Temporal Sequence of Upper Esophageal Sphincter Opening and Laryngeal Vestibule Closure and Reopening is Associated with Airway Protection

Short Title: Temporal sequence affects airway protection

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1 Abstract

2 Background: Upper esophageal sphincter opening (UESO), and laryngeal vestibule closure (LVC) are 3 two essential kinematic events whose timings are crucial for adequate bolus clearance and airway 4 protection during swallowing. The Their temporal characteristics of these events can be quantified in 5 through time-consuming analysis of videofluoroscopic swallow studies. Objectives: We sought to 6 establish a model to predict the presenceodds of penetration or aspiration during swallowing based 7 on 15 temporal factors of UESOUES and LVC in videofluoroscopic images. laryngeal vestibule 8 kinematics. Methods: Manual measurements for the onset and offset of UESO and, UES closure, LVC 9 kinematic events, laryngeal reopening (LVO), and ratings of laryngeal penetration and aspiration 10 were conducted on a videofluoroscopic dataset of 408 swallows from 99 patients. A generalized 11 estimating equation model was deployed to analyze association between individual temporal factors 12 and the risk of penetration or aspiration. **Results:** The results indicated that the latencies of laryngeal 13 vestibular events and the time lapse between UESO onset and LVC were highly related to 14 penetration or aspiration. The predictive model incorporating patient demographics and bolus 15 presentation showed that delayed LVC by 0.1s or delayed laryngeal reopeningLVO by 1% of the 16 swallow duration (average 0.018s) was associated with a 17.19% and 2.68% increase in odds of 17 airway invasion, respectively. These results demonstrate that a delay of one-half second in LVC or 18 LVO would increase the odds of laryngeal penetration or aspiration during oral intake by 86% or 74%. 19 Conclusion: This predictive model provides insight into kinematic factors that underscore the 20 interaction between the timing of UESO and airway protection. Further refinement of our methods is 21 warranted to improve the objectivity of the clinical diagnosis. Likewise, the treatment of dysphagia 22 may be positively influenced by considering temporal kinematic patterns of UESO and LVC with 23 sophisticated algorithms intricate timing of laryngeal kinematics and airway protection. Recent 24 investigation in automatic non-invasive or videofluoroscopic detection of laryngeal kinematics would 25 provide clinician access to objective measurements not commonly quantified in VFSS studies. 26 Consequently, the temporal and sequential understanding of these kinematics may interpret such 27 measurements to an estimation of the risk of aspiration or penetration which would give rise to rapid 28 computer-assisted dysphagia diagnosis.

- Keywords: Aspiration, Dysphagia, Videofluoroscopic swallow studies, Upper esophageal sphincter,
 Laryngeal vestibule closure.
- 31 Level of Evidence: 2
- 32

33 Introduction

Dysphagia is a swallowing disorder that affects up to 30-40% of older individuals and is highly prevalent among populations with head/neck cancer, neurological diseases, and iatrogenic conditions.¹⁻³ Patients with dysphagia are at risk of aspirating material into the lungs, which may result in aspiration pneumonia and other complications such as malnutrition and dehydration¹; therefore, comprehensive evaluation of aspiration risk using all available information is critical in initiating and managing dysphagia treatment.

