

# Nonnative Phonetic Category Training in Varying Acoustic Environments

Eleni Vlahou<sup>1,2</sup>, Aaron Seitz<sup>2</sup> & Norbert Kopčo<sup>1</sup>

<sup>1</sup>Institute of Computer Science, P. J. Šafárik University, Košice, Slovakia, <sup>2</sup>Department of Psychology, University of California, Riverside

## 1. BACKGROUND AND MOTIVATION

Past research has shown that reverberation has a pronounced detrimental effect on speech intelligibility (e.g., Nábělek & Donahue, 1984), but no previous studies investigated how it affects the **acquisition of novel phonetic categories**. In a previous study (Vlahou et al., 2014; see Methods) we used virtual acoustics to train listeners on a difficult nonnative phonetic distinction. During training, stimuli were presented to different subject groups a) in a **single (anechoic) room** or b) in **multiple (anechoic and two reverberant) rooms**. Learning effects were assessed by comparing **pre-test vs. post-test** performance of each group. **Figure 1** summarizes our main findings:

For **explicit** training:

- No difference between groups trained in multiple or in a single environment (**Fig. 1A vs. 1B**).
- Large improvement for trained voice and trained rooms (shaded areas, **Fig. 1A-B**).
- Strong generalization to untrained rooms (unshaded areas, **Fig. 1A-B**) and weaker generalization to an untrained voice (**Fig. 1E-F**).

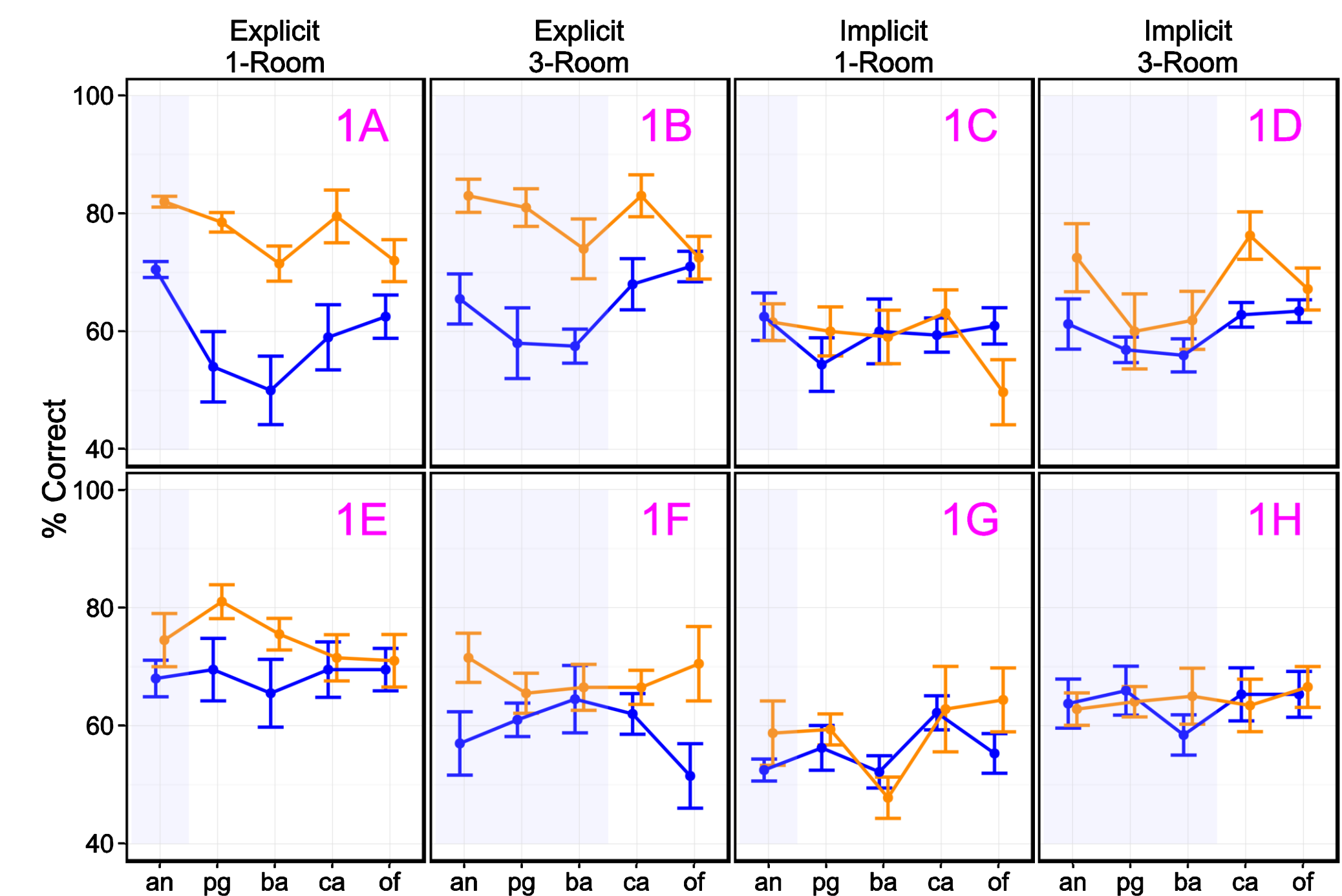
For **implicit** training:

- Effective for participants trained in **multiple rooms** but not in a **single anechoic environment** (**Fig. 1C vs. 1D**). This difference between the two groups might have been caused by lack of exposure to (a) **reverberation** or, (b), **room-to-room variation** during training for the implicit-1-Room group.
- For the **3-Room group** (**Fig. 1D**), learning observed for the anechoic environment (an) but little improvement shown for the trained rooms (pg, ba). The pg and ba improvement was less than or equal to the two untrained rooms (ca and of). However, a possible confound was the **fixed order** of rooms during testing, favoring rooms presented later (ca: 3<sup>rd</sup>, an: 4<sup>th</sup>, of: 5<sup>th</sup>) compared to rooms presented earlier (pg: 1<sup>st</sup>, ba: 2<sup>nd</sup>).
- No generalization to an untrained voice for either 1- or 3-Room groups (**Fig. 1G-H**).

