leading to a similar heat flux. The net result is a 261 similar primary drying time and sublimation flux (Figure 1C) for both experimental 262 conditions. As expected from Eq. 1, a similar sublimation flux implies a similar vapor 263 pressure calculated with the resistance model, around 50Pa in this case (Figure 1B), but this 264 value is 2.5 times higher than the total pressure, which is obviously incorrect. In contrast, the 265 binary gas model based on Eq. 16 consistently predicts a vapor pressure close to, but slightly 266 less than the total one, as physically expected.
- Both these examples suggest that the binary gas transport model should be preferred to the resistance model. Similar trends were observed in all performed experiments with bacterial suspensions (data not shown). The properties of the proposed binary gas transport model are further examined in the following sections.
- 271

#### 272 Effective mass transfer resistance of the chamber to condenser pathway

Since Eq. 1 and Eq. 14 are two different ways of expressing the same vapor flux based on
different physical assumptions, these equations can be used to define an effective mass
transfer resistance of chamber to condenser pathway as:

276 Eq. 18  

$$r_{m} = \frac{1}{k_{m}} = \frac{l_{eff} RT(P_{V1} - P_{V2})}{AM_{V} P_{t} D_{VN} \ln \frac{P_{t} - P_{V2}}{P_{t} - P_{V1}}} = \beta T \frac{P_{V1} - P_{V2}}{\ln \frac{P_{t} - P_{V2}}{P_{t} - P_{V1}}}$$

- It readily appears from Eq. 18 that this resistance is not constant but is an effective modelcoefficient that depends on the actual values of the total and vapor pressure.
- The effective mass transfer resistance given by Eq. 18 is plotted in Figure 2 (solid line) as a function of the vapor pressure near the product ( $P_{V1}$ ), for two different total pressures ( $P_t = 20$

and 60Pa) used in our experiments. The vapor pressure near the condenser was fixed to a low value  $P_{V2} = 0.055$  Pa, corresponding to a typical condenser temperature of  $-80^{\circ}$ C. For comparison, the value of r<sub>m</sub> determined for the mass transfer resistance model in the same conditions is also given in Figure 2 (dotted line).

Firstly, Figure 2 indicates that the effective mass transfer resistance strongly increases with the total pressure. This was expected from the experimental data in Table 1 and confirms the usual practice of performing freeze-drying at low pressure to improve mass transfer.

Secondly, the effective mass transfer resistance predicted by the binary gas model approaches zero when the vapor pressure in the chamber approaches the total pressure. This was expected from the mathematical analysis of Eq. 18 and is consistent with the fact that partial vapor pressure in the chamber cannot exceed the total one, whatever the sublimation flux. Note that this is not the case with a constant mass transfer resistance, when the vapor pressure in the chamber can formally exceed the total pressure for a sufficiently high sublimation flux in Eq. 1.

Finally, Figure 2 shows that the value of the mass transfer resistance determined using the resistance model based on Eq. 1 is situated between the bounds given by Eq. 18, as expected. The effective resistance given by the binary gas transport model is close to this value for vapor pressures very close to the total pressure. This means that the vapor pressure calculated by the binary gas model for the primary drying is most of the time very close to the total pressure, as observed in Figure 1 and well known from freeze-drying practice. This is further illustrated in the following section.

#### 302 Sublimation flux and predicted vapor pressure in the chamber

303 In usual freeze-drying conditions the sublimation mass flux is the result of several process 304 parameters (Table 1), such as total chamber pressure (that changes both heat and mass 305 transfer), shelf temperature and sublimation interface area, etc. For the mass transfer 306 resistance model given by Eq. 1, the predicted vapor pressure in the freeze-drying chamber 307 varies linearly with the mass flux (dotted line in Figure 3) and can, as already mentioned, 308 exceed the total pressure, for example in the case of a sufficiently high shelf temperature 309 (Figure 1, right panels). In contrast, the vapor pressure predicted by the gas diffusion model 310 given by Eq. 16 asymptotically tends towards the total pressure for high sublimation mass 311 fluxes, which is physically consistent (solid lines in Figure 3). This also corroborates the well known fact that gas composition in the freeze-drying chamber is dominated by vapor during most of the primary drying stage, when sublimation fluxes are high (approaching  $2 \times 10^{-5}$ kg s<sup>-1</sup> in the considered experimental setting).

