

Assessment of airway response distribution and paradoxical airway  
dilation in mice during methacholine challenge

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**RUNNING HEAD**

Distribution of airway response to methacholine in mice

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## ABSTRACT

Detailed information on the distribution of airway diameters during bronchoconstriction *in situ* is required in order to understand the regional response of the lungs. Imaging studies using computed tomography (CT) have previously measured airway diameters and changes in response to bronchoconstricting agents, but the manual measurements used have severely limited the number of airways measured per subject. Hence, the detailed distribution and heterogeneity of airway responses is unknown. We have developed and applied dynamic imaging and advanced image-processing methods to quantify and compare hundreds of airways *in vivo*. The method, based on CT, was applied to house-dust-mite sensitized and control mice during intravenous methacholine infusion. Airway diameters were measured pre- and post-methacholine challenge, and the results compared to demonstrate the distribution of airway response throughout the lungs during mechanical ventilation. Forced oscillation testing was used to measure the global response in lung mechanics. We found marked heterogeneity in the response, with paradoxical dilation of airways present at all airway sizes. The probability of paradoxical dilation decreased with decreasing baseline airway diameter and was not affected by pre-existing inflammation. The results confirm the importance of considering the lung as an entire interconnected system, rather than a collection of independent units. It is hoped that the response distribution measurements can help to elucidate the mechanisms that lead to heterogeneous airway response *in vivo*.

## NEW & NOTEWORTHY

Information on the distribution of airway diameters during bronchoconstriction *in situ* is critical for understanding the regional response of the lungs. We have developed an imaging method to quantify and compare the size of hundreds of airways *in vivo* during bronchoconstriction in mice. The results demonstrate large heterogeneity, with both constriction and paradoxical dilation of

48    airways, confirming the importance of considering the lung as an interconnected system, rather  
49    than a collection of independent units.

50

51    **KEYWORDS**

52    airways; methacholine; tomography; synchrotron imaging; mice

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54

55 **INTRODUCTION**

56 The response of airways to broncho-constricting agents is a complex process that is not well  
57 understood. An individual airway's response is determined by a variety of factors, including  
58 mechanical forces, intrinsic airway smooth muscle properties, airway smooth muscle tone and  
59 the local inflammatory milieu. Modelling has demonstrated effects from the interdependence of  
60 airways (29), agonist-response interactions (1) and integrated tissue mechanics (22) that lead to  
61 heterogeneous airway response within the airway tree. Although *in vitro* studies have allowed us  
62 to understand the fundamental mechanisms of the response of isolated airways (5, 6, 20), *in vivo*  
63 studies are necessary to understand the dynamic response of the entire airway tree, which can  
64 exhibit complicated emergent behavior.

65

66 Imaging methods, in particular computed tomography, have been used to study airway response  
67 to airway constrictors in humans (17) and various animal models (3, 4, 27). These studies have  
68 confirmed heterogeneous response of the airways *in situ*, and identified paradoxical dilation of  
69 some airways in a number of species, and in response to a range of broncho-constricting  
70 interventions (3, 4, 17, 27). However, the manual processing methods used to measure the airway  
71 size in these studies were limited to measurements of between 6 segments (3) and 26 segments  
72 (17) per subject. This limited sample may not provide detailed information of the distribution of  
73 airway responses within the whole lung and no studies have identified the distribution of  
74 response across the entire lung. This detailed information is required in order to better understand  
75 the dynamic response of the airway tree to broncho-constriction and the as yet unidentified  
76 mechanisms involved in paradoxical dilation of the airways. Here we present a method based on  
77 synchrotron phase-contrast CT that allows hundreds of airways to be digitally segmented,  
78 measured and compared within the mouse lung. This allows us to effectively quantify the  
79 distribution of airway responses within the lung during breathing.

