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# Ventilatory oscillations at exercise in hypoxia: a mathematical model.

Eric Hermand, François J Lhuissier, Nicolas Voituron, Jean-Paul Richalet

Université Paris 13, Sorbonne Paris Cité, Laboratoire "Hypoxie et poumons", EA2363, 74 rue Marcel Cachin, 93017 Bobigny Cedex, France

# **Corresponding authors**

richalet@univ-paris13.fr (J.P. Richalet) eric.hermand17@gmail.com (E. Hermand)

Laboratoire "Hypoxie & poumon", EA2363 74 rue Marcel Cachin 93017 Bobigny Cedex, FRANCE Tel: 33148387758 / Fax: 33148388924

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# Abstract

We evaluated the mechanisms responsible for the instability of ventilation control system under simultaneous metabolic (exercise) and environmental (hypoxia) stresses, promoting the genesis of periodic breathing. A model following the main concepts of ventilatory control has been tested, including cardiovascular and respiratory parameters, characteristics of peripheral and central chemoreceptors, at mild exercise in hypoxia (FIO<sub>2</sub>=0.145). Interaction between O<sub>2</sub> and CO<sub>2</sub> sensing was introduced following three different modalities. A sensitivity and multivariate regression analyses closely matched with physiological data for magnitude and period of oscillations. Low FIO<sub>2</sub> and long circulatory delay from lungs to peripheral chemoreceptors (DeltaTp) lengthen the period of oscillations, while high peripheral and central chemoresponses to O<sub>2</sub> and CO<sub>2</sub>, low FIO<sub>2</sub> and high DeltaTp increased their magnitude. Peripheral and central O<sub>2</sub> / CO<sub>2</sub> interactions highlight the role of CO<sub>2</sub> on peripheral gain to O<sub>2</sub> and the contribution of peripheral afferences on central gain to CO<sub>2</sub>. Our model supports the key role of peripheral chemoreceptors in the genesis of ventilatory oscillations. Differences in the dynamics of central and peripheral components might be determinant for the system stability.

# 2 1. Introduction

Recent observations showed the existence of ventilatory oscillations in hypoxia during exercise (Hermand et al., 2015a, 2015b; Latshang et al., 2013). This instability of the ventilatory control system was related, at exercise, to cardiac output, minute ventilation, ventilatory response to hypoxia and to hypercapnia (Hermand et al., 2015a, 2015b). A subtle interplay between CO<sub>2</sub> and O<sub>2</sub> sensing seemed to play a major role in the underlying mechanisms. However, considering the complexity of the system, we thought that developing a model of ventilatory control in these specific conditions of hypoxia and exercise would allow us to unravel the factors involved in this instability.

The first attempt of modeling the ventilatory control system was developed by Grodins, and was based 10 on mass balance equation for O<sub>2</sub> and CO<sub>2</sub> (Grodins et al., 1967). Many of the next developed models 11 followed this approach. Whereas most of them were focused on steady state breathing under hypoxia 12 and/or hypercapnia, only a few covered the complex topic of stability of ventilation control. 13 Longobardo (Longobardo et al., 1982) and Khoo (Khoo et al., 1982) developed models describing the 14 15 mechanisms of ventilatory oscillations in sleep apnea syndrome (SAS) and chronic heart failure (CHF). Models became more complex with the addition of numerous cardiorespiratory and neural 16 inputs, and the technological and computing progress (Fan and Khoo, 2002). These simulations have 17 brought valuable clinical insights in our understanding of breathing disorders in SAS and CHF 18 patients, both in their intrinsic mechanisms and in the potential treatments by O<sub>2</sub> or CO<sub>2</sub> inhalation 19 20 (Cherniack, 2005).

21 However, to our knowledge, no dynamic model involving both hypoxia and exercise has been built yet. This double concomitant stress destabilizes the ventilatory control system, enhances the overall 22 loop gain of the system, leading to the genesis of ventilatory oscillations. This phenomenon, not 23 characterized until very recently, is not included in nor explained by any of the existing models. 24 Therefore, in order to deepen our understanding of mechanisms and parameters influencing the 25 ventilatory system stability under these specific physiological and environmental stimuli, our objective 26 27 was to develop a new mathematical model including most of the processes involved in ventilatory 28 control, and to identify the physiological factors that could account for our recent observations (Hermand et al., 2015a, 2015b). However, as a rule in modeling physiological processes, we aimed to 29 30 find the *simplest* model that could account for the physiological observations (Richalet, 1991).

31

#### 32 **2. Methods**

#### 33 2.1. Model description

Our model of ventilation control can be described as a pulmonary gas exchange system and chemoreflex / regulation centers, connected by the cardiovascular system, which transports blood gas

information (Fig. 1) (Duffin, 2005; Grodins et al., 1967; Wolf and Garner, 2007). The cardiovascular 36 37 and ventilatory systems are functioning tightly together and are dependent upon each other in a complex and time-related way. In existing models, the emergence of oscillations in SAS and CHF is 38 conditioned by two main factors: a longer circulation time from lung to peripheral and central 39 chemoreceptors, and a higher chemosensitivity to O<sub>2</sub> and CO<sub>2</sub>. Those parameters will be included into 40 our model, and their assigned values will vary accordingly to: 1. a metabolic stress, exercise, which 41 will impact  $O_2$  consumption ( $\dot{V}O_2$ ),  $CO_2$  production ( $\dot{V}CO_2$ ) and cardiac output ( $\dot{Q}c$ ) in a different way 42 than in sleep appears or heart failure; 2. an environmental stress, hypoxia, with an inhaled fraction of  $O_2$ 43 (FIO<sub>2</sub>) varying from a simulated sea level (FIO<sub>2</sub> = 0.21) to a 4800 m altitude (FIO<sub>2</sub> = 0.115). 44

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**Figure 1**. Respiratory control model. Minute ventilation ( $\dot{VE}$ ) is the sum of a basal value represented by the central command adapted to the metabolic needs (rest/exercise), modulated by peripheral and central components. The P<sub>a</sub>O<sub>2</sub> and P<sub>a</sub>CO<sub>2</sub> gas information is transported to peripheral and central chemoreceptors respectively after a pure time delay of blood convection. The respiratory control center is then stimulated to adjust  $\dot{VE}$  according to P<sub>a</sub>O<sub>2</sub> and P<sub>a</sub>CO<sub>2</sub> set points.