40 Videofluoroscopic swallow studies (VFSS) allow real-time observation of swallowing physiology and offer precise assessment of swallowing kinematics.⁴ From VFSS images, clinicians and researchers can 41 42 use the standardized 8-point penetration-aspiration scale (PAS) to evaluate the presence and depth 43 of swallowed material in the airway.⁵ Additionally, they can perform temporal analysis and spatial analyses of swallowing kinematics to determine significant deviations from the norms for sequential 44 swallowing events.^{6,7,8} Unfortunately, temporal analysis is time-consuming and many clinicians do 45 46 not use this objective measurementonly 16% of speech-language pathologists responding to informa 47 research survey indicated that they perform frame-by-frame measurements on their clinical 48 impressions. VFSS studies more than 80% of the time, with a full 32% indicating that they never perform measurements.⁴⁸ VFSS studies are structured to sample swallow physiology of typical foods 49 50 and liquids in a person's diet and are meant to characterize swallowing that occurs throughout the day; however, people swallow hundreds of times per day and only a limited number of swallows 51 (*e.g., 10-20) can be observed on VFSS due to radiation safety concerns. 52 53 During swallowing, a variety of biomechanical events occur over the very short duration of about 1 54 second, including upper esophageal sphincter opening (UESO) and laryngeal vestibule closure (LVC). 55 Both events are directly related to other kinematics (e.g.,: hyolaryngeal excursion contributes to the sealing of the larynx and pulls open the UES⁴⁶; intrabolus pressure generation). is generated in 56

57 <u>balance with reduced UES muscle tension and anterior traction of cricoid cartilage⁴⁷</u>. At rest, the

airway is continuously open. The pattern of swallowing momentarily shifts the pharynx from the
respiratory mode to the deglutitive mode, closing the larynx and opening the UES, in a sequential
manner that enables bolus transport into the esophagus while breathing is interrupted. Therefore,
the fine temporal coordination and sufficient duration of UESO and LVC are crucial for safe and
effective swallowing.⁹

63 The sequential relation between airway closure and UESO have been studied in healthy populations. 64 Kendall et al¹⁰ observed that the onset of aryepiglottic fold elevation always occurs before UESO and 65 complete supraglottic closure occurs almost always prior to the UESO among healthy volunteers- for liquid swallows regardless of volume. While Molfenter et al¹¹ confirmed that the onset of airway 66 67 closure commonly occurs before UESO, they disagreed with certain obligatory ordering proposed by Kendall et al. and further concluded that the overall swallowing sequence is highly variable across 68 young healthy adults and repeated trials. Herzberg et al¹² found the less common sequence of UESO 69 70 and laryngeal closure (LVC after UESO) happened predominantly among older participants but less 71 frequently among younger ones. More recently, reference values of temporal UESO and LVC 72 measurements were extracted from healthy young adults by Steele et al¹³. Their findings indicated 73 that UESO occurred just before LVC (average time lapse 0.046 s) and UES closure occurred 74 simultaneously or before the laryngeal reopening (average time lapse 0.03 s) in most cases. All 3 75 above-mentioned studies reported no clear influence of bolus viscosity on swallowing sequences but 76 suggested that smaller bolus volume might exceptionally cause greater sequence variations. To 77 summarize, current investigations fail to establish a universal obligatory sequence between LVC and 78 UESO for healthy swallows; variable sequencing between these events have been noticed across 79 different bolus volumes, bolus consistencies, participants' ages, and even repeated trials. 80 Other studies considered UESO and LVC latencies (the start of the event referenced to the beginning of the swallow or other events), durations, and the time intervals between these events as 81 swallowing characteristics.¹¹ Steele et al¹³ extracted reference values of temporal UESO and LVC 82