80

81 The aim of this study was to quantify regional constriction in the airways across the lung in  
82 response to bronchoconstriction with and without prior airway inflammation. In order to achieve  
83 this we measured the distribution of responses of the airways in house-dust-mite (HDM)  
84 sensitized and control (CTL) mice in response to two doses of intravenously (IV) infused  
85 methacholine (MCh). The MCh doses were chosen to produce a modest global response to assess  
86 the inherent airway response without introducing physiological complications or distress, and  
87 additionally to increase the likelihood of producing paradoxical dilation. We also assessed lung  
88 mechanics using the forced oscillation technique to determine the global effect of heterogeneous  
89 regional bronchoconstriction. By assessing the distribution of airway responses to an IV infused  
90 bronchoconstricting agent we avoid differential responses caused by variable exposure of the  
91 agonist to the airway smooth muscle when delivered via the airway lumen. By assessing the  
92 response in the presence and absence of prior exposure to the allergen (HDM), we were also able  
93 to investigate the effect of prior inflammation on the distribution of airway responses.

94

## 95 **MATERIALS AND METHODS**

### 96 *Animal Procedure*

97 All animal procedures were approved by the SPring-8 Animal Care Committee and Monash  
98 University's School of Biomedical Science's Animal Ethics Committee. All studies were  
99 conducted in experimental hutch 3 of beamline 20B2 in the Biomedical Imaging Centre at the  
100 SPring-8 synchrotron in Japan.

101

102 Adult male Balb/C mice were lightly sedated with methoxyflurane and intra-nasally exposed to  
103 25 µg of house dust mite (HDM; n=5) extract (Greer Laboratories, USA) in 50 µL of saline, or  
104 saline alone (control; CTL; n=5). Mice were treated daily for 10 days and studied 24 hours after  
105 the last exposure.

106

107 Each animal was anaesthetised using sodium pentobarbitone (i.p.; 70mg/kg), tracheostomised,  
108 connected to a ventilator and a tail vein catheter inserted for methacholine infusion. Anaesthesia  
109 was maintained throughout the experiment with top-up of sodium pentobarbitone every 30  
110 minutes (i.p.; 30mg/kg). Positive pressure ventilation was delivered through a custom designed  
111 ventilator (based on that described in Kitchen *et al.* (16)) with 120 ms inspiration time, 280 ms  
112 expiration time, 10 cmH<sub>2</sub>O inflation pressure and 2 cmH<sub>2</sub>O positive end expiratory pressure  
113 (PEEP), consistent with the recommendations of Glaab *et al.*(11). PEEP is required to maintain  
114 functional residual capacity, as active inspiratory muscle tone is reduced in anesthetized mice  
115 (11). Animals were sequentially imaged at baseline and during two doses of continuous  
116 methacholine infusion: 16 µg/kg/min (MCh1), and subsequently 48 µg/kg/min (MCh2) (Figure  
117 1). Each mouse was ventilated for at least 5 minutes prior to baseline measurements to allow it to  
118 stabilize after anaesthetization and surgery. At least 5 minutes was allowed after instigation of the  
119 MCh1 and MCh2 infusions prior to lung function and imaging to allow the response to stabilize.

120

### 121 *Forced oscillation technique*

122 Lung mechanics were measured using a modification of the forced oscillation technique as  
123 described previously (12). Briefly, an oscillatory pressure signal containing 9 frequencies ranging  
124 from 4-38 Hz was generated by a loudspeaker and delivered to the tracheal cannula by a  
125 wavetube of known impedance during 6 s pauses in ventilation. Lateral pressure transducers at  
126 the start of the wavetube and at the airway opening were used to calculate the respiratory system  
127 impedance spectrum ( $Z_{RS}$ ) (12). A four-parameter model with constant-phase tissue impedance  
128 was fitted to the  $Z_{RS}$  spectrum to extract values for global airway resistance ( $R_{aw}$ ), tissue  
129 damping (G) and tissue elastance (H) and inertance ( $I_{aw}$ ; which is  $\sim 0$  after accounting for the  
130 tracheal cannula and not reported)(13).