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#### 48 2.1.1. Protocol design

In accordance with our previous work (Hermand et al., 2015b), our model consists in two successive phases built to simulate similar protocol conditions: rest and mild exercise, either in normoxia or hypoxia, the latter obtained by breathing a hypoxic gas mixture, arterial blood  $CO_2$  pressure (P<sub>a</sub>CO<sub>2</sub>)

52 being free to vary (poikilocapnia).

53 To remain close to physiological behavior, time constants are applied to the basal cardiorespiratory

parameters ( $\dot{Q}c$ ,  $\dot{V}O_2$ , and ventilation  $\dot{V}E$ ) in the transitions from normoxia to hypoxia and from rest to

exercise. We obtained realistic values of these time constants by identifying our experimental datawith a simple first order system (Fig. 2).



**Figure 2**. Example of identification of transition from normoxia to hypoxia at exercise for the determination of time constants, between physiological data ( $S_aO_{2 exp}$  and  $\dot{V}E_{exp}$ , dashed lines) and model ( $S_aO_{2 mod}$  and  $\dot{V}E_{mod}$ , solid lines).

57

#### 58 2.1.2. Mass balance equations

59 Mass balance equations are defined for each state variable, per unit of time.

Model inputs are  $O_2$  fraction in the inspired air (FIO<sub>2</sub>),  $O_2$  consumption rate ( $\dot{V}O_2$ ), cardiac output ( $\dot{Q}c$ ), ventilatory equivalent for  $O_2$  (EVO<sub>2</sub>), respiratory quotient (QR), alveolar/total ventilation ratio (rVAVE), circulation time from lungs to central and peripheral chemoreceptors (see section 2.1.4), gains of ventilatory responses to  $O_2$  and  $CO_2$  (see section 2.1.5). Model outputs are minute ventilation ( $\dot{V}E$ ), arterial  $O_2$  pressure and saturation ( $P_aO_2$  and  $S_aO_2$ ) and arterial  $CO_2$  pressure ( $P_aCO_2$ ). Intrapulmonary and cardiac shunts are negligible at rest and during mild exercise.

66

#### 67 2.1.3. Ventilatory control system

Two distinct components are included in total ventilation (VE), in addition to a basal ventilation (VEb) determined by the central command: the ventilatory response from peripheral chemoreceptors (VEp) and the ventilatory response from central chemoreceptors (VEc), when activated by hypoxia and/or hypercapnia.

$$\dot{V}E = \dot{V}Eb + \dot{V}Ep + \dot{V}Ec$$

In case of disturbances in the ventilatory system, the central and peripheral components will act as negative feedback mechanisms to bring back the system to equilibrium, represented by  $P_aCO_2$  and  $P_aO_2$  set points.

Ventilatory response to hypoxia at rest shows a biphasic response: first, a rise of ventilation due to the 75 activation of peripheral chemoreceptors by the decrease of arterial O<sub>2</sub> pressure; then a progressive 76 77 decline, called hypoxic ventilatory depression (HVD), after several minutes (Khamnei and Robbins, 78 1990), mainly due to prolonged neural hypoxia and central CO<sub>2</sub> washout caused by an increase of 79 cerebral blood flow (Ursino et al., 2001). Most models integrate HVD. However, during mild exercise, HVD is largely blunted (Ward and Nguyen, 1991) and our experimental data confirm that ventilation 80 81 remains steady during the entire exercise phase. Therefore, HVD mechanism was not included in our 82 model.

83

#### 84 2.1.4. Cardiovascular control: cardiac output, cerebral blood flow and circulation delay

Data from the literature and from our own experimental observations indicate that cardiac output is increased twofold during mild exercise (30% of maximal aerobic power), compared to rest (Hermand et al., 2015a, 2015b).

In order to facilitate the simulation process and the understanding of the influence of cardiac and cerebral blood flow, depending on several parameters such as blood velocities and vessel diameters in the successive arteries, we computed two circulation delays from lungs to peripheral chemoreceptors (DeltaTp) and from lungs to central chemoreceptors (DeltaTc) respectively. We assume that circulation delays are reduced when passing from rest to exercise and from normoxia to hypoxia.

At the central level, the delay between an instantaneous change of O<sub>2</sub> and CO<sub>2</sub> pressure in the lungs 93 94 and the corresponding ventilatory response can be split into a circulatory delay and a tissue delay including the diffusion into the tissue (kinetic of  $H^+$  ions crossing the blood-brain barrier) and a neural 95 96 delay from the chemoreceptors to integration centers and down to ventilatory muscles. Tissue delay is 97 considered negligible at peripheral chemoreceptors, whereas a significant tissue delay (DeltaTct) will 98 be added to the central circulation delay (Ogoh and Ainslie, 2009). Therefore, the delay between changes in O<sub>2</sub> and CO<sub>2</sub> pressures in the lungs and the ventilatory response via central chemoreceptors 99 100 is the sum

