Dynamic vibration mode decomposition of auto-oscillating vocal fold replicas without and with vertical tilting

Annemie van Hirtum, Anne Bouvet, Isao Tokuda, Xavier Pelorson

► To cite this version:

Annemie van Hirtum, Anne Bouvet, Isao Tokuda, Xavier Pelorson. Dynamic vibration mode decomposition of auto-oscillating vocal fold replicas without and with vertical tilting. *Journal of Sound and Vibration*, 2022, 516, 10.1016/j.jsv.2021.116504 . hal-03363196

HAL Id: hal-03363196

<https://hal.science/hal-03363196>

Submitted on 3 Oct 2021

HAL is a multi-disciplinary open access archive for the deposit and dissemination of scientific research documents, whether they are published or not. The documents may come from teaching and research institutions in France or abroad, or from public or private research centers.

L'archive ouverte pluridisciplinaire **HAL**, est destinée au dépôt et à la diffusion de documents scientifiques de niveau recherche, publiés ou non, émanant des établissements d'enseignement et de recherche français ou étrangers, des laboratoires publics ou privés.

Dynamic vibration mode decomposition of auto-oscillating vocal fold replicas without and with vertical tilting

Annemie Van Hirtum¹, Anne Bouvet

LEGI, UMR CNRS 5519, Grenoble Alpes University, France

Isao Tokuda

Dep. Mech. Eng., Ritsumeikan Univ., Nojihigashi, Kusatsu, Shiga 525-8577, Japan

Xavier Pelorson

LEGI, UMR CNRS 5519, Grenoble Alpes University, France

Abstract

Vertical left-right level difference due to angular asymmetry characterises unilateral vocal fold paralysis. High-speed image sequences of three distinct auto-oscillating silicone vocal folds replicas are analysed simultaneously in both space and time with a dynamic vibration mode decomposition while imposing different degrees of angular asymmetry. From the modes eigenvalue spectra, it is found for all three replicas that the degree of angular asymmetry affects the decay of vibration modes. More in particular, for the assessed VF replicas, increased mode decay is observed when the replica contains a stiff epithelium-like surface layer whereas it decreases otherwise. Spatial mode patterns near the glottal aperture reflect the mode order along the posterior-anterior direction and the imposed angular asymmetry reduces the spatial mode extent near the tilted VF edge. Consequently, the quantified dynamic vibration mode properties, including the ones observed for higher order modes, are of potential interest for clinical studies involving high-speed vocal folds auto-oscillation imaging.

Keywords: High-speed vibration imaging, Dynamic vibration mode analysis,

¹annemie.vanhirtum@univ-grenoble-alpes.fr

1. Introduction

Unilateral vocal fold paralysis (UVFP) is a common vocal fold (VF) pathology characterised by an air escape due to left-right VF asymmetries of the VF's shape, tension or/and positioning [1–5]. The glottic insufficiency associated
5 with UVFP is reported to lead to dysphonia as air leakage is often associated with breathy voice or vocal fatigue [1, 6].

Each aspect of the fluid-structure (FS) interaction underlying normal or abnormal vocal fold vibration can be studied systematically in controlled and
10 known conditions from experiments using deformable mechanical VF replicas [7–11]. In the current work, three molded deformable multi-layer silicone VF replicas (labelled M5, MRI and EPI) are considered. The replicas are depicted in Fig. 1(a) [12]. They differ with respect to their shape and layer composition so that they mimic the multi-layer structure and geometry of the human VF's
15 with different degrees of complexity. Each VF replica consists of a left and right VF placed face-to-face in the transverse plane. The molded VF replicas are briefly detailed in Section 2. In previous studies [12, 13], these three replicas were used to study the effect of vertical tilting of a single VF on their auto-oscillation. Concretely, the right VF was kept in place whereas the posterior
20 edge of the left VF was tilted in the medio-sagittal plane towards the superior direction as shown in Fig. 1(b) and in Fig. 1(c). The resulting vertical tilting is parameterised by angular asymmetry angle α . Imposing angular asymmetry in the range from 0° up to 25° results in a vertical level difference up to a few mm [12], which is of the same order of magnitude as observed in patients suf-
25 fering from UVFP [2, 3]. Furthermore, vertical tilting of a VF causes left-right VF positioning asymmetry whereas left-right VF tension and shape symmetry is maintained.

In [12], the upstream pressure driving VF auto-oscillation was analysed for

(a) deformable portion: shape and composition

(b) tilting of rigid support

(c) overview fluid-structure interaction setup

(d) measured $P_u(t)$

Figure 1: Illustration of deformable VF replicas and fluid-structure interaction setup: a) multi-layered deformable silicone VF replicas with increasing complexity for $\alpha = 0^\circ$ [12]: two-layer M5, three-layer MRI and four-layer EPI. b) general view of imposed asymmetry angle α , glottal gap associated with air leakage (red triangle) and fixed rotation axis for tilting of the left VF for the MRI replica with $\alpha = 20^\circ$. c) overview of the fluid-structure interaction setup [12] indicating the pressure tap to measure upstream pressure P_u and maximal vertical difference associated with each imposed α . d) example (EPI replica, $\alpha = 0^\circ$) of measured $P_u(t)$ illustrating the pressure at oscillation onset P_{On} , steady state oscillation and oscillation offset P_{Off} .

different imposed angular asymmetry angles α using the setup schematically illustrated in Fig. 1(c). It was found that both the oscillation onset characteristics as well as common voice quality measures are affected. For instance, a decrease of the oscillation frequency and an increase of the oscillation onset threshold pressure (P_{On}) with increasing α was observed. The gradual loss of VF's contact with α , inducing increased glottal air leakage, was pointed out to catalyse these tendencies.