#### 315 Sublimation flux and effective mass transfer resistance of the chamber to condenser pathway

316 Considering the effect of the sublimation mass flux in the binary gas transport model gives a 317 common framework to understand the apparent variations of the effective mass transfer 318 resistances observed in Table 1 for different shelf temperatures and sublimation interface 319 areas. Increasing both these variables increases the sublimation flux and this, in turn, causes 320 an apparent reduction of the effective mass transfer resistance (Figure 4). For sublimation fluxes approaching  $2 \times 10^{-5}$ kg s<sup>-1</sup>, representative of the primary drying in the considered 321 322 experiments (Figure 1), the mass transfer resistance determined for the resistance model is 323 intermediate between those calculated with the binary gas model for 20 and 60Pa total 324 pressure. This reflects the compromise that the model fitting procedure finds to accommodate 325 experiments performed at both these pressures, but the achieved compromise underestimates 326 the vapor pressure at 60Pa and overestimates it at 20Pa, as already shown in Figure 1.

#### 327 The binary gas transport model needs a unique constant parameter

328 As an additional difference between the two models, note that in the mass transfer resistance 329 model the value of the resistance between the chamber and the condenser pathway is only an 330 effective model parameter that appears to be a function of several process variables (Table 1): 331 total pressure, shelf temperature and product sublimation area. Accounting for this would require varying the resistance in a tricky and ad-hoc manner. Considering a constant value of 332 the mass transfer resistance ( $r_m = 2.78 \times 10^6$ Pa s kg<sup>-1</sup> in our case) leads to poor predictions and 333 334 inconsistencies, such as calculated partial vapor pressure in the chamber exceeding the total 335 one (Figure 1 and Figure 3). On the contrary, binary gas diffusion theory states that the product  $P_t D_{VN}$  is constant and therefore in the binary gas transport model the analogous 336 parameter  $\beta$ , given by Eq. 15, is constant. All solid plots in Figures 1–4 were obtained with 337 the same value of  $\beta = 2.66 \times 10^3 \text{ s kg}^{-1} \text{ K}^{-1}$ . 338

#### 339 In-process mass flux estimation and detection of the primary drying termination

340 Eq. 16 could be used in principle for obtaining vapor flow rate estimations based on total and

341 partial pressure measurements, and thus act as an in-process mass flow meter. In practice,

however, estimations of "high" vapor flow rates (i.e. when the partial vapor pressure 342 343 approaches the total one) are expected to be inaccurate due to the vapor saturation of the 344 chamber illustrated in Figure 3: a wide range of sublimation fluxes corresponds to almost 345 identical partial vapor pressures, very close to the total chamber pressure. For example, with 346 the considered values of the parameters (Appendix) at a total pressure of 60Pa, a vapor pressure of 59.99Pa corresponds to a sublimation flux of  $1.14 \times 10^{-5}$ kg s<sup>-1</sup>, while a vapor 347 pressure of 58.99Pa corresponds to a sublimation flux of  $0.53 \times 10^{-5}$ kg s<sup>-1</sup>. In other words, an 348 349 uncertainty of only 1Pa in the measurement of the vapor pressure would induce a factor 2 350 error on the flux value, which is clearly inappropriate for practical use.

On the contrary, Figure 3 suggests that the estimation of "low" vapor fluxes (i.e. when the partial vapor pressure is well below the total one) based on pressure measurements could be quite accurate. For example, vapor pressures of 30 and 29Pa correspond to vapor fluxes of  $0.091 \times 10^{-5}$ kg s<sup>-1</sup> and  $0.086 \times 10^{-5}$ kg s<sup>-1</sup> respectively; a measurement uncertainty of 1Pa would induce only about 5% error on the vapor flux.

Above considerations suggest that the proposed model is appropriate for a safe detection of the primary drying termination because a decrease of the vapor pressure well below the total one indicates a strong decrease of the sublimation flux. Continuing the above numerical examples, a vapor pressure in the chamber decreasing to the half of the total pressure corresponds to a factor 10 reduction of the sublimation flux. Of course, exact significance of "high" and "low" mass fluxes and the relevant decrease of vapor pressure depend on numerical values grouped in the parameter  $\beta$  defined by Eq. 15, and also involved in Eq. 16.

Finally, note that the proposed in-process flow estimation method based on total and partial pressure measurements in the chamber is complementary to the method described by Patel et al.<sup>[31]</sup>, based on differential pressure measurement between the chamber and the condenser. Indeed, the former works well for low sublimation fluxes while the latter is expected to be more accurate when the sublimation flux, and hence the measured pressure difference, are large.