#### DeltaTcc = DeltaTc + DeltaTct

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- 105 2.1.5. Peripheral and central chemoreflex: O<sub>2</sub> and CO<sub>2</sub> gains
- 106 The mechanisms of central and peripheral chemoreceptor activation (Grodins et al., 1967; Richalet,
- 107 1991) are represented by relations between gas pressure changes and ventilation, with a pure delay,
- 108 involving  $O_2$  and  $CO_2$  set points and gains.
- 109 pH is generally well regulated by the organism at rest and at low intensity exercise, and therefore no
- acidosis is observed in the present condition (Sun et al., 2001), and therefore there is no change of
- 111 peripheral chemoreceptor activity due to a change in blood pH.
- The interaction between  $O_2$  and  $CO_2$  stimuli at the level of the peripheral or central chemoreceptors has been introduced in the model to evaluate its possible implication in the generation of instability (Blain et al., 2010; Duffin, 2010; Smith et al., 2015). Recent works from the Dempsey group (Blain et al., 2010; Smith et al., 2015) confirmed and quantified, in a mammal model, the interaction between peripheral and central chemoreceptors, and between  $CO_2$  and  $O_2$ : the nucleus tractus solitarius (NTS) receives afferences from the peripheral chemoreceptors and sends projections into the central respiratory command and, potentially, the central chemoreceptors (Smith et al., 2013).
- This led us to design and test three models of combined effects of  $O_2$  and  $CO_2$  (fig. 3): 1) *Additive model.* additive effects of central response to  $CO_2$  and peripheral responses to  $O_2$  and  $CO_2$ . The latter (GCO<sub>2P</sub>) is defined as a ratio (pcratio) of the peripheral/central gain to  $CO_2$  (GCO<sub>2C</sub>) (Wolf and Garner, 2007); 2) *Peripheral interactive model*: effect of  $P_aCO_2$  at the peripheral level. The peripheral gain to  $O_2$  is positively modulated by a coefficient (contribCO<sub>2p</sub>) multiplied by the difference between  $P_aCO_2$  and  $P_aCO_{2C}$ . 3) *Central interactive model*: interaction between central  $CO_2$  sensing and peripheral input ( $O_2 + CO_2$ ) at the central level. In addition to peripheral action on central respiratory
- 126 command, central gain to  $CO_2$  is augmented by peripheral afferences (gain to  $O_2$  and  $CO_2$ ) modulated 127 by the coefficient 'interac' (Blain et al., 2010; Smith et al., 2015).
- Central CO<sub>2</sub> gain is obtained from a modified Read's rebreathing test (Read, 1967). This test also gives a value of alveolar CO<sub>2</sub> pressure threshold ( $P_aCO_{2Cth}$ ) under which CO<sub>2</sub> gain is null. Similarly, peripheral ventilatory response to CO<sub>2</sub>, linear above a peripheral  $P_aCO_2$  threshold ( $P_aCO_{2Pth}$ ), is defined as the product of peripheral CO<sub>2</sub> gain by the difference between  $P_aCO_2$  and  $P_aCO_2$  set point ( $P_aCO_{2C}$ ) (Casey et al., 1987). Exercise does not modify the ventilatory response to CO<sub>2</sub> (Hulsbosch et al., 1981): therefore, we used the same value for exercise and rest conditions.
- Peripheral  $O_2$  gain is obtained at rest and exercise from standard tests previously described (Lhuissier et al., 2012). The  $O_2$  stimulus for peripheral chemoreceptors is tissue  $PO_2$ , derived from arterial  $PO_2$ , with a hyperbolic response (Weil et al., 1970). However, combining this hyperbolic response and the sigmoid shape of oxyhemoglobin dissociation curve (approximated by the Hill constant NH and P50),
- 138 an empirical linear relationship appears between ventilatory response to hypoxia and arterial O<sub>2</sub>

- 139 saturation (Steinacker et al., 1996). VEc is the product of  $CO_2$  gain by the difference between  $P_aCO_2$
- 140 and the  $P_aCO_2$  set point ( $P_aCO_{2C}$ ). Depending on the model used,  $\dot{V}Ep$  is the result of the respective
- 141 contribution of peripheral O<sub>2</sub> and CO<sub>2</sub> gains. See appendix for equations.



**Figure 3.** Diagrams of the three different models: additive, peripheral interactive and central interactive. The central respiratory command receives direct or indirect afferences from peripheral (through nucleus tractus solitaries, NTS) and central chemoreceptors (PCR and CCR, respectively), modulated by  $P_aO_2$  and  $P_aCO_2$ . Details of each model are explained in text.

143 2.1.6. Lungs: dead space, mechanoreceptors, respiratory quotient, alveolar-capillary difference in 144  $O_2/CO_2$ ,  $O_2$  alveolar-arterial diffusion

145 As values of alveolar blood gases are determined by alveolar ventilation while the chemosensory loops act on total ventilation, it seems important to take into account the dead space by introducing the 146 147 alveolar/total ventilation ratio (rVAVE). This ratio is slightly augmented by moderate exercise (Wasserman et al., 1967). During moderate exercise in hypoxia, respiratory quotient (QR) is slightly 148 higher than at rest (de Lattre et al., 1969). The activity of pulmonary mechanoreceptors is not modified 149 by mild exercise (Fenik, 1992) and therefore will not be included in the present model. The alveolar-150 capillary difference in O<sub>2</sub> (DAaO<sub>2</sub>) increases with cardiac output from rest to exercise, and with 151 hypoxia (Woorons et al., 2007). This variation in DAaO<sub>2</sub> is modulated by a coefficient (DlimO<sub>2</sub>) of O<sub>2</sub> 152 153 diffusion limitation of O<sub>2</sub>. On the other hand, the alveolar-capillary difference in CO<sub>2</sub> (DAaCO<sub>2</sub>) is 154 considered constant in all conditions (see appendix).