In [13], high-speed (HS) imaging of the VF's for different α was performed

in order to directly observe the vibrating VF's. Local image features, exploiting HS videokymographic (VK) line-scans [14], were quantified during steady state oscillation (Fig. 1(d)). Left-right vibration asymmetry parameters showed that the normal VF (right VF in Fig. 1(b)) entrains the movement of the tilted VF (left VF in Fig. 1(b)). This left-right vibration asymmetry caused the mucosal wave velocity in the tilted VF to be lower than the one in the normal VF.

Local VK line-scan analysis [13] showed the influence of angular asymmetry on VF vibration. In this work, it is sought to further investigate sustained steady state VF vibration without ($\alpha = 0^\circ$) and with ($\alpha > 0^\circ$) angular asymmetry by analysing high-speed (HS) image sequences of the vibrating VF's. Instead of focusing on local spatial features or line scans [13, 15, 17, 18] it is sought to assess simultaneously temporal as well as spatial information of the global VF's auto-oscillation. A dynamic vibration mode decomposition (DMD) of the observed vibration snapshots is applied as other VF vibration mode decomposition methods such as the empirical eigenfunction analysis [19] do not inform on the temporal mode dynamics. It is aimed to evaluate how the effect of angular asymmetry on the VF's auto-oscillation affects the spatial and temporal vibration mode features.

2. Deformable silicone VF replicas

The M5, MRI and EPI replicas illustrated in Fig. 1(a) are molded so that their elasticity is constant as detailed in [12]. They consist of respectively two (M5), three (MRI) or four (EPI) silicone-based molding layers and a backing layer attaching it to a rigid support, *i.e.* region outside of the top view frames shown in Fig. 1(a). The M5 replica is a two-layer (muscle and superficial layer) reference model following the so called M5 geometrical VF model [20]. The MRI replica has a more realistic geometry derived from magnetic resonance imaging data of a human VF [21, 22]. It has a three-layer structure by adding a third

thin and stiff surface layer representing the epithelium to the two-layer structure of the M5 replica. The EPI replica is obtained by inserting an extremely soft layer between the muscle and the superficial layer of the three-layer structure
70 used for the MRI replica [11]. The EPI replica cast is inspired on the geometrical M5 model [11] so that the geometry of the EPI replica approximates the geometry of the M5 replica as illustrated in Fig. 1. Young moduli for each layer of these VF replicas are given in [12] (Table I). The preset abduction along the left-right direction for angular asymmetry angle $\alpha = 0^\circ$ is shown in Fig. 1(a).
75 The left and right VF are in full contact along the posterior-anterior direction. As α is increased, the degree of contact decreases as illustrated in Fig. 1(b) and Fig. 1(c). The preset (no airflow) degree of vocal fold contact $\mathcal{G}$ (in percentage) associated with each replica as a function of angular asymmetry angle α is indicated in Table 1 [12].

80

3. High-speed imaging of VF auto-oscillation

The experimental setup and flow supply used to generate the FS interaction underlying the VF auto-oscillation is schematically depicted in Fig. 1(c). The setup is similar to the one described in [12, 13]. Airflow, characterised by volume
85 flow rate Q (sampling frequency 0.5 kHz), is applied along the inferior-superior direction as depicted in Fig. 1(c) and in Fig. 2. The pressure difference driving the VF's auto-oscillation corresponds to the measured upstream pressure P_u (sampling frequency 10 kHz). All experiments are performed with a mean upstream pressure $\bar{P}_u$ set just above (< 50 Pa) the oscillation onset threshold
90 P_{On} so that $\bar{P}_u \gtrsim P_{On}$. An example of the measured upstream pressure as a function of time is plotted in Fig. 1(d) indicating the pressure at oscillation onset P_{On} , oscillation offset P_{Off} and during sustained steady state oscillation. In this work, steady state oscillation is analysed. Assessed flow conditions and associated fundamental frequency f_o obtained from a Fourier analysis of the
95 upstream pressure P_u during steady oscillation as outlined in [12] are given in

Table 1: Assessed experimental conditions: mean upstream pressure $\bar{P}_u$ (Pa), mean volume flow rate $\bar{Q}$ (L/min), fundamental frequency f_o (Hz) and degree of left-right VF contact $\mathcal{G}$ (%).

		$\alpha = 0^\circ$	$\alpha = 4^\circ$	$\alpha = 10^\circ$	$\alpha = 16^\circ$	$\alpha = 20^\circ$
M5	$\bar{P}_u$	1106	1174	1015	1076	1488
	$\bar{Q}$	13.8	14.1	19.4	48.6	63.4
	f_o	138	138	138	134	126
	$\mathcal{G}$	100	100	73	38	23
MRI	$\bar{P}_u$	1251	1279	1180		1373
	$\bar{Q}$	25.5	37.7	39.1	—	66.7
	f_o	144	141	128		118
	$\mathcal{G}$	100	100	69		21
EPI	$\bar{P}_u$	438	407	435		556
	$\bar{Q}$	22.4	23.9	26.0	—	51.5
	f_o	129	127	114		93
	$\mathcal{G}$	100	65	10		0

Table 1.