131

## 132 *Imaging*

133 Imaging was conducted using a modification of the dynamic computed tomography method  
134 described in Dubskey et al. (7). Briefly, phase-contrast images were acquired at the SPring-8  
135 synchrotron, Japan, at the BL20B2 beam-line. Images were acquired at 50 fps using a PCO.edge  
136 sCMOS detector (PCO AG, Germany), optically coupled with a scintillator crystal. During  
137 imaging, the animal was placed upright in a custom-built holder, which was mounted on a 5-axis  
138 motor controller to provide stable rotation during the 3 minute scan. The ventilator provided  
139 stable, pressure-controlled ventilation, and provided triggering to the imaging system for  
140 synchronization with the ventilation cycle. Single-image phase retrieval (21) and simultaneous  
141 algebraic reconstruction technique (2) was used for CT reconstruction. Imaging parameters  
142 resulted in high-resolution CT with an isotropic voxel size of 15  $\mu\text{m}$ . Airway size was measured  
143 at end expiration at a ventilator pressure of 2  $\text{cmH}_2\text{O}$ .

## 145 *Airway size estimation and comparison*

146 Airway segmentation and size calculation was performed using a novel image processing  
147 methodology, based on the vesselness filter described by Frangi et al. (9). This Hessian-based  
148 filter uses analysis of the eigenvalues of the image intensity Hessian-matrix at different spatial  
149 scales ( $\sigma$ ) in order to assign a probability value to each voxel. This value describes the  
150 probability of a cylinder (in our case an airway) being present at each voxel. The spatial scale  
151 that yields the maximum vessel probability at any point may be used to estimate the vessel  
152 diameter (9, 24, 25). Values for  $\sigma$  corresponded to a diameter range of around 85 $\mu\text{m}$  to 950 $\mu\text{m}$ .  
153 The conversion from scale-space (ie.  $\sigma$ ) to diameter was calibrated using synthetically generated  
154 images of cylinders of various lengths, as in Samarage *et al.* (25). These synthetically generated  
155 images were also used to estimate RMS error in the diameter measurement in this range, which  
156 was shown to be 1.8 px. This is consistent with previous studies utilizing scale-space diameter

measurements, which achieved an accuracy of <5% for diameters greater than around 5 px (8), as measured in the present study.

The 4DCT images were processed using the vesselness filter to yield a vessel probability field. This was segmented using a flood-fill, providing a binary image of the airway tree. Auto-skeletonisation (Avizo, FEI software, USA) was then used to find the centerline of the airways. The scale of the vesselness filter that yielded the highest vessel probability at each centerline point of the airway tree was used as an estimate of the diameter of the airway at that point (Figure 2). These estimates were averaged across each airway segment to yield the average diameter of each airway segment. This method provides robust, unsupervised diameter estimation across the entire airway tree, allowing for hundreds of airways down to a diameter of around 85  $\mu\text{m}$  to be measured and compared for each animal (Figure 3).

Airway segmentation methods are imperfect, leading to both missed and false airway segments (28). In order to automatically compare the diameters of airway segments between states, a simple multi-criteria airway matching was implemented. First, airway trees were co-registered to the baseline airway tree using a set of manually defined landmark points. Each point in the airway segment was then matched to the closest airway in the baseline tree. A segment match was accepted if two criteria were met: over 60% of points were consistently matched to an individual baseline airway, and its length was within 20% of that baseline airway. This prevented erroneous matching due to registration errors and/or missing airway segments.

## RESULTS

### *Lung mechanics*

HDM exposed mice exhibited a higher  $R_{\text{aw}}$  for all three conditions (baseline, MCh1 and MCh2: Figure 4A;  $P = 0.048$ ) when compared to the CTL group. Both the HDM and CTL groups



showed a paradoxical decrease in  $R_{aw}$  (representing the resistance of the conducting airways) for MCh1 challenge (Figure 4A;  $P < 0.001$ ), and an increase in  $R_{aw}$  for the MCh2 challenge compared to baseline (Figure 4A;  $P = 0.040$ ). No significant changes in  $G$  were observed between the HDM and CTL groups, or for MCh1 (Figure 4B;  $P = 0.43$  and  $P = 0.308$  respectively). In contrast,  $G$  was significantly increased in response to MCh2 when compared to baseline and MCh1 (Figure 4B;  $P = 0.029$  and  $P = 0.006$  respectively).