- 155
- 156 2.1.7. Alveolar space

157 Pulmonary alveolar space can be considered as a "mixing box" where O<sub>2</sub> and CO<sub>2</sub> are not instantly

- homogenous when ventilation changes. Alveolar  $CO_2$  pressure ( $P_ACO_2$ ) is determined by the equation
- relating  $\dot{V}E$ , QR,  $\dot{V}O_2$  and rVAVE (see appendix). When submitted to various environmental or

160 metabolic stresses, the value of  $P_ACO_2$  is not immediately modified by variations of the parameters 161 cited above. A new equilibrium is reached through a first-order equation involving the level of  $\dot{V}E$  and 162 the volume of the mixing box (TLC, total lung capacity), from which a time constant TaupCO<sub>2</sub> is 163 computed (see appendix).

164

#### 165 *2.2. Parameter assignment*

All values were obtained from previous research protocols (Hermand et al., 2015a, 2015b) or from the literature (Duffin, 2010; Pianosi and Khoo, 1995; Saunders et al., 1980; Wolf and Garner, 2007; Zapata et al., 2012). The time constants for the main cardiorespiratory parameters ( $\dot{V}O_2$ ,  $\dot{Q}c$ ) were obtained by an identification algorithm from our own data, and in accordance with those found in literature: values are ranged from 10 seconds for FIO<sub>2</sub> to 15 seconds for  $\dot{V}O_2$  and cardiac output. (MacFarlane and Cunningham, 1992; Pedersen et al., 1999; Thamrin and Murray-Smith, 2009).

172

#### 173 2.3. Modeling and sensitivity analysis

174 The equations describing the various models were translated in a MatLab® script and the ventilatory output was calculated as a function of time, using 1-second time steps. The pattern of ventilatory 175 output was analyzed in various conditions, by incrementing from a basal value the different 176 cardiorespiratory and structure parameters (O2 and CO2 gains, FIO2, delays, P50, TLC, rVAVE, 177 pcratio, contribCO<sub>2P</sub>, interac), one by one, in a maximal range of  $\pm$  50% around a nominal value or 178 within realistic physiological range. If an oscillatory pattern of ventilation was observed, the period 179 and amplitude of oscillations were computed. Then a sensitivity analysis was performed in order to 180 evaluate the respective influence of each parameter of the model on the period and amplitude of the 181 182 oscillatory pattern. Although it may not necessarily capture the general behavior in a multidimensional space, a single-parameter analysis allows us assessing the relative contribution of each parameter on 183 184 the ventilation output.

185

#### 186 *2.4. Multivariate regression analysis*

187 A multivariate regression was performed to establish potential correlations between period and 188 magnitude of ventilatory oscillations on one hand, and model parameters on the other hand:  $FIO_2$ , 189 peripheral chemoresponse to  $O_2$  (GO<sub>2</sub>), central chemoresponse to  $CO_2$  (GCO<sub>2</sub>), delays from lungs to 190 peripheral and central chemoreceptors (DeltaTp and DeltaTc, respectively), P50, TLC, rVAVE and 191 interaction parameters (pcratio, contribCO<sub>2P</sub>, interac).

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- 193

#### 194 2.5. Addition of white noise

Finally, in order to verify whether spontaneous variations in the ventilatory command would induce deeper instability in  $\dot{V}E$ , we added a white noise to  $\dot{V}Eb$ , the profile of which is following a normal distribution weighted by a 0.015 coefficient, in order to remain as close as possible to physiological data (Milton and Ohira, 2014). We then performed a paired Student t-test to check if there was a significant difference between the two simulations ("noise-enriched" and "no-noise enriched"). Values of period and amplitude of oscillations were also compared in the two conditions. Values of p<0.05 are considered significant.

202

# 203 **3. Results**

No significant ventilatory oscillations were found in resting conditions. The following results will
 concern only data obtained during exercise in hypoxia.

206

207 3.1. Sensitivity analysis

The variation of VE magnitude and period during exercise in hypoxia, due to physiological, environmental and interaction parameters, are presented in figures 4, 5 and 6.

210

211 *3.1.1. Period of ventilatory oscillations (Fig. 4)* 

Sensitivity analysis showed that the main factors influencing  $\dot{V}E$  period was the time delay between lungs and peripheral chemoreceptors (DeltaTp): in a range from 2 to 12 seconds, around a 4 s nominal value, period increased from – 40% to +123% around its corresponding nominal value. In a lesser extent, the level of hypoxia (FIO<sub>2</sub>) played a significant role: period steadily increased from – 3% at FIO<sub>2</sub>=0.115 to + 16% at FIO<sub>2</sub> = 0.21 (Fig. 7, top). The other parameters induced only minor changes in period, remaining in a [-5%; +5%] range.



**Figure 4.** Period of ventilatory oscillations according to several cardiorespiratory variables from their nominal values: peripheral  $O_2$  gain (GO<sub>2</sub>), central  $CO_2$  gain (GCO<sub>2C</sub>), inhaled fraction of  $O_2$  (FIO<sub>2</sub>), delay of blood convection from lung to carotid bodies (DeltaTp), arterial  $O_2$  partial pressure at  $S_aO_2 = 50\%$  (P50), total lung capacity (TLC) and alveolar / total ventilation ratio (rVAVE). Period is linearly related to DeltaTp and also depends on FIO<sub>2</sub>.