This implies that the imposed $\bar{P}_u$ differs between assessed conditions as P_{On} depends on the used VF replica (M5, MRI or EPI) as well as on the imposed angular asymmetry angle α (Fig. 7 in [12]). Assessed α (from 0° up to 20°) and
100 corresponding vertical level differences $\bar{h}$ (from 0 mm up to 3 mm as reported for UVFP patients [2, 3]) are shown in the frame of Fig. 2 for each VF replica. The overall vertical level difference $\bar{h}$ in absence of airflow is obtained from the experimentally imposed α following a geometrical reasoning as outlined in [13] (section 2.3 therein) and yields half of the maximum vertical level difference
105 along the triangular air leakage area indicated in Fig. 1(c).

A single high speed (HS) camera (Keyence VW-9000, shutter time $4 \mu s$ and resolution $240 \text{ px} \times 320 \text{ px}$) is placed in the medio-frontal plane in order to acquire instantaneous images of the VF's steady state auto-oscillation as outlined
110 in [13]. The imaging frame rate f_s is set to 4 kHz so that images are gathered ev-

Figure 2: Overview of experimental setup with HS camera view angles [13]: $\theta_{HS} = 0^\circ$ (top view), $\theta_{HS} = 45^\circ$ (diagonal view) and $\theta_{HS} = 90^\circ$ (level view). Initial (no airflow) vertical level difference $\bar{h}$ resulting from varying angular asymmetry α between 0° and 20° for each VF replica (M5, MRI and EPI) is framed. The shaded area $0 \leq \bar{h} \leq 3$ mm covers values reported for patients [2, 3]. Snapshots during VF vibration to illustrate captured images $\mathbf{Im}_k = I(x, y; t_k)$ at instant t_k .

ery Δt seconds at time instants $t_k = k \cdot \Delta t$ with $\Delta t = 1/f_s$ yielding 0.25 ms and k denoting the frame number in the image sequence. This temporal accuracy corresponds to $\leq 3.8\%$ of the period for oscillation frequencies ≤ 150 Hz, which is pertinent for the primary oscillation frequency of each assessed experimental condition regardless of the used VF replica and imposed asymmetry angle α as shown in [12, 13] and in Table 1. For oscillation frequencies ≤ 750 Hz, the temporal accuracy decreases to $\leq 15\%$ of the oscillation period.

The VF vibration during auto-oscillation is observed non-simultaneously from three distinct single view angles θ_{HS} , defined as the angle between the observation direction and the medio-sagittal plane: top view $\theta_{HS} = 0^\circ$, diagonal view $\theta_{HS} = 45^\circ$ and level view $\theta_{HS} = 90^\circ$. Camera positions and corresponding view angles θ_{HS} are depicted in Fig. 2.

125 Acquired images at each instant t_k are two dimensional grayscale intensity matrices $\mathbf{I}_k = I(x, y; t_k)$ with x and y indicating the pixel position in the image and where subscript k denotes time instant t_k . It follows that $1 < x \leq N_x$ and $1 < y \leq N_y$, with $N_x = 240$ and $N_y = 320$ determined by the camera resolution, so that each image contains $n = 76800$ pixel positions.

130

For each assessed condition, defined by both the VF replica (M5, MRI or EPI) and imposed angular asymmetry angle α , 1 s of steady-state auto-oscillation is analysed. For each replica and view angle, the system dynamics $\mathbf{f}$ of the fluid-structure interaction during auto-oscillation is represented as a
 135 function of asymmetry angle α as

$$\frac{d\mathbf{s}}{dt} = \mathbf{f}(\mathbf{s}, t; \alpha), \quad (1)$$

where $\mathbf{s} \in \mathbb{R}^n$ represents the state of the system with dimension $n \gg 1$ at time t . In discrete-time representation Eq. (1) becomes

$$\mathbf{s}_{k+1} = \mathbf{F}(\mathbf{s}_k; \alpha) \quad (2)$$

as system states are denoted $\mathbf{s}_k = \mathbf{s}(t_k)$, where subscript k denotes again time instant t_k .

140

Gathered image vectors $\mathbf{I}_k = \text{vec}(\mathbf{I}_k)$, where $\text{vec}(\cdot)$ is the vectorised operator, provide snapshots of the system at times t_k , so that

$$\mathbf{I}_k = \mathbf{g}(\mathbf{s}_k) \quad (3)$$

with $k = 1, \dots, m$ where m denotes the total number of snapshots in each image sequence. Analysing 1 s of steady-state auto-oscillation corresponds to an image
 145 sequence of $m = 4000$ subsequent snapshots. It is further assumed that at each time instant t_k the state corresponds to the measured image so that

$$\mathbf{s}_k = \mathbf{I}_k \quad (4)$$

holds. The system dimension n corresponds then to the number of pixel positions. Initial conditions are prescribed as $\mathbf{I}_1 = \mathbf{I}(t_1)$ at time $t_1 = 0$ s.

150 4. Dynamic mode decomposition

The temporal and spatial decomposition of the global VF auto-oscillation is assessed by a dynamic mode decomposition (DMD) of the gathered image sequences [23, 24].