There was no change in  $H$  in response to HDM compared to CTL mice ( $P = 0.43$ ), nor were there any changes in  $H$  in response to MCh1 or MCh2 challenges when compared to baseline (Figure 4C;  $P = 0.499$ ).

#### *CT imaging*

Imaging provided CT reconstructions of sufficient quality and resolution to clearly discern airways from surrounding tissue (Figure 5), of a size down to approximately  $85\ \mu\text{m}$ .

#### *Airway responses*

Scatter plots revealed the distribution of normalized airway response (airway diameter/baseline diameter) with respect to baseline diameter (Figure 6A-D). Friedman's super smoother regression (10) was used to qualitatively assess the distribution of airway responses (Figure 6A-D). The lower limit on measurable size ( $85\ \mu\text{m}$ ) resulted in apparent truncation of the data below a baseline diameter size of  $\sim 175\ \mu\text{m}$ . This resulted in a bias in the regression towards a dilation response for baseline diameters below  $175\ \mu\text{m}$ . For this reason, the fitting was extrapolated in this range using a polynomial fit of order 2 using data from a baseline diameter range of  $175\ \mu\text{m}$  to  $300\ \mu\text{m}$ . All cases showed a large heterogeneity in response, with both dilating and constricting airways present. The distributions for CTL and HDM groups were similar (Figure 6). All distributions showed an increased prevalence of paradoxical dilation for larger airways,

with increasing constriction for smaller airways. The mid-sized airways (~300  $\mu$ m to 500  $\mu$ m) showed the largest paradoxical dilation in response to MCh1.

In both HDM and CTL groups, for MCh1, the average diameter of airways, expressed as a percentage of baseline diameter, was greater than 100% (109% and 106% respectively) indicating that, on average, the measured airways dilated in response to MCh. For MCh2, the average response was less than 100% from HDM and CTL groups (98% and 95%), indicating constriction. These results mirror the decreased  $R_{aw}$  for MCh1 and increased  $R_{aw}$  for MCh2.

The percentage of airways that dilated or constricted in specific size ranges allowed comparison of response distributions in response to MCh1 and MCh2 (Figure 6E-F). Generally, the number of dilating airways was highest in the range ~200 to 500  $\mu$ m for MCh1, and generally increased with increasing baseline airway diameter for MCh2. The largest difference in dose response occurred in the mid-sized airways (~200 to 500  $\mu$ m), which showed high percentages of dilating airways for MCh1, and only a moderate percentage of dilating airways for MCh2 in both HDM and CTL groups. HDM group showed a greater prevalence of paradoxical dilation (42.1% and 68.2% for MCh1 and MCh2) than CTL group (35.7% and 62.8%).

The response of individual airways under MCh1 and MCh2 challenges for both CTL and HDM groups showed moderate correlation (Pearson coefficient,  $R = 0.57$  and  $R = 0.56$  respectively) (Figure 7), indicating a persistent pattern of response for MCh1 and MCh2 in both CTL and HDM groups.

## DISCUSSION

The results presented in this study demonstrate paradoxical dilation of airways in response to IV methacholine in mice under positive pressure mechanical ventilation. Paradoxical dilation

preferentially occurred in the larger airways, although was present across all sizes of airways measured in this study (airway diameters > 85  $\mu$ m). No significant difference in response distribution was seen between the HDM and CTL groups. However, the baseline resistance, measured by FOT, was significantly increased in the HDM group. Interestingly, a global paradoxical decrease in airway resistance was also measured by the forced oscillation technique during the MCh1 infusion in both HDM and CTL groups.