#### 219 *3.1.2. Magnitude of ventilatory oscillations (Fig. 5)*

Magnitude of ventilatory oscillations was nearly completely blunted, from 0% to -96.5%, when level 220 of hypoxia decreased from  $FIO_2=0.14$  to normoxia (Fig. 7). Peripheral and central gains to  $O_2$  (GO<sub>2</sub>) 221 and CO<sub>2</sub> (GCO<sub>2C</sub>) and increased oscillations from - 46% to +35%, and from -32% to +36%, 222 respectively. DeltaTp enhanced oscillations from - 95% to +59%. P50 and TLC had a dampening 223 224 effect on oscillations, by decreasing them from +45% to -54% and from +24% to -31%, respectively. 225 Finally, a decrease in rVAVE (i.e. an increase in dead space) from 1 to 0.7 increased oscillations from 226 -77% to +75%. The influence of DeltaTcc is mainly due to the tissue component DeltaTct (fig. 8): 227 magnitude of oscillations shows a phasic pattern that can lead to either enhanced or blunted oscillations, depending on the tissue component. 228



**Figure 5**. Magnitude of ventilatory oscillations according to several cardiorespiratory variables from their nominal values: peripheral O<sub>2</sub> gain (GO<sub>2</sub>), central CO<sub>2</sub> gain (GCO<sub>2C</sub>), inhaled fraction of O<sub>2</sub> (FIO<sub>2</sub>), delay of blood convection from lung to carotid bodies (DeltaTp), arterial O<sub>2</sub> partial pressure at  $S_aO_2 = 50\%$  (P50), total lung capacity (TLC) and alveolar / total ventilation ratio (rVAVE). Magnitude mainly increases with GCO<sub>2C</sub>, GO<sub>2</sub> (in a nearly linear manner) and DeltaTp, and decreases with P50, rVAVE, TLC and FIO<sub>2</sub>.



#### 230 3.1.3. Effect of interaction between $O_2$ and $CO_2$ at the central and peripheral level (fig. 6)

231 The effect of contrib $CO_{2P}$  (effect of  $CO_2$  on  $O_2$  gain in peripheral chemoreceptors) and interac (effect

of peripheral afferences on central gain to  $CO_2$ ) is very low on period values, in a tight range of 0 to

4.5% (results not shown). In contrast, a significant positive correlation links magnitude of VE

oscillations to contrib $CO_{2P}$  and interac, from 0 to 134%, and from 0 to 75%, respectively (fig. 6). The

parameter pcratio (ratio of peripheral/central response to CO<sub>2</sub>) does not impact period and magnitude

236 of ventilatory oscillations. The effect of interac and contribCO<sub>2P</sub> are additive.



**Figure 6.** Magnitude of ventilatory oscillations according to interaction parameters: interac (effect of peripheral  $O_2/CO_2$  gain on central gain to  $CO_2$ : *model 3*), peratio (effect of  $CO_2$  on peripheral gain: *model 1*) and contrib $CO_{2P}$  (effect of  $CO_2$  on peripheral gain to  $O_2$ : *model 2*). Contributions of peratio and contrib $CO_{2P}$  are computed at 2 values of interac (0 and 0.1) and show an additive effect of the rise from peripheral activity level.

- 237
- 238 *3.2. Multivariate regression analysis*
- 239 3.2.1. Period of ventilatory oscillations
- 240 The multivariate regression analysis significantly linked  $\dot{V}E$  period to FIO<sub>2</sub>, GO<sub>2C</sub>, DeltaTp, DeltaTc
- and TLC. A trend was observed for  $GO_2$  (p = 0.053).  $\dot{V}E$  period increased when FIO<sub>2</sub>,  $GCO_{2C}$ , DeltaTp
- and TLC increased (p<0.001, p<0.05 for GCO<sub>2C</sub>) whereas it was shortened when DeltaTc increased
- 243 (p<0.001, respectively).
- 244
- 245 *3.2.2. Magnitude of ventilatory oscillations*
- 246 Magnitude of oscillations was enhanced when GO<sub>2</sub>, GCO<sub>2C</sub> and DeltaTp increased (p<0.001) but
- 247 decreased when FIO<sub>2</sub>, DeltaTc, rVAVE, P50 and TLC increased (p<0.001).



**Figure 7**. Variation of  $\dot{V}E$  for two levels of FIO<sub>2</sub>: ventilatory oscillations in the additive model (upper panel) and physiological data from a subject exercising successively in normoxia and hypoxia (lower panel) (physiological data from Hermand et al., 2015b).

249 3.3. Effect of white-noise addition

The addition of a white noise did not alter magnitude or period of oscillations: there was no significant change between non-noise and noise-enriched models (Fig. 9). Varying the noise coefficient, from 0.001 to 0.5, did not modify the VE output behavior either.



**Figure 9.** Effects of added white noise to the central ventilation command, at two levels of  $FIO_2$ . There is no significant difference between "noise-enriched" (dashed lines) and "non-noise enriched" (solid lines) models.

#### **4. Discussion**

To our knowledge, this model is the first attempt to describe the phenomenon of ventilatory 255 256 oscillations observed in healthy subjects. Our observations underline the key role of  $\dot{Q}c$ , FIO<sub>2</sub>, GO<sub>2</sub> and  $GCO_{2C}$  in the genesis of such oscillations, their period and amplitude. First, resting conditions, 257 even in hypoxia, did not provoke ventilatory oscillations, whereas a double stimulus hypoxia / exercise 258 259 promoted the emergence of periodic breathing. Subjects with a higher ventilatory response to hypoxia 260  $(GO_2)$  or with a higher ventilatory response to  $CO_2$  ( $GCO_{2C}$ ) showed greater ventilatory oscillations during exercise performed in hypoxia. Moreover, a greater cardiac output Qc (lower DeltaTp) was 261 262 significantly correlated to a higher magnitude and a shorter period.

263 The main difference with existing models lies in the inclusion of exercise-oriented components 264 through a higher cardiac output and a consequent decreased circulation time from lungs to central and 265 peripheral chemoreceptors. The existing studies and models were mostly focused on central and 266 obstructive sleep apneas and heart failure during sleep, and described a phenomenon with a much longer period, associated with an enhanced sensitivity to CO<sub>2</sub> (Hall et al., 1996; Javaheri, 1999; Khoo, 267 268 2000). The present work confirms previous studies in healthy subjects in which greater ventilatory 269 oscillations were related to a higher cardiac output (mild exercise) and to hypoxia (Garde et al., 2012; 270 Hermand et al., 2015b; Latshang et al., 2013) (Fig. 7). It is remarkable to notice the proximity of the

period between theoretical and physiological data, around 11 seconds (Hermand et al., 2015a). FIO<sub>2</sub> level is also correlated to both period and magnitude of ventilatory oscillations, as observed in our previous studies (from  $FIO_2 = 0.165$ ).