155 The DMD framework is model free so that the system dynamics is estimated from each measured image sequence only. Assuming a locally linear system dynamics

$$\frac{d\mathbf{s}}{dt} = \mathbf{X}\mathbf{s}, \quad (5)$$

the solution is given as

$$\mathbf{s}(t) = \sum_{j=1}^n \phi_j \exp(\omega_j t) b_j, \quad (6)$$

where ϕ_j and ω_j denote the eigenvectors and eigenvalues of the system matrix $\mathbf{X}$ and where the coefficients b_j are the coordinates of $\mathbf{I}(t_1)$ in the eigenvector basis [25]. In matrix notation this becomes

$$\mathbf{s}(t) = \mathbf{\Phi} \exp(\mathbf{\Omega} t) \mathbf{b}, \quad (7)$$

where $\mathbf{\Omega} = \text{diag}(\omega)$ is a diagonal matrix whose entries are the eigenvalues ω_j , $\mathbf{\Phi}$ is a matrix whose columns are the eigenvectors ϕ_j and $\mathbf{b}$ is a column vector of the coefficients b_j .
160

Using the assumption $\mathbf{s}_k = \mathbf{I}_k$ expressed in Eq. (4), the discrete-time analogous of Eq. (5) is

$$\mathbf{I}_{k+1} = \mathbf{A}\mathbf{I}_k \quad (8)$$

with

$$\mathbf{A} = \exp(\mathbf{X}\Delta t). \quad (9)$$

The solution is then given as

$$\mathbf{I}_k = \sum_{j=1}^r \phi_j \lambda_j^{k-1} b_j \quad (10)$$

with ϕ_j and λ_j the eigenvectors and eigenvalues of the discrete time map $\mathbf{A}$ and with b_j the coefficients of $\mathbf{I}_1$ in the reduced eigenvector basis of rank $r \leq n$. In matrix notation this becomes

$$\mathbf{I}_k = \Phi \mathbf{\Lambda}^{k-1} \mathbf{b} \quad (11)$$

with Φ and $\mathbf{b}$ defined in Eq. 7 and $\mathbf{\Lambda}^{k-1} = \text{diag}(\{\lambda_j^{k-1}\}_j)$ is a diagonal matrix whose entries are the eigenvalues λ_j raised to the power $k - 1$. The exponent k indicates the time instant t_k of the image snapshot. The initial condition is

165 given as $\mathbf{I}_1 = \Phi \mathbf{b}$.

The sought spatial analysis of the global auto-oscillation is thus provided by the DMD modes ϕ_j given by the eigenvectors of $\mathbf{A}$. The sought temporal analysis of each DMD mode is provided by the corresponding eigenvalue λ_j of $\mathbf{A}$ so that from Eq. 6 and Eq. 10

$$\omega_j = \frac{\ln(\lambda_j)}{\Delta t} \quad (12)$$

holds and the mode frequency is given by $f_j = \text{Im}(\omega_j)/2\pi$ and its growth rate by $\text{Re}(\omega_j)$ so that $\text{Re}(\omega_j) \leq 0$ holds for stable modes. The DMD eigenvalue spectrum is then obtained by plotting for each mode j its frequency $\text{Im}(\omega)/2\pi$ as a function of its growth rate $\text{Re}(\omega)$ where $\omega = \omega_j$. The amplitude of each mode corresponds to the associated coefficient b_j in $\mathbf{b}$.

170

It follows that the superposition of the DMD modes, weighted by their amplitude and temporal behavior results in a spatio-temporal representation of

175 the full VF auto-oscillation dynamics. The dimension of the representation de-
 pends on the eigenvector basis of rank r taken into account. In the current
 work, DMD analysis is aimed and not reconstruction or data reduction so that
 mode selection (or rank r) is not crucial. Instead, DMD eigenvalue spectra for
 modes with oscillation frequencies up to 1600 Hz are presented in Section 5 and
 180 spatial DMD mode patterns for modes with oscillation frequencies up to 750 Hz
 are presented in Section 6.

5. Temporal vibration analysis: DMD eigenvalue spectra

The temporal behavior of the vocal folds vibration for different VF replicas
 185 and imposed angular asymmetry angles α is analysed considering the DMD
 eigenvalue spectra. Spectra of stable vibration modes for all three replicas and
 top view angle $\theta_{HS} = 0^\circ$ are plotted in Fig. 3.

All spectral branches originate with a non-oscillation mode (0 Hz, $j = 1$) as-
 190 sociated with the zero eigenvalue at the origin ($\text{Re}(\omega) = 0$ and $\text{Im}(\omega)/2\pi = 0$).
 This non-oscillation mode expresses the influence of the mean flow along the
 inferior-superior direction on the VF's vibration pattern. Stable branches with
 least decay are identified as main spectral branches. Dominating oscillation
 modes ($j = 2 \dots 6$) on the main spectral branches with frequencies up to
 195 ≈ 750 Hz ($\text{Im}(\omega)/2\pi \leq 750$) are indicated with filled symbols in Fig. 3. Both
 the non-oscillation mode and most dominating oscillation modes decay slowly as
 their real parts approximate zero ($\text{Re}(\omega) \leq 0$). The real part of the eigenvalue
 $\text{Re}(\omega)$ decreases as the mode frequency increases, typically above ≈ 750 Hz or
 $\text{Im}(\omega)/2\pi > 750$ for the main spectral branches, so that these modes decay mode
 200 rapidly and hence contribute less to observed temporal vibration patterns. It
 is noted that side branches might occur such as *e.g.* observed for $\alpha = 0^\circ$ and
 $\alpha = 10^\circ$ in Fig. 3(a). It is noted that primary oscillation (PO mode, mode
 $j = 2$) frequencies obtained from the DMD eigenvalue spectra matches with f_o

(a) M5: spectrum and zoom

(b) MRI: spectrum and zoom

(c) EPI: spectrum and zoom

Figure 3: DMD eigenvalue spectra (left) and zoom (right) for top view $\theta_{HS} = 0^\circ$ and different asymmetry angles α (symbols) for all three VF replicas: a) M5, b) MRI and c) EPI. Filled symbols indicate dominating modes with frequency $\text{Im}(\omega)/2\pi \leq 750$ Hz.

values reported in Table 1 and with previously reported values [12, 13].