83	measurements from healthy young adults. Their findings indicated that the average time lapse
84	between UESO and LVC is 0.046 s and UES closure occurred about 0.03 s before the laryngeal
85	reopening in average. Park et al ¹⁴ observed significantly delayed initiation and reduced duration of
86	laryngeal closure among patients with stroke who aspirated. versus who did not aspirate. Nativ-
87	Zeltzer and Logemann ¹⁵ et al. ¹⁵ found significantly longer UESO and LVC latencies in relation to
88	differences in glossopalatal junction (the oropharyngeal portal) opening for the participants who
89	aspirate and penetrated compared to the healthy ones but longer UESO to glossopalatal junction
90	opening only for patients who aspirated versus normal participants. Kiyohara et al ¹⁶ identified the
91	prolonged time interval between the start of laryngeal elevation to LVC favoring penetration or
92	aspiration during hyolaryngeal displacement, as well as the premature opening of the LVC during its
93	descent. Both videofluoroscopic and manometric studies revealed the association of post-stroke
94	aspiration with shorter UESO duration. ^{17,18} In addition, Saconato et al ¹⁹ reported longer duration of
95	supraglottic closure for poststroke patients who aspirated than the patients who did not; however,
96	the duration of UESO was not found significant regardless of volume and consistency.
97	FurthermoreBesides variables measuring individual UESO or LVC, Choi et al ²⁰ and Curtis et al ²¹
98	considered time lapsetemporal relations between laryngeal events and UESO among patients with
99	dysphagia and patients with Parkinson's diseases but neither discovered itstheir association to
100	aspiration. Although various temporal measures of UESO and LVC have been examined in the
101	literature, there is no consistent conclusion on which latencies or sequential relations between these
102	events are the most influential and to what extent they influence swallowing safety.
103	Our overarching aim in this line of research is to automate and objectify some aspects of human
104	judgment of VFSS study observations, particularly events that are not commonly measured
105	objectively, into the domain of objective data that clinicians can use in analyzing swallowing function.
106	Consequently, the present study sought to estimate the risk of penetration or aspiration in patients
107	suspected of having dysphagia based on the temporal variables (i.e., initiation, termination, duration,

108 and relative time lapse of UESO and LVC) extracted from videofluoroscopic image sequence analyses. 109 The This is the first research we are aware of in which the duration of pharyngeal swallow segments 110 was used as a temporal factor to normalize the variables- across different swallows. Our hypothesis is that these raw or normalized temporal variables of UESO and LVC are associated with aspiration or 111 112 penetration. We aimed to determine the most significant correlates and assessof airway protection 113 impairments and quantify how the risk of airway invasion changes as a function of these attributes 114 via a(e.g., how do odds of aspiration change for each increment of temporal event latency?) via a 115 novel repeated-measure multivariable model, into which we further integrated patient 116 demographics and bolus conditions.

117 Materials and Methods

118 Data Collection

119 The protocol of this study was approved by the Institutional Review Board of the University of 120 Pittsburgh. All participants provided written informed consent. Patients with suspected dysphagia 121 referred for a VFSS at the University of Pittsburgh Medical Center Presbyterian University Hospital 122 (Pittsburgh, PA) were recruited. Each patient underwent VFSS conducted by a speech language 123 pathologist who determined the bolus size, bolus consistency, and swallowing maneuver according to patients' conditions under standard clinical protocol. Only swallows with thin liquid boluses 124 125 (Varibar thin, Bracco Diagnostics, Inc., < 5 cPs viscosity) were considered in the present analysis. 126 Boluses were either self-administered by patients via a cup or a straw for uncued swallows or 127 administered by a clinician using a spoon for cued swallows. 128 During the VFSS examination, patients were positioned laterally to a standard x-ray machine (Ultimax 129 system, Toshiba, Tustin, CA) at 30 pulses per second with their head in a neutral position. The video 130 stream was captured by AccuStream Express HD (Foresight Imaging, Chelmsford, MA) at a sampling 131 frequency of 30 frames per second.

132 VFSS Image Analysis

133	The dataset of this study was accrued during an ongoing larger investigation of surface pharyngeal
134	electronic sensors in characterizing swallow physiology. ²² Data from the sensors were not a
135	component of the present study. All video clips were preliminarily segmented into individual
136	swallowing events. The swallow onset (or initiation of the pharyngeal phase) was defined as when
137	the head of bolus reached the posterior ramus of the mandible, and the swallow offset was defined
138	as when the hyoid bone returned to the lowest position and the bolus has cleared from pharynx. This
139	duration has historically been defined as pharyngeal transit duration. ²³ The UES region is considered
140	approximately the height of the third cervical vertebral body inferiorly from the top edge of tracheal
141	column. ²⁴ The timing measurements of UESO and LVC were marked for each swallow according to
142	the following criteria:
143	• UESO onset : The time of the first frame in which air or barium contrast is observed in the
144	UES region. ²⁵
145	• UESO offset : The time of the first frame in which air or barium contrast is completely cleared
146	from the UES region. ²⁴
147	• LVC: The time of the first frame in which air space is no longer visible in the laryngeal
148	vestibule (between the arytenoids and epiglottic base). ²⁶
149	• Laryngeal vestibule reopening (LVO): The time of the first frame of obvious air space
150	reappearance within the laryngeal vestibule. ²⁶
151	All temporal and clinical measurements (i.e., PAS) were performed by trained judges who were
152	blinded to patients' demographics and diagnoses. Reliability of judges was established a priori and
153	was maintained on an ongoing basis with excellent intra- and inter-rater reliability (> 0.99 intraclass
154	correlation coefficients) on a randomly selected 10% of the swallows to avoid judgment drifts.