274 The O<sub>2</sub> gain has an important impact on the amplitude of oscillations, as subjects with a higher 275 ventilatory response to hypoxia at exercise show a higher magnitude of oscillations, in coherence with 276 our experimental observations (Hermand et al., 2015b). In addition to this intrinsic sensibility to O<sub>2</sub>, 277 the  $O_2$ - $CO_2$  interaction at the peripheral level enhances the instability in a degree depending on model 278 used (fig. 6). The sensitivity analysis showed that a simple additive  $CO_2$  contribution, via the pcratio 279 coefficient (model 1), brings the least disturbance to ventilatory control system. Then, peripheral 280 afferences to central chemoreceptors (interac contribution, model 3) further augments oscillations. The most unstable situation is created by the peripheral interactive model, in which increased peripheral O<sub>2</sub> 281 gain by a hypercapnic stimulus (contrib $CO_{2P}$ , model 2) severely destabilizes the respiratory command. 282 283 Regardless of the studied model, these simulations highlight the major role played by the peripheral chemoreceptors in the genesis of ventilatory oscillations, with and without CO<sub>2</sub> interaction, and is in 284 accordance with the observations of CHF and SAS patients (Beecroft et al., 2006; Ponikowski et al., 285 2001; Trombetta et al., 2013). This data provide a new perspective in the current debate about the 286 respective contribution of central and peripheral chemoreceptors in the control of ventilation (Paula-287 288 Ribeiro and Rocha, 2016).

289

The central  $CO_2$  gain is also involved, in a lesser extent, into the genesis of periodic breathing and matches the clinical studies on CHF and SAS patients (Beecroft et al., 2006; Trombetta et al., 2013). This supports our own findings in which ventilatory response to  $CO_2$  is correlated to the magnitude of ventilatory oscillations in healthy subjects (Hermand et al., 2015b).

294 If both central and peripheral gains play a role in their appearance, they do not seem to play a major 295 role in the period of the phenomenon. The latter is strongly dependent on DeltaTp, illustrating the role 296 of cardiac output and circulation delay. As evidenced in figure 8, a phase shift between peripheral and 297 central responses to chemical stimuli can lead to either a reinforcement or a blunting of ventilatory oscillations. Depending on the value of this phase shift, our model predicts that the effects of hypoxia 298 299 and hyperventilation-induced hypocapnia can be either hyperadditive or hypoadditive, which could 300 account for the variability of experimental observations (Paula-Ribeiro and Rocha, 2016). This original 301 observation highlights the role of dynamics of central control processes in modulating the determinant 302 effect of peripheral chemoreceptors on ventilatory instability. For any given value of DeltaTct, the 303 period of oscillations remains around 11 seconds, reinforcing the essential role of peripheral 304 chemoreceptors in both magnitude and period (fig.8).

# Period and magnitude of ventilatory oscillations as a function of tissue delay in central chemoreceptors (DeltaTct)



**Figure 8.** Variation of period and magnitude of ventilatory oscillations as a function of tissue delay at the central level. The period is not affected by changes in DeltaTct. Magnitude can be almost completely blunted (DeltaTct = 5.5 and 15) or enhanced (DeltaTct = 10.5).

305

Apart those cited above, one additional parameter comes into play: a greater alveolar / total ventilation ratio decreases the amplitude of oscillatory ventilation, implying that a greater dead space will promote periodic breathing. In heart failure patients, augmented dead space will prevent ventilatory oscillations by an increased PETCO<sub>2</sub>, which acts on CO<sub>2</sub> apnea threshold and drastically decreased periodic breathing (Patz et al., 2013; Xie et al., 1997). Conversely, in normal subjects, the same increase in PETCO<sub>2</sub> will rise  $\dot{V}E$ , hence increasing ventilatory oscillations (Hermand et al., 2015a). This adverse effect is particularly noticeable here.

Finally, spontaneous variations in central ventilatory command did not influence the stability of the ventilation control system (fig. 8). Thus, this added chaotic component, very close to what is observed in real life, is not a determinant factor in the genesis of ventilatory oscillations.

316

#### 317 *A relation between period of ventilatory oscillations and DeltaTp: a limit value*

318 The significant correlation between period of oscillatory ventilations and DeltaTp (Fig. 4) is illustrated

319 by the equation of linear regression relating those two parameters:

320

 $\dot{V}E \ period = 1.798 \times DeltaTO_2 + 3.72$  (1) (r<sup>2</sup> = 0.9979, p<0.001)

In our previous work (Hermand et al., 2015a), we established a similar equation relating VE period to the total respiratory cycle (Ttot):

323

 $\dot{V}E \ period = 1.13 \times Ttot + 6.99$  (2) (r<sup>2</sup> = 0.55, p<0.001)

The tight relationship between VE period and Ttot points out a theoretical limit of VE oscillations 324 period: when Ttot tends toward zero (breathing frequency tending to infinity), VE oscillations period 325 tends to approximately 7 seconds (2). Using the latter value in equation (1), we can deduce a similar 326 theoretical lower limit DeltaTp<sub>min</sub>, when intensity of exercise increases along with  $\dot{V}O_2$  and  $\dot{Q}c$ , below 327 which the ventilatory oscillations disappear: DeltaTp<sub>min</sub>  $\approx 1.8$  seconds. As DeltaTp is the sum of 328 circulation delay from lungs to carotid bodies and of the time required for the neural system to produce 329 a ventilatory response, we can deduce that this irreducible time DeltaTp<sub>min</sub> of nearly 2 seconds is the 330 331 intrinsic response time of peripheral chemoreceptors, which is in accordance with the existing 332 literature (Black et al., 1971; McClean et al., 1988; Teppema et al., 1982).