205

Despite these similar tendencies for all VF replicas, Fig. 3 shows that the type/structure of VF replica affects the influence of angular asymmetry angle

α on the eigenvalue spectra. This is most obvious when comparing eigenvalue spectra obtained for the M5 replica with spectra obtained for the MRI or EPI replica.

Increasing the angular asymmetry from $\alpha = 0^\circ$ to $\alpha = 4^\circ$ either decreases (MRI/EPI) or increases (M5) the decay of high frequency modes. Indeed, tilting a VF from $\alpha = 0^\circ$ to $\alpha = 4^\circ$ results in either steeper ($\text{Re}(\omega)$ increases for MRI/EPI) or more sloped ($\text{Re}(\omega)$ decreases for M5) spectral branches. Therefore, in terms of the number of non-decaying stable oscillation modes, introducing a slight angular asymmetry ($\bar{h} \ll 1$ mm Fig. 2) either enriches (MRI/EPI) or strips (M5) the vibration pattern.

Further increasing the angular asymmetry angle from $\alpha = 4^\circ$ reveals the opposite tendency as mode decay either decreases ($\text{Re}(\omega)$ increases, M5) or increases ($\text{Re}(\omega)$ decreases, MRI/EPI). So that in terms of the number of non-decaying stable oscillation modes, the vibration pattern either enriches (M5) or recedes (MRI/EPI) with $\alpha \geq 4^\circ$.

Given the geometry and multi-layer composition of the used VF replicas (Fig. 1(a) and Section 2), observed eigenvalue spectral differences are attributed to the presence (MRI/EPI) or absence (M5) of a thin and stiff surface layer representing the epithelium. As perfect angular symmetry ($\alpha = 0^\circ$) is unlikely to occur in real life, the found robustness of the MRI/EPI VF replica to small angular asymmetries ($\alpha = 4^\circ$ in Fig. 2) supports the hypothesis that adding an epithelium-like layer alters silicone VF replicas from a vibratory point of view. In addition, it provides evidence of the importance of this layer for normal VF vibration. Larger angular asymmetries ($\alpha > 4^\circ$ in Fig. 3) mimic pathological VF vibration as all replicas become prone to glottal air leakage due to vertical level difference ($\bar{h} > 0$ mm in Fig. 2) [12]. Increased mode decay, only observed for the MRI/EPI replica and not for the M5 replica, is consistent with impaired oscillation and reduced vibration quality associated with glottal insufficiency reported for human speakers. Thus for the assessed silicone VF replicas, it is hypothesized that from a vibration point of view the presence of an epithelium-like layer results in more reasonable vibration patterns.

From Fig. 3 is seen that the effect of α on mode decay is most obvious for
240 higher frequency modes (typically > 750 Hz). Therefore, it might be of interest
to investigate higher frequency vibration modes as potential clinical markers for
voice pathology studies such as UVFP.

The described changes in decay rate with α can be partly explained by
245 changes in structural damping. Structural damping is likely to increase (or de-
crease) as the duration of vocal fold contact along the inferior-superior direction
inside each glottal cycle increases (or decreases). This duration was quantified
for the assessed VF replicas in [13]. It follows that structural damping either
increases (MRI/EPI) or decreases (M5) with α for $\alpha \geq 4^\circ$ as vocal fold contact
250 was found to increase (MRI/EPI) or decrease (M5) with α .

So far, spectral similarities, with respect to the influence of angular asym-
metry angle α , between the MRI and the EPI replica were pointed out. Nev-
ertheless, comparing Fig. 3(b) and Fig. 3(c) shows for all α that the onset of
255 vibration mode decay occurs at lower mode frequencies for the EPI than for the
MRI replica. This observation is again partly explained considering structural
damping. As the oscillation frequency of the dominant oscillation mode for the
EPI replica (≈ 120 Hz [13]) is lower than the one observed for the MRI replica
(≈ 140 Hz [13]) the contribution of structural damping to mode decay during
260 a similar relative portion of the glottal cycle will be greater for the EPI than
for the MRI replica. Hence, mode decay for the EPI replica is enhanced com-
pared to the MRI replica. The different relative closure duration during each
glottal cycle between both VF replicas is due to differences in their shape and
their composition underneath the epithelium layer as outlined in Fig. 1(a) and
265 Section 2.

Fig. 4 illustrates, for the EPI replica, that varying the camera view an-
gle θ_{HS} from top view $\theta_{HS} = 0^\circ$ to either diagonal view $\theta_{HS} = 45^\circ$ or level
view $\theta_{HS} = 90^\circ$, shown in Fig. 2, preserves the general eigenvalue spectral

(a) EPI, $\theta_{HS} = 45^\circ$

(b) EPI, $\theta_{HS} = 90^\circ$

Figure 4: DMD eigenvalue spectra for the EPI replica and different asymmetry angles α (symbols) for: a) diagonal view $\theta_{HS} = 45^\circ$ and b) level view $\theta_{HS} = 90^\circ$. Filled symbols indicate dominating modes with oscillation frequency $\text{Im}(\omega)/2\pi \leq 750$ Hz.