155	A set of	temporal variables were calculated using the previously described timing measurements to
156	explore	the timing of UESO and LVC events. Previous studies employed the onset of the swallow as
157	an ancł	nor to calculate the onset of UESO ²⁷ and the initiation of LVC ^{14,20,21} (or bolus dwell time ²⁸).
158	Similarl	y, we computed the latencies between the swallow onset and each component event
159	(closing	opening of UES and laryngeal vestibule). Additional variables were calculated to describe
160	their du	arations and temporal relations. These variables were either represented in seconds, or by the
161	ratio of	the time interval to the swallow duration, which normalized the timing events to the
162	individu	uals' swallows:
163	1.	Swallow/pharyngeal transit duration (s): The time difference between swallow onset and
164		swallow offset.
165	2.	UESO-latency (s): The time difference between swallow onset and UESO onset.
166	3.	UESC-latency (s): The time difference between swallow onset and UESO offset.
167	4.	LVC-latency (s): The time difference between swallow onset and LVC.
168	5.	LVO-latency (s): The time difference between swallow onset and LVO.
169	6.	UESO-normalized-ratio (% swallow duration): The ratio between UESO-latency and swallow
170		duration.
171	7.	UESC-normalized-ratio (% swallow duration): The ratio between UESC-latency and swallow
172		duration.
173	8.	LVC-normalized-ratio (% swallow duration): The ratio between LVC-latency and swallow
174		duration.
175	9.	LVO-normalized-ratio (% swallow duration): The ratio between LVO-latency and swallow
176		duration.
177	10.	UESO-duration (s): The time difference between UESO latency and UESC latency.

- 178 11. LVC-duration (s): The time difference between LVC latency and LVO latency.
- 179 12. UESO-duration-normalized-ratio (% swallow duration): The ratio between UESO-duration and
 180 swallow duration.
- 181 13. LVC-duration-normalized-ratio (% swallow duration): The ratio between LVC-duration and
 182 swallow duration.
- 183 14. UESO-LVC-duration-normalized-ratio (% swallow duration): The time difference between
 184 UESO-latency and LVC-latency divided by swallow duration.
- 185 15. LVO-UESC-duration-normalized-ratio (% swallow duration): The time difference between
- 186 LVO-latency and UESC-latency divided by swallow duration.

187 Statistical Analysis

188 The presence of penetration or aspiration was a dichotomous variable based on PAS ratings. PAS 189 scores of 1-2 represented safe swallows, while PAS \geq 3 corresponded to penetration or aspiration 190 (unsafe swallows).⁷ We collected more than one swallow for each participant so correlations may exist between repeated swallow measurements from the same patients²⁹; consequently, a 191 192 generalized estimating equation (GEE) model with a binomial distribution, logit link function, and 193 exchangeable working correlation matrix was used to associate each of the 15 temporal variables 194 with penetration or aspiration. To obtain a parsimonious multivariable model, we used a forward 195 selection strategy of the 15 temporal variables with and without forcing in the demographics and 196 bolus characteristics as independent variables. Previous literature has reported an age effect on 197 sequential swallow events, citing significant differences in event sequencing and latencies between healthy younger (<45 years) and older (>65 years) subjects.^{12,30} However, most of our patients were 198 199 older than 60 years and the correlation between temporal variables and age was negligible; thus, age 200 was treated as a continuous variable. All statistical analyses were performed using SAS® version 9.4 201 (SAS Institute, Inc., Cary, North Carolina).