The presence of paradoxical dilation under bronchoconstriction has been previously identified in a number of studies. Brown et al. (4) used HRCT to measure airway response in canines exposed to inhaled histamine. A semi-automated procedure was used that enabled measurement of approximately 10 airways in each subject. Results showed a marked heterogeneity in airway responses, including paradoxical dilation in one subject. Kotaru et al. (17) compared the response of airways in humans using HRCT under two different challenges: isocapnic hyperventilation of frigid air (HV) and inhaled MCh. Computer assisted manual measurement of airway size was conducted from the trachea to the segmental bronchii (26 airways per subject). Imaging was conducted during a breath-hold at TLC. All subjects showed a reduction in FEV<sub>1</sub> after both challenges. The results demonstrated a large amount of heterogeneity, with both dilation and constriction present. In fact, only 47% of the airways measured constricted after MCh challenge. The frequency of dilation decreased with each generation, consistent with results from the present study. Bayat et al. (3) measured the response of airways in rabbits subjected to inhaled histamine challenge under two doses using high-resolution synchrotron CT. The size of the main bronchi was measured in three axial planes between the apex and base of the lung, resulting in 6 measurements per subject. Results showed clear paradoxical airway dilation, with the extent of dilation generally increasing with the larger airways. No clear difference in response was apparent between the two doses used.

In our study, the forced oscillation technique demonstrated significant changes in resistance, but no change in tissue elastance. Alterations in tissue elastance result from either a change in tissue stiffness or may also be indicative of airway closure (15). This result indicates that all responses measured in this study were due to airway constriction and are unlikely to be a result of loss of lung units due to airway closure. It is possible that the upright position of the mice and the use of mechanical ventilation with PEEP of 2 cmH<sub>2</sub>O prevented airway closure during the experiments. In fact, the application of PEEP has been shown to reduce ventilation heterogeneity and improve alveolar ventilation during bronchoconstriction in both imaging (23) and modeling (29) studies, thus mitigating airway closure. The upright position will effect the longitudinal forces on the airways, which may alter airway-tissue interdependence when compared to the supine position. This may have an impact on regional constriction, possibly contributing to the unexpected decrease in  $R_{aw}$  apparent during MCh1. Position has been shown to have a significant effect on the regional response to MCh in humans (14).

The airway distributions measured in the present study are consistent with the findings of Kotaru et al. (17) and Bayat *et al.* (3), demonstrating that the likelihood of paradoxical dilation decreases from the larger airways to the smaller airways. This is in contrast to the findings of Brown et al. (4) who showed no clear relationship between airway size and measured response; however, the small number of airways measured in that study may have limited the ability to detect such a relationship given the large heterogeneities present.

We have identified dose dependence for paradoxical dilation, whereby the percentage of measured airways that dilate decreases with increasing MCh dose, in particular in the mid-sized and larger airways. The contribution to total resistance decreases with each generation as the number of airways, and hence the total cross-sectional area, increases rapidly with branching. Paradoxical dilation in the larger airways may therefore reduce  $R_{aw}$  even in the presence of

constriction in smaller airways. This appears to be the case for MCh1, where this paradoxical dilation of the larger airways is most apparent. The results presented by Bayat *et al.* (3) do not show a clear difference between the response to differing agonist dose. This may be due to the doses used, or the limited number of airways measured (6 airway segments per subject). In any case, the correlation between responses from individual airways during the MCh1 and MCh2 challenges in our study indicate that a consistent factor drives individual airways to show a certain relative response. This is consistent with previous studies that have shown persistent locations for ventilation deficits in bronchoconstriction (18). Modeling has suggested that the spatial persistence in response to bronchoconstriction may be due to airway tree asymmetry (19), which is particularly strong in the mouse lung.

The mechanisms that cause paradoxical dilation remain to be elucidated. The results in the literature with regards to paradoxical dilation are consistent across a number of animal species, and challenges. The distribution of airway smooth muscle orientation within the airway tree is conserved across species and the abundance of airway smooth muscle is increased in smaller distal airways (26). Therefore, airway smooth muscle distribution may be a possible contributing factor in the airway response distributions shown in our study. Most previous studies used inhaled broncho-constricting agent (3, 4, 17), which may lead to non-uniform delivery and which may potentially contribute to the heterogeneous response. The present study utilized an IV delivery route, which is thought to deliver equal concentrations of MCh to the airway smooth muscle through the bronchial circulation (27). Route of delivery has been previously shown to affect the pattern of airway response to methacholine in rabbits (27). However, the distributions measured in the present study are consistent with studies utilizing inhaled delivery, demonstrating that the heterogeneities due to uneven deposition of aerosols are unlikely to be a strong contributing factor for the overall response distribution.