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#### CONCLUSIONS

Results presented in this paper suggest that using one-dimensional mass transfer theory in binary gas mixtures to describe vapor transfer between the freeze-drying chamber and the condenser should be preferred to the mass transfer resistance approach. Advantages of the binary gas transport model include: (i) prediction of the vapor pressure in the freeze-drying chamber closer to the experimental one, leading to more reliable prediction of the end of the primary drying; (ii) calculated values of the vapor pressure physically consistent with the total pressure, whatever the sublimation vapor flux; (iii) need to determine a single model parameter for a given freeze-dryer geometry, independent on the operating conditions (total pressure, shelf temperature, ice sublimation area).

The main drawback of the mass diffusion model is the non-linear dependence between the vapor flux and vapor pressure, which can somewhat complicate model simulations. Solution of non-linear differential and algebraic equation sets is already part of most freeze-drying models, however, and the additional difficulty introduced by the diffusion model is expected to be minor, as confirmed by the authors' experience.

The assumption of one-dimensional mass transfer between the freeze-drying chamber and the condenser could be questioned in the future, especially for freeze-dryers with the condenser situated in the freeze-drying chamber. The challenge would be to end up with a reasonably simple closed-form relationship between mass flux and pressure, in order to maintain the overall model minimalism and short simulation time.

389

#### NOMENCLATURE

390	С	molar concentration	kmol m <sup>-3</sup>
391	f	mass flux density	kg s <sup>-1</sup> m <sup>-2</sup>
392	k	mass transfer coefficient	kg s <sup>-1</sup> Pa <sup>-1</sup>
393	l	diffusion length	m
394	r	mass transfer resistance	Pa s kg <sup>-1</sup>
395	x	molar fraction	kmol kmol <sup>-1</sup>
396	A	diffusion cross-section area	$m^2$
397	D	mutual diffusion coefficient	$m^2 s^{-1}$
398	F	mass flux	kg s <sup>-1</sup>
399	$K_n$	Knudsen number	_
400	М	molar mass	kg kmol <sup>-1</sup>

401	N	molar flux density	kmol s <sup>-1</sup> m <sup>-2</sup>
402	Р	pressure	Ра
403	R	ideal gas constant	J kmol <sup>-1</sup> K <sup>-1</sup>
404	Т	absolute temperature	Κ
405	Gree	ek letters	
406	α	heat conductivity ratio	_
407	β	mass transfer parameter	s kg <sup>-1</sup> K <sup>-1</sup>
408	λ	heat conductivity	$Wm^{-1}K^{-1}$
409	Sub	scripts	
410	1	freeze-drying chamber, nea	r product
411	2	condenser	
412	3	ice sublimation front	
413	4	product top	
414	eff	effective	
415	т	mass	
416	t	total	
417	N	inert gas, nitrogen	
418	V	solvent vapor, water	
419	Superscript		
420	Р	measured by Pirani gauge	
421			
422			ACKNOWLEDGEMENT
423	The	research leading to these res	sults has received funding from the European Community's
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425	212	754.	
426			

# 427 APPENDIX: EMBEDDING THE BINARY GAS TRANSPORT EQUATION IN A 428 COMPLETE FREEZE-DRYING MODEL

The binary gas transport equation proposed in this paper (Eq. 16) describes the mass flux between the freeze-drying chamber and the condenser, in replacement of the more classical equation involving a mass transfer resistance or a mass transfer coefficient (Eq. 1). Both equations were tested in conjunction with an existing freeze-drying model, described in full detail previously.<sup>[9]</sup>

In a first step, the parameters of the existing model<sup>[9]</sup> based on Eq. 1 were re-estimated to 434 435 account for a different freeze-dryer (LyoBeta special freeze-dryer from Telstar, Terrassa, 436 Spain, instead of SMH15 freeze dryer from Usifroid, Maurepas, France), a different container 437 (metallic tray instead of glass vial) and a different product (lactic acid bacterial suspensions in 438 sucrose medium instead of polyvinylpyrrolidone). Parameters related to the sorption isotherm 439 and to the glass transition of the product were determined with the methodology described previously.<sup>[25]</sup> Parameters related to the heat and mass transfer in the freeze-dryer and in the 440 441 product were estimated by fitting the product temperature and vapor pressure predicted by the 442 model to experimental measurements. Four experiments were used simultaneously for model 443 parameter estimation, performed in the following combinations of shelf temperature and total 444 chamber pressure: -20°C/20Pa, -20°C/60Pa, 25°C/20Pa and 25°C/60Pa. A genetic 445 optimization algorithm (Global Optimization Toolbox for Matlab, Natick, MA) was used for 446 parameter identification. Since the considered optimization algorithm is stochastic, the 447 parameter set with the best fit from 8 independent optimization runs was selected. Most 448 optimization runs consistently converged to similar sets of parameters, usually within  $\pm 10\%$ . 449 Model parameters used in the present study are listed in Table 2.