202 **Results**

We analyzed 408 swallows from 99 patients whose demographics and bolus characteristics are presented in Table 1. Swallows grouped by PAS scores are shown in Table 2. <u>AThe most</u> common sequential pattern of UESO and LVC<u>, which represented 76% of our study</u>, is shown in Figure 1 (it should be noted that UESO onset can occur before or after LVC, and UES closure can happen before or after laryngeal reopening²⁶).

208 The averaged values of temporal variables and the results of one-at-a-time statistical analysis with 209 and without demographics and bolus conditions adjustment are shown in Table 3. In both 210 unadjusted and adjusted models, swallows with unsafe airway protection (i.e., PAS \geq 3) had 211 significantly later occurrences of LVC, LVO, LVC-normalized-ratio, and LVO-normalized-ratio as 212 compared to safe swallows (i.e., PAS 1-2). In addition, a longer time lapse in the UESO-LVC-duration-213 normalized-ratio contributed to an increased risk of airway invasion. The latency of UESO, duration of 214 LVC, and the LVO-UESC-duration-normalized-ratio were not significantly associated with penetration 215 or aspiration.

The parsimonious multivariable model identified included only laryngeal kinematics: LVC-latency and
 LVO-normalized-ratio as shown in Table 4. Delayed LVO in proportion to the swallow duration and
 delayed LVC latency resulted in increased airway invasion risk.

219 Table 5 presents the associations when using the combination of temporal variables with patients' 220 ages, sex, and mode of bolus administration (e.g., 3mL by spoon; patient self-selected volume by cup, 221 straw). The forward selection on the adjusted set of variables resulted in the same set of kinematic 222 variables (i.e., LVO-ratio and LVC-frame) as the unadjusted model with consistent estimates of 223 coefficients. According to the adjusted model, delayed LVC by 0.1s results in a 17.19% increase in the 224 odds of airway invasion. Delayed LVO by 1% of the swallow duration (average 0.018s) would cause 225 the participant to have 2.68% more odds to penetrate or aspirate. In consequence, 1s delay on LVC 226 latency or late LVO ratio by 55.7% of the swallow duration (average 1s) would substantially magnify

95% CI 1.96–9.71) times respectively. Results indicated that each 10 years of age will increase
patients' odds of penetration or aspiration by 16.07%, and females are less likely to experience
unsafe swallows, but this effect is these effects are not statistically significant. Female and However,
self-feeding by cup are less likely to experience unsafe swallows is significantly associated with lower
risk of airway invasion.

these odds by 4.9 (odds ratio [OR] 4.89; 95% confidence interval [CI] 1.94–12.29) or 4.4 (OR 4.37;

233 Discussion

227

234 In this study, we sought to determine whether the kinematic timings associated with laryngeal and 235 UES kinematics are predictive of penetration or aspiration among patients with suspected dysphagia. 236 We specifically examined the singular and coordinated temporal variables of UESO and LVC, for 237 which the sequential characteristics have not been fully established. A temporal normalization based 238 on the duration of swallow segments was applied to align temporal swallowing patterns across 239 different patients to explore new analytics methods of identifying airway protection risk when there 240 are no sentinel events during the VFSS (i.e., moderate impairment, when airway invasion risk is 241 neither absent nor severe, and clinical risk estimations are more subjective). 242 The LVC latency was found to be different between safe and unsafe swallows, which is consistent with previous work on stroke patients³¹; however, the delayed latency of LVO was also significantly 243 244 associated with penetration or aspiration, which has rarely been considered as a predictor. This 245 finding may suggest that the timing and pattern of laryngeal reopening, but not necessarily the 246 duration of LVC, are critical for airway protection. Counterintuitively, delayed laryngeal reopening did 247 not improve airway protection in our cohort; this may be due changes in the duration and timing of 248 swallow apnea among patients with respiratory illnesses and a subsequently higher risk of aspiration or penetration.^{32,33} 249