The distribution of response was consistently related to baseline airway size. This may imply a geometric factor that contributes to paradoxical dilation. Interdependence effects have been shown to create paradoxical dilation in simplified computer models of airway constriction (29), and this may be a possible contributor to the paradoxical dilation shown in this study. The preferential dilation of larger airways would be consistent with a serial interdependence hypothesis. However, as the measurements in this study were acquired at end expiration at a fixed expiratory pressure, dynamic internal pressure variations due to serial interdependence may not fully explain the results, and so some other factor, presumably physiological, may be present to cause persistent dilation of the airways. It is possible that a combination of airway geometry factors, such as serial interdependence, combined with distribution of airway mechanical properties and airway structural components (eg: airway smooth muscle, receptors, cartilage) cause paradoxical dilation to emerge during broncho-constriction. Given the consistency in the observations between the HDM exposed and CTL mice it seems that prior inflammation has little impact on the heterogeneity of airway responses to bronchoconstricting agents. Further experiments to isolate the contribution of these factors to the distribution of airway constriction are warranted. It is hoped that the methods developed and response distributions measured in this study will contribute to these investigations.

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339

340 **DISCLOSURES**

341 AF, SD, RS, and YH hold beneficial interests in 4Dx Limited, which is commercializing

342 respiratory diagnostics technology.

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**Figure 1. Study protocol.** Mice were imaged at baseline, and during 16  $\mu\text{g/kg/min}$  (MCh1) and 48  $\mu\text{g/kg/min}$  (MCh2) methacholine infusion. The forced oscillation technique was used to assess global lung mechanics immediately prior to each imaging scan.

**Figure 2: Airway segmentation and centerline extraction process.** The multi-scale vesselness filter yields both the scale field and vesselness field. The airway tree was segmented from the vesselness field and the centerline tree was extracted. The scale field was then interrogated at each point in the centerline tree to estimate the diameter of the airway at that point. This process results in a segmented airway tree with robust diameter estimation for all airways (as shown in Figure 3).

**Figure 3. Graphical representation of airway diameter measurement result.** The airway tree is defined by a set of connected segments, each with a diameter and set of centerline points.

**Figure 4. Global lung mechanics measured using forced oscillation technique.** Columns show average and error bars indicate range. Results show paradoxical decrease in airway resistance for MCh1 ( $P < 0.001$ ), and increase for MCh2 ( $P = 0.04$ ). Resistance was higher at baseline in the HDM exposed mice ( $P = 0.048$ ).  $*P < 0.05$ ,  $**P < 0.01$ ,  $***P < 0.001$ .

**Figure 5. Single CT slice (A) and zoomed images of individual airways at end expiration for a large (B-D) and small airway (E-G) for baseline (B, E), MCh1 (C, F), and MCh2 (D, G).** White arrows in (A) indicate the two airways chosen for zoomed images (B – G). For the large airway, an increase in diameter is apparent for both the MCh1 and MCh2 challenge when compared to baseline, whereas the small airway shows progressive reduction in airway diameter under methacholine challenge. Scale bar shown in (A) is 2 mm, and (B-G) is 250  $\mu\text{m}$  (shown on (G) only).

**Figure 6. Distribution of airway diameter in response to methacholine challenge.** Airway diameter distributions in response to MCh1 and MCh2 (A-D) and percentage of measured airways exhibiting dilation for specific size ranges (E-F). The Friedman's super smoother regression is shown by the solid lines, dotted line shows extrapolation to account for truncation bias. The grey area shows region in which airways are below measurable size. A clear

454 proximal to distal distribution existed in all cases, with the larger airways showing paradoxical dilation in response  
455 to methacholine challenge. Similar distributions were seen in both HDM exposed and control mice.

456

457 **Figure 7. Correlation of MCh1 and MCh2 airway response.** Scatter plot of normalised airway diameter for  
458 individual airways under MCh1 vs. MCh2 methacholine challenge.