270 tendencies observed for top view $\theta_{HS} = 0^\circ$ (Fig. 3(c)). Nevertheless, whereas
no significant changes to the decay of dominant oscillation modes (filled sym-
bols) are observed, the decay of higher frequency oscillation modes (non-filled
symbols) slows down as the camera view angle is tilted towards higher θ_{HS} .
As higher frequency modes have more complex vibration patterns, tilted views
275 ($\theta_{HS} = 45^\circ$, $\theta_{HS} = 90^\circ$) allow a better observation of these modes than the top
view $\theta_{HS} = 0^\circ$ as, in addition to the transverse plane, they allow observation of
the modes along the medio-sagittal plane.

6. Spatial vibration analysis: DMD modes

280 In this section, stable vibration modes ϕ_j along the main spectral branches, indicated by filled symbols in Fig. 3 and Fig. 4, are arranged ($j = 1 \dots 6$) according to increasing frequency.

6.1. Mean flow modes

285 Examples of non-oscillation spatial modes, corresponding to the zero eigenvalue at the origin of the eigenvalue spectra (mode $j = 1$), are illustrated in Fig. 5. These modes are due to the mean flow during the fluid-structure interaction along the inferior-superior direction and depend on the imposed asymmetry angle α as the resulting glottal air leakage affects the mean glottal flow.

Figure 5: Illustration of spatial mean flow or non-oscillation mode patterns ϕ_j for $j = 1$ scaled between 0 (white, invariant mode region) and 1 (black, most variant mode region) for top view $\theta_{HS} = 0^\circ$.

290

Non-oscillation mode amplitudes b_1 are plotted in Fig. 6. All amplitudes are normalised by the amplitude of the PO mode ($j = 2$) associated with the lowest stable oscillation frequency for $\alpha = 0^\circ$ denoted as $b_{2,0^\circ}$. As normalised values exceed unity for each assessed configuration, regardless of the used VF replica

295 and view angle θ_{HS} , the non-oscillation mode is the overall dominant mode in
the eigenvalue spectra.

For all view angles θ_{HS} and angular asymmetry angles α , the imprint of
the mean flow is least pronounced for the EPI replica as normalised ampli-
tudes are lower than for the M5 or MRI replica in Fig. 6. As noted previously,
300 view angles $\theta_{HS} > 0^\circ$ (diagonal or level) allow to observe phenomena along the
medio-sagittal plane, and hence along the main flow direction in the inferior-
superior direction, more directly than when the top view angle $\theta_{HS} = 0^\circ$ is
used. Consequently, mean flow mode amplitudes obtained for the diagonal or
305 level view ($\theta_{HS} > 0^\circ$) are greater than the ones for the top view with $\theta_{HS} = 0^\circ$
as illustrated in Fig. 6 for $\theta_{HS} = 0^\circ$ and $\theta_{HS} = 45^\circ$. This is most notable for
the M5 replica, which quantifies the empirical observation that auto-oscillation
of the M5 replica is associated with a large displacement in the flow direc-
tion compared to the MRI or EPI replica. This illustrates again the impact of
310 the epithelium-like surface layer, which is absent in the case of the M5 replica
(Fig. 1(a) and Section 2), on the fluid-structure interaction and more in partic-
ular on the non-oscillation mean flow mode.

Figure 6: Normalised non-oscillation mode amplitude magnitude as a function of asymmetry angle α for all VF replicas (M5, MRI and EPI): a) top view $\theta_{HS} = 0^\circ$, b) diagonal view $\theta_{HS} = 45^\circ$. The unity amplitude of the primary oscillation mode for $\alpha = 0^\circ$ is indicated (horizontal dashed line).

6.2. Oscillation modes

Figure 7: Oscillation mode ($j = 2 \dots 6$) amplitudes as a function of their oscillation frequency and different asymmetry angles α (symbols) with top view $\theta_{HS} = 0^\circ$ and diagonal view $\theta_{HS} = 45^\circ$ for the MRI (a,b) and for the EPI replica (c,d). Amplitudes and frequencies are normalized with respect to values of the primary oscillation (PO) mode ($j = 2$) with $\alpha = 0^\circ$ indicated with a dashed horizontal and dotted vertical line respectively.

315 The normalised amplitudes of five oscillation modes ($j = 2 \dots 6$) for the MRI and EPI replicas, indicated by the filled symbols away from the origin in the eigenvalue spectra of Fig. 3 and Fig. 4, are plotted in Fig. 7 as a function of their normalised mode frequency. Plotted quantities are normalised with respect to the amplitude $b_{2,0^\circ}$ and the frequency $f_{2,0^\circ}$ of the primary oscillation mode (PO mode, $j = 2$) at $\alpha = 0^\circ$. Amplitudes obtained with top view $\theta_{HS} = 0^\circ$ (Fig. 7(a) and Fig. 7(c)) and with diagonal view $\theta_{HS} = 45^\circ$ (Fig. 7(b) and Fig. 7(d)) are plotted.

The PO mode, whose frequency corresponds to the fundamental frequency characterising voiced speech utterances, has the largest amplitude for each angular asymmetry angle α . It is noted that the PO mode frequencies match with

auto-oscillation frequencies previously reported either from VK image analysis [13] or from upstream pressure flow analysis [12]. Therefore, current results confirm the reported decrease of the PO mode frequency with increasing angular asymmetry α so that $f_2/f_{2,0^\circ} \leq 1$ holds as seen in Fig. 7.