According to our analyses, <u>UES-related latencies</u><u>UESO latency</u> and <u>UESO</u> durations were not<u>solv</u>
 <u>found</u> associated with penetration or aspiration<u>in adjusted analyses and were not selected in our</u>

252 final prediction models; however, reduced UESO duration and delayed initiation of UESO have shown to be influential determinants of aspiration.^{20,28} The discrepancy between existing literature and our 253 254 findings may be the result of variations in the definitions of disordered groups. Previous studies placed patients with at least one abnormal swallow, defined as PAS $\geq \frac{3}{2}$ or PAS $\geq \frac{6}{6}$, into 255 256 disordered/aspirated swallow groups. Conversely, we analyzed single swallow events, instead of 257 placing patients into categories, and considered a PAS \geq 3 an unsafe swallow sample. We chose to 258 analyze single swallow events because a) healthy individuals may have more than one abnormal swallow according to PAS on a VFSS,³⁴ but we would not place them in a disordered swallow group 259 260 and b) patients who typically aspirate may not during the short window of time of the VFSS, so it would not be accurate to place them in a "normal swallow" group.^{7,30} 261 262 We also found that the shorter time lapse between LVC and UESO onset (i.e., UESO-LVC-duration-263 normalized-ratio) was significantly associated with penetration or aspiration, suggesting that late 264 laryngeal closure prior to UESO and even after UESO may lead to swallowed material entering the 265 airway and may cause incomplete bolus clearance. This finding was not observed previously, because Choi et al²⁰ defined the region of UES differentlyby the narrowest part of the upper esophagus 266 267 between C4 and C6 which is different from our study and chose intervals between the UESO and 268 laryngeal elevation instead of laryngeal closure. Furthermore, Curtis et al²¹ specifically analyzed 269 patients with Parkinson's disease and dysphagia while our study considered participants with various 270 medical conditions. However, this variable is excluded from the final multivariate models which may 271 be due to its collinearity with LVC latencies which are better predictors of aspiration or penetration. 272 Although the duration of a swallow segment was not correlated with airway invasion, the smaller 273 ratio of the LVC and LVO latencies to swallow duration were associated with increased risk. In 274 addition, the final models suggested that the LVO normalized latency was a better predictor than the 275 raw measurement of the LVO, indicating that with same latencies of laryngeal vestibule events, 276 swallows with shorter duration are more likely to be unsafe.

277	OurDespite of the fact that age was not significantly associated to penetration or aspiration, our fina
278	model -suggested that older people probably are at greater risk for penetration or aspiration as
279	demonstrated in previous studies. ^{35,36} The results also indicated that although the difference
280	between men and women was not significant, females appeared less likely to aspirate or penetrate-;
281	this finding may be due to the imbalance of gender distribution in our dataset; this finding may be
282	due to the imbalance of gender distribution in our dataset. Boluses administrated by clinicians using
283	spoons were more likely to cause airway invasion than self-administrated boluses by cup, possibly
284	because aspiration is more affected by cueing and administering conditions than bolus volume. ^{21,37}
285	We believe our findings are essential to add objectivity and accuracy to swallowing assessment.
286	Objective measurements of laryngeal-pharyngeal kinematics provide information about the
287	functional integrity of structures responsible for airway protection. In neurodegenerative diseases,
288	for instance, serial quantification of subtle kinematic indicators of airway protection risk may not
289	manifest as frank aspiration during VFSS studies but are predictive of eventual clinically significant
290	decompensation in airway protection. However, the reality of clinical work combined with the need
291	for clinicians to manually analyze each swallow using existing time-consuming methods, leads
292	clinicians to forgo objective measurements to inform their clinical impressions out of clinical
293	expediency, and form subjective inferences about predicted risk and outcomes (e.g., aspiration)
294	when they do not overtly occur during a VFSS study. Recent technological advancements enable
295	non-invasive detection of swallowing kinematic events solely based on swallowing sounds and
296	vibrations (i.e., high resolution cervical auscultation). ⁴⁰⁻⁴⁵ Other computer vision and artificial
297	intelligence techniques were applied to VFSS images for automatic frame-by-frame analyses of
298	hyoid ⁴⁹ and laryngeal ⁵⁰ kinematics. The laryngeal measurements automatically extracted by these
299	methods could be incorporated to our temporal understanding of laryngeal kinematics associated
300	with swallowing efficiency and safety to provide clinicians objective estimation of the risk of
301	penetration or aspiration. Such automated generation and analysis of objective data followed by