333

# 334

# **5.** Conclusions and perspectives.

336 Our model reproducing the control of ventilation in specific metabolic and environmental conditions closely matches with the observed experimental data in various protocols and studies. Furthermore, it 337 demonstrates the crucial role of circulatory delays and gains of chemoreceptors in the homeodynamic 338 behavior of the respiratory control system when exposed to brisk changes in physiological or 339 340 environmental constraints. As pointed out in previous papers, the magnitude of transport delay and 341 control loop gain plays a major role in many physiological conditions, especially in periodic breathing 342 (Batzel and Kappel, 2011). The intrinsic neural reactivity of peripheral chemoreceptors to a change in gas pressures is also confirmed and quantified by a new and original approach through the analysis of 343 344 ventilatory oscillations. We also extrapolate from our model the existence of an intrinsic oscillatory pattern in the control system of ventilation in healthy humans. The interaction between  $O_2$  and  $CO_2$ 345 sensing either at central or peripheral level plays an important but not exclusive role in the genesis of 346 the ventilatory instability. Slight differences in the dynamics of the central vs. peripheral components 347 348 might be determinant for the stability of the whole system. Further improvements may be carried out 349 both in modeling and experimenting. On the one hand, the effect of an additional input, the inhaled 350 fraction of carbon dioxide on ventilatory oscillations (FICO<sub>2</sub>) may be added to the model. Indeed, contrary to what is observed in patients suffering from sleep apnea, a higher FICO<sub>2</sub> exacerbates 351 352 ventilatory oscillations (Hermand et al., 2015a). On the other hand, this model could be tested on other subjects at exercise, such as heart failure patients, in which cardiac function is impaired whereas 353 354 chemosensitivity to  $CO_2$  is increased.

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- 357 physiological processes.

			Exercise		
Variables	Units	Rest	Min	Nominal	Max
Alveolar $CO_2$ partial pressure ( $P_ACO_2$ )	mmHg				
Arterial O <sub>2</sub> partial pressure (P <sub>a</sub> CO <sub>2</sub> )	mmHg				
Arterial $O_2$ saturation ( $S_aO_2$ )	nu				
Minute ventilation (VE)	L.min <sup>-1</sup>				
Atmospheric pressure (PB)	mmHg	760		760	
Vapor pressure of water (PH <sub>2</sub> O)	mmHg	47		47	
Arterial O <sub>2</sub> saturation Set point (S <sub>a</sub> O <sub>2C</sub> )	%	98		98	
Arterial CO <sub>2</sub> partial pressure Set point (P <sub>a</sub> CO <sub>2C</sub> )	mmHg	40		40	
Alveolo-arterial O <sub>2</sub> difference (DAaO <sub>2</sub> )	mL/mL	5		5	
Alveolo-arterial CO <sub>2</sub> difference (DAaCO <sub>2</sub> )	mL/mL	1		1	
Cardiac output (Qc)	$L.s^{-1}$	6		10	
$O_2$ metabolic consumption ( $\dot{V}O_2$ )	mL.min <sup>-1</sup>	0.25		0.8	
Hill constant	nu	2.7		2.7	
Respiratory quotient (QR)	nu	0.7		0.8	
Ventilatory equivalent for oxygen (EVO <sub>2</sub> )	nu	30		26	
Arterial CO <sub>2</sub> partial pressure threshold	mmHg	40	35	45	55
Arterial $O_2$ partial pressure at $S_aO_2 = 50\%$ (P50)	mmHg	27	25	28	31
Inhaled fraction of oxygen (FIO <sub>2</sub> )	nu	0.14	0.11	0.14	0.21
Central chemoreflex CO <sub>2</sub> gain (GCO <sub>2C</sub> )	L.min <sup>-1</sup> .mmHg <sup>-1</sup>	0.05	0.025	0.05	0.075
Peripheral chemoreflex O <sub>2</sub> gain (GO <sub>2</sub> )	L.min <sup>-1</sup> .% <sup>-1</sup>	10	10	15	20
Total lung capacity (TLC)	L	9	4	9	14
Circulatory delay from lung to carotid bodies (DeltaTp)	S	8	2	4	12
Circulatory delay from lung to brain (DeltaTc)	S	10	3	6	13
Alveolar / total ventilation ratio (rVAVE)	nu	0.7	0.7	0.85	1
Coefficient of diffusion limitation of O <sub>2</sub> (DlimO <sub>2</sub> )	mmHg.L <sup>-1</sup> . min	0	0	5	10
Ratio of peripheral/central gain to CO <sub>2</sub> (pcratio)	nu	0.5	0.25	0.5	0.75
Coefficient of $CO_2$ contribution to peripheral gain (contrib $CO_{2P}$ )	nu	0	0	0	0.2
Coefficient of peripheral afferences contributing to central gain to $CO_2$ (interac)	nu	0	0	0	0.2
Central tissue delay (DeltaTct)	S	1	0	1	21

**Table 1**. Nominal values for the variables used in model simulations. In the sensitivity analysis, parameters were assigned values ranging from a minimal (Min) to a maximal (Max).