In a second step, the original mass transfer equation between the chamber and the condenser (Eq. 1) was replaced by the newly proposed one (Eq. 16) and the parameter estimation procedure was repeated using the same data and the same algorithm. The estimated parameter values are also given in Table 2. As expected, the estimated values of the parameters are similar between the two models, with the exception of the parameter describing mass transfer between the freeze-drying chamber and the condenser ( $k_m$  for the resistance model and  $\beta$  for the binary gas transport model), which have different physical meanings.

457 Since the newly introduced equation is nonlinear and the vapor pressure in the chamber is 458 unknown *a priori*, the sublimation flux cannot be determined explicitly as in the resistance 459 version of the model.<sup>[9]</sup> The vapor pressure in the chamber  $(P_{V1})$  was considered as an 460 additional state variable and the corresponding mass balance equation in the freeze-drying 461 chamber was added to the existing set of differential equations:

462 Eq. 19 
$$\frac{M_V V_1}{RT} \cdot \frac{dP_{V1}}{dt} = F_{V31} - F_V$$

Here  $V_1$  is the freeze-drying chamber volume,  $F_V$  is the chamber to condenser vapor flux given by Eq. 16 and  $F_{V31}$  is the sublimation vapor flux between the ice sublimation front (location 3) and the freeze-drying chamber (location 1), given by:

466 Eq. 20 
$$F_{V31} = \frac{1}{\frac{1}{k_{m34}} + \frac{1}{k_{m41}}} (P_{V3} - P_{V1})$$

467 where  $k_{m34}$  and  $k_{m41}$  are the mass transfer coefficients between the sublimation front and the 468 product top (location 4), and between the product top and the chamber, respectively. Thus, 469 both mass fluxes involved in Eq. 19 can be written explicitly in terms of known (fixed or 470 state) variables ( $P_{V1}$ ,  $P_{V2}$ , and  $P_{V3}$ ).

Note that in the original freeze-drying model vapor accumulation in the freeze-drying 471 chamber was neglected, based on a time scale analysis.<sup>[9]</sup> This is formally equivalent to 472 setting the chamber volume  $V_1 \approx 0$  in Eq. 19, which would thus become an algebraic instead 473 474 of a differential equation. This version of the model was also tested but not retained, due to 475 occasional failures in solving the equation set during parameter identification. Observed 476 difficulties are likely to be related to the specific differential-algebraic equations (DAE) 477 solver available in Matlab (ode15s) which had numerical problems with some sets of 478 parameters tested by the optimisation algorithm.

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#### 572 <u>Figure captions</u>

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Figure 1. Comparison between experimental measurements and simulations with the binary
gas transport and resistance models, for two experiments with lactic acid bacteria
suspensions (left panel 0°C/60Pa, right panel 25°C/20Pa). (A): Shelf and product
temperatures, (B): Total and vapour pressures, (C): Sublimation fluxes. Bold: shelf
temperature and total pressure, symbols: measurements, solid: binary gas model, dotted:
resistance model, vertical line: end of primary drying.

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Figure 2. Variation of the effective mass transfer resistance with the vapor and total pressure.
Numeric values are for lactic acid bacteria suspension. Solid: binary gas model, bold: total
pressure 60Pa, thin: total pressure 20Pa, dotted: resistance model.

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Figure 3. Predicted vapor pressure as a function of the sublimation mass flux. Numeric values
are for lactic acid bacteria suspension. Solid: binary gas transport model, bold: total
pressure 60Pa, thin: total pressure 20Pa, dotted: resistance model.

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Figure 4. Apparent variation of the effective mass transfer resistance of the chamber to
condenser pathway as a function of the sublimation mass flux. Numeric values are for
lactic acid bacteria suspension. Solid: binary gas transport model, bold: total pressure
60Pa, thin: total pressure 20Pa, dotted: resistance model.