459

Methacholine Infusion



Forced Oscillation Test

①

②

③

Imaging

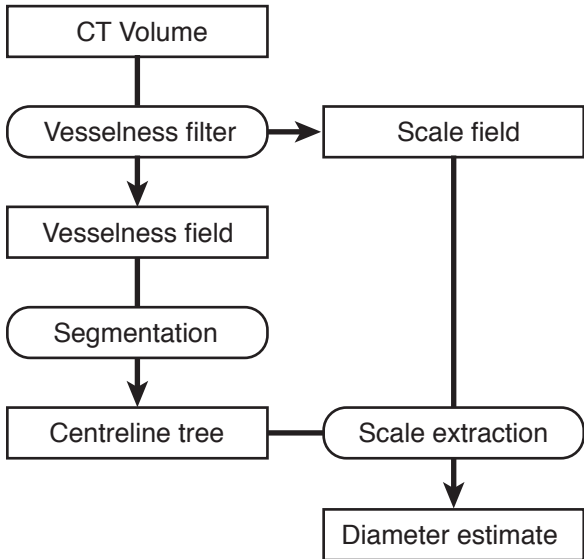
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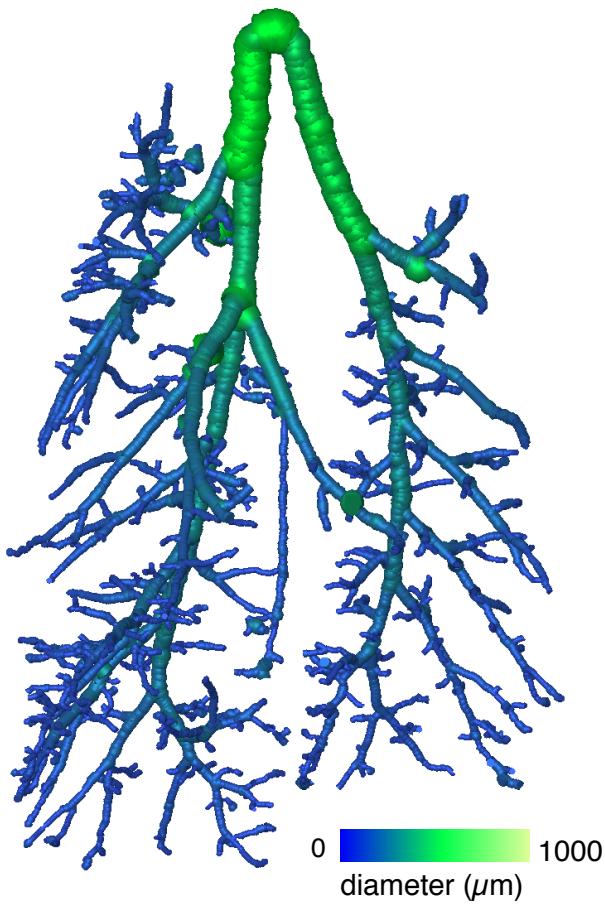
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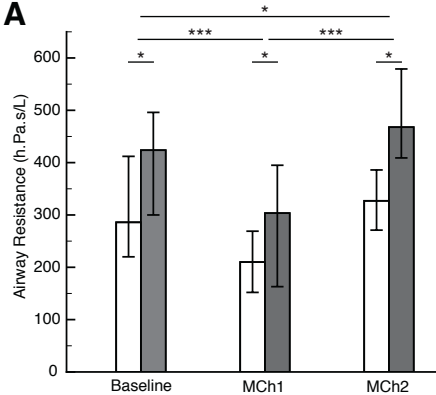
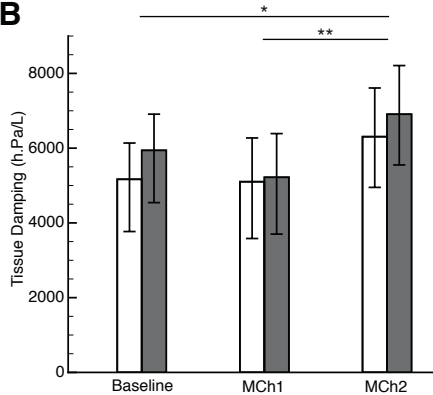
Time (min)









**A****B****C**