- 361 Appendix
- **Basal cardiorespiratory parameters:** VEb, VO<sub>2</sub>, EVO<sub>2</sub>, Qc, rVAVE, QR.
- 363  $O_2$  consumption  $\dot{V}O_2$ , cardiac output  $\dot{Q}c$ , alveolar/total ventilation ratio rVAVE, respiratory quotient
- 364 QR and ventilatory equivalent for oxygen EVO<sub>2</sub> are set at known physiological values for rest/exercise
- and normoxia/hypoxia, as indicated in table 1.
- 366 The basal value of  $\dot{V}E$  for all phases is calculated as follows:

$$\dot{V}Eb(t) = EVO_2(t).VO_2(t)$$

368 The arterial  $O_2$  pressure  $P_aO_2$  and arterial  $O_2$  saturation follow the equation:

$$S_a O_2 = \frac{(\frac{P_a O_2}{P50})^{NH}}{1 + (\frac{P_a O_2}{P50})^{NH}}$$

where P50 is the arterial O<sub>2</sub> partial pressure at  $S_aO_2 = 50\%$ , and NH is the Hill constant.

370

371 The alveolar-arterial difference in  $O_2$  (DAa $O_2$ ) is determined as:

$$DAaO_2(t) = DAaO_20 + DlimO_2.(\dot{Q}c(t) - \dot{Q}c_{rep})$$

- 372 where  $DAaO_2O$  is the alveolar-arterial difference in  $O_2$  at rest,  $DlimO_2$  a known coefficient of
- diffusion, and  $\dot{Q}c_{rep}$  the cardiac output at rest.
- 374

# 375 **Peripheral chemoreceptors**

- This linear expression involves the peripheral gain to  $O_2$  (GO<sub>2</sub>) and to CO<sub>2</sub> (GCO<sub>2P</sub>) and a pure delay
- 377 DeltaTp from lung to peripheral chemoreceptors (blood convection).
- 378 The peripheral gain to  $CO_2$ , above a peripheral threshold  $P_aCO_{2Pth}$  is defined as:
- if  $P_aCO_2(t) > P_aCO_{2Pth}$ , then the peripheral contribution from a CO<sub>2</sub> stimulus is the linear term
- 380  $GCO_{2P}$ .  $[P_aCO_2(t DeltaTp) P_aCO_{2C}]$  with  $P_aCO_{2C}$  as a  $P_aCO_2$  set point,
- 381 else it is null.
- 382 In the additive and central interactive models, the peripheral contribution is:

383 
$$VEp(t) = GO_{2P}(t) [S_aO_{2C} - S_aO_2(t - DeltaTp)] + GCO_{2P}(t) [P_aCO_2(t - DeltaTp) - P_aCO_{2C}]$$

- 384 with  $S_aCO_{2C}$  as a  $S_aCO_2$  set point.
- 385 In the interactive model, the peripheral contribution is:

$$\dot{V}Ep(t) = GO_{2P}(t) \cdot [1 + contribCO_{2P} \cdot (P_aCO_2(t - DeltaTp) - P_aCO_{2C})] \cdot [S_aO_{2C} - S_aO_2(t - DeltaTp)]$$

386

#### 388 Central chemoreceptors

389 The central component of ventilation, resulting from a variation of arterial  $CO_2$  content, includes a

- static central gain to  $CO_2$  (GCO<sub>2C</sub>) and a delay DeltaTc (see section 2.1.4), above a central threshold (P<sub>a</sub>CO<sub>2Cth</sub>):
- 392 if  $P_aCO_2(t) > P_aCO_{2Cth}$ , then  $\dot{V}Ec(t) = GCO_{2C} \cdot [P_aCO_2(t DeltaTc) P_aCO_{2C}]$
- 393 else  $\dot{V}Ec(t) = 0$ .
- In the central interactive model, the central gain to  $CO_2$  (GCO<sub>2C</sub>) depends on peripheral gains to  $O_2$
- and  $CO_2$  (GO<sub>2</sub> and GCO<sub>2P</sub>, respectively), modulated by a constant interac:

$$GCO_{2C}(t) = GCO_{2C} \{1 + interac. [GO_{2}(t). [S_{a}O_{2C} - S_{a}O_{2}(t - DeltaTp)] + GCO_{2P}(t). [P_{a}CO_{2}(t - DeltaTp) - P_{a}CO_{2C}] \}$$

and  $\dot{V}Ec(t) = GCO_{2c}(t) \cdot \left[P_aCO_2(t - DeltaTc) - P_aCO_{2c}\right]$ 

397

# 398 Equations of alveolar and arterial gas pressures: steady state and first order

399 At equilibrium, the alveolar partial pressures in  $O_2$  and  $CO_2$  as a function of time are defined as:

400 
$$P_A O_2(t) = -DAaO_2(t) + (P_B - P_{H_2O}) \cdot FIO_2(t) - P_A CO_2(t)$$

401 
$$P_A CO_2(t) = \frac{QR(t).\dot{V}O_2(t)}{K.\dot{V}E(t).rVAVE(t)}$$

- 402 where  $P_B$  and  $P_{H_{20}}$  are atmospheric and water vapor pressures, respectively, FIO<sub>2</sub> is the inhaled fraction
- 403 of O<sub>2</sub>. P<sub>B</sub>, P<sub>H20</sub>, FIO<sub>2</sub>, QR,  $\dot{V}O_2$  and rVAVE are predetermined as shown in table 1.

404  $P_ACO_2$  is then described through a first-order relation:

$$\frac{dP_ACO_2}{dt} + P_ACO_2(t) = P_ACO_2(t).apCO_2 + bpCO_2.P_APCO_2(t)$$

where apCO<sub>2</sub> and bpCO<sub>2</sub> are defined as follows:  $TaupCO_2 = \frac{TLC}{\dot{v}E(t)}$ ,  $apCO_2 = e^{-\frac{1}{TaupCO_2}}$  and  $bpCO_2 = 1 - apCO_2$ ,  $P_APCO_2$  is the  $P_ACO_2$  variable determined by initial conditions of  $\dot{V}O_2(t)$  and  $\dot{V}E(t)$ .

- 408
- 409
- 410

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