Total chamber pressure (Pa)	Shelf temperature (°C)	Sublimation interface area (m <sup>2</sup> )	Chamber to condenser resistance (10 <sup>6</sup> Pa s/kg)
10 20 40 60	0	0.074	0.65 1.29 2.64 3.72
40	-15 0 15	0.074	4.31 2.64 1.61
20	0	0.033 0.074 0.15	2.34 1.29 0.67

596 Table 1. Chamber to condenser mass transfer resistance measured with pure ice.

600 Table 2. Values of the freeze-drying model parameters

Parameters defined by the experimental setup		
Number of trays (–)	1	
Sublimation area (m <sup>2</sup> )	0.0745	
Mass of dry product (kg)	0.0736	
Mass of ice (kg)	0.3763	
Product height in the tray (m)	0.0067	
Volume of the freeze-drying chamber $(m^3)$	0.202	

Parameters specific for the product formulation, determined in separate experiments<sup>[25]</sup>

Sorption isotherm, wet basis (kg kg <sup>-1</sup> )	$0.3190a_{w}$
	$\overline{(1-0.9827a_w)(1+6.3668a_w)}$
Characteristic desorption time (s)	10100
Glass transition temperature of the frozen	-36
product (°C)	
Glass transition temperature of the perfectly	75.6
dry product (°C)	
Gordon-Taylor coefficient for glass transition	8.2
temperature (–)	

Heat and mass transfer parameters determined by model fitting

	Mass transfer resistance model	Binary gas transport model
Heat transfer coefficient by contact and radiation, between shelf and product bottom $(W \text{ m}^{-2} \text{ K}^{-1})$	6.74	7.29
Heat transfer coefficient by gas conduction, between shelf and product bottom (W $m^{-2} K^{-1} Pa^{-1}$ )	0.400	0.366
Heat conductivity between sublimation front and product top (W $m^{-1} K^{-1}$ )	0.0957	0.0996
Heat transfer coefficient between product top and chamber walls (W $m^{-2} K^{-1}$ )	3.79	3.03
Vapor conductivity between sublimation front and product top (kg s <sup>-1</sup> m <sup>-1</sup> Pa <sup>-1</sup> )	2.07×10 <sup>-8</sup>	1.98×10 <sup>-8</sup>
Vapor transfer coefficient between product top and chamber (kg s <sup>-1</sup> m <sup>-2</sup> Pa <sup>-1</sup> )	8.12×10 <sup>-5</sup>	3.68×10 <sup>-4</sup>
Vapor transfer coefficient between chamber and condenser $k_m$ (kg s <sup>-1</sup> Pa <sup>-1</sup> )	3.60×10 <sup>-7</sup>	Not applicable
Vapor transfer parameter between chamber and condenser $\beta$ (s kg <sup>-1</sup> K <sup>-1</sup> )	Not applicable	2.66×10 <sup>3</sup>
Residual frozen layer thickness for gradual transition between primary and secondary drying (m)	0.00173	0.00170
Effective chamber wall temperature (°C)	15.3	13.9

601 Complete model equations and exact definitions of the model parameters are given in ref.<sup>[9]</sup>



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Figure 1. Comparison between experimental measurements and simulations with the binary gas transport and resistance models, for two experiments with lactic acid bacteria suspensions (left panel 0°C/60Pa, right panel 25°C/20Pa). (A): Shelf and product temperatures, (B): Total and vapour pressures, (C): Sublimation fluxes. Bold: shelf temperature and total pressure, symbols: measurements, solid: binary gas model, dotted: resistance model, vertical line: end of primary drying.



Figure 2. Variation of the effective mass transfer resistance with the vapor and total pressure.
Numeric values are for lactic acid bacteria suspension. Solid: binary gas model, bold: total
pressure 60Pa, thin: total pressure 20Pa, dotted: resistance model.

Predicted vapor pressure near product  $(P_{V1}, Pa)$ 

0.5



0` 0

Figure 3. Predicted vapor pressure as a function of the sublimation mass flux. Numeric values are for lactic acid bacteria suspension. Solid: binary gas transport model, bold: total pressure 60Pa, thin: total pressure 20Pa, dotted: resistance model.

Sublimation mass flux ( $F_V$ , kg s<sup>-1</sup>)  $2 \times 10^{-5}$ 

1.5



Figure 4. Apparent variation of the effective mass transfer resistance of the chamber to
condenser pathway as a function of the sublimation mass flux. Numeric values are for lactic
acid bacteria suspension. Solid: binary gas transport model, bold: total pressure 60Pa, thin:
total pressure 20Pa, dotted: resistance model.