Higher order post-PO modes obtained for $j = 3 \dots 6$, exhibit oscillation frequencies near the harmonics of the PO mode frequency f_2 for all angular asymmetry angles α as $f_j/f_2 \approx j - 1$ holds. Discrepancies between post-PO mode frequencies and PO mode harmonics are insignificant considering the temporal accuracy associated with the used image frame rate (section 3).

As observed for the non-oscillatory mean flow mode ($j = 1$), normalised oscillation mode amplitudes obtained with $\theta_{HS} > 0^\circ$ are mostly larger than those obtained with top view angle $\theta_{HS} = 0^\circ$ as mode patterns develop along both the horizontal transverse as well as along the medio-sagittal plane. From Fig. 7 is seen that, in general, normalised mode amplitudes reduce with j for each view angle θ_{HS} and angular asymmetry angle α .

Spatial oscillation modes ϕ_j for $j = 2 \dots 6$ (columns) of the MRI replica are illustrated for top view $\theta_{HS} = 0^\circ$ in Fig. 8(a) and for diagonal view $\theta_{HS} = 45^\circ$ in Fig. 8(b). Spatial mode activity is colour-coded between white (invariant mode regions) and black (most variant mode regions). The imposed asymmetry angle ($\alpha = 4^\circ$ or $\alpha = 20^\circ$) is indicated in front of each row and the oscillation mode order ($j = 2 \dots 6$) is indicated on top of each column.

Increasing mode order j changes the spatial mode with respect to its extent and with respect to the node pattern. In the vicinity of the glottal aperture (within the frames in Fig. 8) typical higher order mode patterns are observed as the number of nodes increases with j . For small angular asymmetry angles, *e.g.* $\alpha = 4^\circ$ in Fig. 8, mode patterns develop similarly along the posterior-anterior direction and occupy both VF surfaces as tilting does not alter the elasticity of each VF. For large angular asymmetry angles, *e.g.* $\alpha = 20^\circ$ in Fig. 8, spatial

(a) $\theta_{HS} = 0^\circ$

(b) $\theta_{HS} = 45^\circ$

Figure 8: Spatial oscillating mode patterns ϕ_j for $j = 2 \dots 6$ (columns) scaled between 0 (white, invariant mode region) and 1 (black, most variant mode region) for the MRI replica at $\alpha = 4^\circ$ and $\alpha = 20^\circ$ (rows): a) top view $\theta_{HS} = 0^\circ$, b) diagonal view $\theta_{HS} = 45^\circ$. The glottal aperture region is framed. Posterior side of the left VF is tilted as illustrated for $j = 6$ ($\times$).

modes reflects the loss of full VF contact along the posterior-anterior direction. It is observed that a surface region extending from the posterior edge of the tilted

360 VF (illustrated for $j = 6$ with a cross ($\times$) in Fig. 8) is no longer part of the spatial mode pattern. Moreover, it is noted that the area of the excluded surface region increases with j . Near the glottal aperture the spatial mode pattern for large α depends on the used view angle θ_{HS} . In the case of top view $\theta_{HS} = 0^\circ$

in Fig. 8(a), reduced VF contact limits the complex node pattern. In the case of
 365 the diagonal view $\theta_{HS} = 45^\circ$ in Fig. 8(b), the complex node pattern is observed
 more clearly as the tilted VF (upper VF in Fig. 8(b)) is directly observed. It is
 noted that the complex node pattern within the glottal aperture still extends
 along the full posterior-anterior direction and is still quasi-symmetrical between
 the normal and tilted VF given that it does not alters their elasticity.

370

7. Conclusion

Dynamic vibration mode decomposition in space and time of high-speed im-
 ages of auto-oscillating silicone vocal folds replicas without and with vertical
 tilting is assessed. Temporal properties obtained from the eigenvalue spectra
 375 show that imposing vertical tilting affects mode decay in a way that for the
 assessed replicas is hypothesized to be associated with the presence or absence
 of a stiffer epithelium-like surface layer. The effect is observed most clearly for
 decaying higher order vibration modes with typical frequencies above 750 Hz.
 The presence of a stiffer epithelium-like surface layer is also associated with a
 380 limited amplitude of the mean flow mode with respect to the amplitude of the
 primary oscillation mode. Vertical tilting reduces the spatial extent of the vi-
 bration mode near the tilted edge. On the other hand, the node pattern near the
 glottal aperture along the posterior-anterior direction is unaffected by vertical
 tilting as it does not affect the structural properties of the assessed VF replicas.
 385 The observed impact of the stiff epithelium-like layer and dynamic vibration
 mode properties as a function of vertical tilting needs further confirmation and
 investigation. Furthermore, it is of interest to vary besides the angular asym-
 metry angle also the elasticity of between the left and right vocal fold, as might
 occur in the case of UVFP, in order to consider the influence on the vibration
 390 modes. Moreover, current results encourage to investigate the potential inter-
 est of DMD analysis and resulting dynamic vibration mode properties, and in
 particular higher order vibration modes, as potential clinical markers derived

from high-speed images of human vocal folds auto-oscillation, *e.g.* in the case of pathologies such as UVFP.