clinician confirmation and clinical interpretation, as is commonly performed with electrocardiograms
 and some imaging studies, would provide baseline and ongoing information about progression of
 dysphagia, efficacy of treatment, and enable clinicians to objectively predict actual present and
 future risks associated with oropharyngeal dysphagia rather than forming a subjective judgment that
 can lead to either over- or under-treatment.
 There are several limitations of current study. Our dataset consists of only thin liquid boluses; thus,
 the developed prediction model does not explain how patients' risk of aspiration would be affected

309 by boluses of different consistencies as delineated in the International Dysphagia Diet

310 Standardization Initiative.

311 In addition to temporal measurements considered in our study, other physiological factors that

312 contribute to airway protection were missing to provide a full analysis of swallowing safety and

efficiency. For example, reduced UESO may cause post-swallow residue, which is an independent

314 predictor of penetration or aspiration post-swallow.³⁸ Future studies should investigate the

association between the timing of UESO with residue-rating methods such as the Modified Barium

316 Study Impairment Profile.^{28,39}

317 Furthermore, the distribution of PAS scores is naturally skewed and swallows with higher aspiration

318 or penetration risk are in minority. This imbalance distribution might affect the classification

319 performance of our models. Data sampling and augmentation techniques may be used for future

320 <u>studies.</u>

321 Recent technological advancements enable non-invasive detection of swallowing kinematic events

322 solely based on swallowing sounds and vibrations (i.e., high resolution cervical auscultation).^{40.45}

323 Hence, further understanding of how these temporal measurements reflect swallowing impairment

324 may add valuable diagnostic information to ongoing research in this field.

325	In this study, we normalized kinematic timings using swallow duration. This conversion allowed us to
326	conduct a more general analysis of swallowing motor pattern among various patients and different
327	bolus conditions. The validity of such normalization is an avenue for further investigation.

328 **Conclusion**

- 329 This study demonstrated that the delayed latency of LVC and delayed LVO proportional to swallow
- 330 segment duration reflect is associated with the risk of penetration or aspiration risk of thin liquid
- 331 swallows. The model is based on objective temporal measurements, patient demographics, and
- 332 bolus delivery methods estimated to estimate the patients' patient's risk of airway invasion. These
- 333 findings provide supportive information The underlying association of laryngeal kinematics and
- <u>penetration or aspiration would provide justification to perform objective temporal VFSS analyses</u>
- 335 when diagnosinga) the delay of kinematics is too short to be perceived by human eye, b) no apparent
- 336 <u>sign of</u> swallowing disorders and further improvement of the model would impairment can be
- 337 observed during a 10-20 swallows VFSS examination. With recent advancement in non-invasive
- 338 <u>kinematic detection and computer-assisted VFSS analyses, modest delay of laryngeal kinematics can</u>
- 339 <u>be captured, and therefore our findings would</u> add more objectivity and accuracy to <u>automated</u>
- 340 swallowing assessment and dysphagia management.

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Figure Legends

FIGURE 1. Upper esophageal sphincter opening (UESO), and laryngeal vestibule closure (LVC) events occur in sequential manner based on videofluoroscopic analysis.