395

Acknowledgements

This work was partly supported by Full3DTalkingHead project (ANR-20-CE23-0008-03) and JSPS International Research Fellowship (SP18205). Authors thank Dr. K. Ishimura (Ritsumeikan Univ., Japan) for experimental support.

400

References

- [1] C. Rosen, C. Simpson, Operative techniques in laryngology, Springer-Verlag, 2008.
- [2] K. Hong, K. Jung, Arytenoid appearance and vertical level difference between the paralyzed and innervated vocal cords, The Laryngoscope 111 (2001) 227–232.
- [3] Y. Oyamada, E. Yumoto, K. Nakano, H. Goto, Asymmetry of the vocal folds in patients with vocal fold immobility, Arch Otolaryngol head neck surg 131 (2004) 399–406.
- [4] S. Nouraei, S. Middleton, C. Butler, G. Sandhu, An estimation of the population incidence of adult unilateral vocal fold mobility impairment in England, Logoped Phoniatr Vocol 40 (2015) 93–94.
- [5] C. Walton, P. Carding, K. Flanagan, Perspectives on voice treatment for unilateral vocal fold paralysis, Curr Opin Otolaryngol Head Neck Surg 3 (2018) 157–161.
- [6] C. Walton, P. Carding, E. Conway, K. Flanagan, H. Blackshaw, Voice outcome measures for adult patients with unilateral vocal fold paralysis: A systematic review, The Laryngoscope 129 (2018) 187–197.

405

410

415

- [7] J.C. Lucero, A. Van Hirtum, N. Rutu, J. Cisonni, X. Pelorson., Validation
420 of theoretical models of phonation threshold pressure with data from a
vocal fold mechanical replica, *J Acoust Soc Am* 125 (2009) 632–635.
- [8] A. Van Hirtum, J. Cisonni, N. Rutu, X. Pelorson., I. Lopez, F. van Uit-
tert, Experimental validation of some issues in lip and vocal folds physical
models, *Acta Acustica* 93 (2007), 314–323.
- [9] N. Rutu, X. Pelorson., A. Van Hirtum, I. Lopez, A. Hirschberg, An in-vitro
425 setup to test the relevance and the accuracy of low-order models of the
vocal folds, *J Acoust Soc Am* 121 (2007) 479–490.
- [10] J.C. Lucero, X. Pelorson., A. Van Hirtum, Phonation threshold pressure
at large asymmetries of the vocal folds, *Biomed Signal Process Control* 62
430 (2020) 102105.
- [11] P. Murray, S. Thomson, Vibratory responses of synthetic, self-oscillating
vocal fold models, *J Acous Soc Am* 132 (2012) 3428–3438.
- [12] A. Bouvet, I. Tokuda, X. Pelorson, A. Van Hirtum, Influence of level dif-
ference due to vocal folds angular asymmetry on auto-oscillating replicas,
435 *J. Acoust. Soc.* 147 (2020) 1136–1145.
- [13] A. Bouvet, I. Tokuda, X. Pelorson, A. Van Hirtum, Imaging of auto-
oscillating vocal folds replicas with left-right level difference due to angular
asymmetry, *Biomed Signal Process Control* 63 (2021) 1–12.
- [14] J. G. Svec, On vibration properties of human vocal folds, Ph.D. thesis,
440 University of Groningen (2000).
- [15] P. Mergell, H. Herzel, I.R. Titze, Irregular vocal-fold vibration – High-speed
observation and modeling, *J Acous Soc Am* 108 (2000) 2996–3002.
- [16] Z. Zhang, J. Neubauer, A. Berry, Aerodynamically and acoustically driven
modes of vibration in a physical model of the vocal folds, *J Acous Soc Am*
445 120 (2006) 2841–2849.

- [17] Z. Zhang, J. Neubauer, A. Berry, Influence of vocal fold stiffness and acoustic loading on flow-induced vibration of a single-layer vocal fold model, *J Sound Vib* 322 (2009) 299–313.
- [18] Z. Zhang, The influence of material anisotropy on vibration at onset in a three-dimensional vocal fold model, *J Acous Soc Am* 135 (2014) 1480–1490.
- [19] D.A. Berry, H. Herzel, I.R. Titze, K. Krischer, Interpretation of biomechanical simulations of normal and chaotic vocal fold oscillations with empirical eigenfunctions, *J Acous Soc Am* 95 (1994) 3595–3604.
- [20] R. Scherer, D. Shinwari, K. De Witt, C. Zhang, B. Kucinski, A. Afjeh, Intraglottal pressure profiles for a symmetric and oblique glottis with a divergence angle of 10 degrees, *J Acous Soc Am* 109 (2001) 1616–1630.
- [21] I. Tokuda, R. Shimamura, Effect of level difference between left and right vocal folds on phonation: Physical experiment and theoretical study, *J Acous Soc Am* 142 (2017) 482–492.
- [22] B. Pickup, S. Thomson, Flow-induced vibratory response of idealized versus magnetic resonance imaging-based synthetic vocal fold models, *J Acous Soc Am* 128 (2010) 124–129.
- [23] J. Tu, R. C.W., D. Luchtenburg, S. Brunton, J. Kutz, On dynamic mode decomposition: Theory and applications, *J Comp Dynamics* 1 (2014) 391–421.
- [24] J. Kutz, S. Brunton, B. Brunton, J. Proctor, Dynamic mode decomposition: data-driven modeling of complex systems, SIAM, Philadelphia, USA, 2016.
- [25] W. Boyce, R. DiPrima, Elementary Differential Equations, Wiley, 2008.