**Main questions in current study:**

Here, we attempted to separate the alternative explanations for the effects observed in the previous study. Different groups of participants were trained implicitly:

- In a **single reverberant** environment. If exposure to **reverberation** during training facilitates implicit learning, then this group should show improved posttest performance. Alternatively, if **room variation** is a critical factor, then no learning should be observed.
- In **multiple rooms**, but with **random** room order during testing, thereby removing the potential confound of fixed room order.

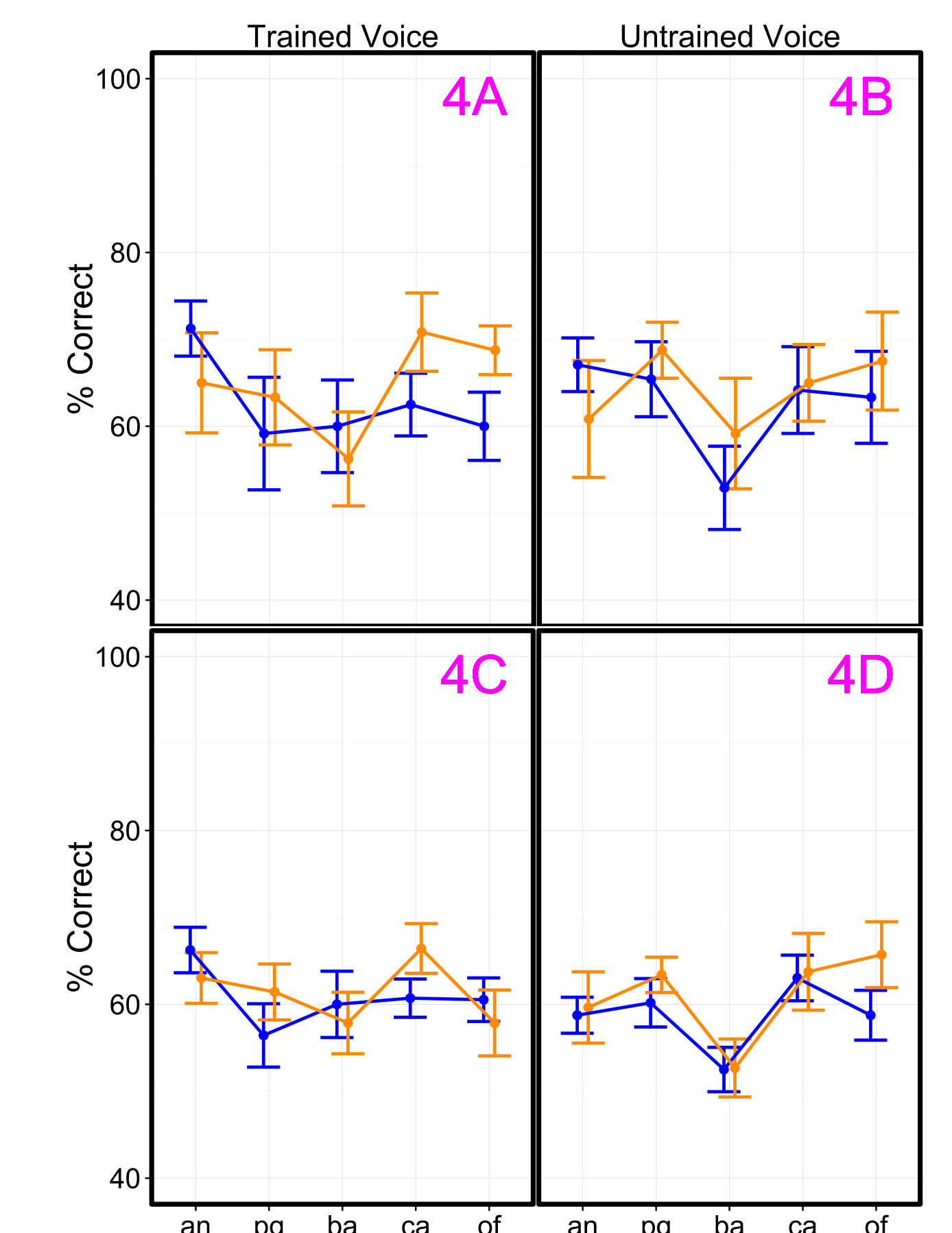


**Figure 1.** Mean pre-test and post-test performance of each group as a function of room, separately for the trained and untrained voice.

## 4. IMPLICIT TRAINING IN A SINGLE ENVIRONMENT

**Figure 4.** Mean pre-test and post-test performance of the **implicit 1-Room** group, for participants trained with a single reverberant environment (**4A-B**) and for all participants, averaged over single reverberant and anechoic room training (**4C-D**), as a function of room, separately for the trained and untrained voice.

- No evidence of improvement for participants trained in a single reverberant environment in either the trained or untrained voice (compare **Fig. 4A, 4B** to **Fig. 1C, 1G**).
- Averaged data over all participants trained implicitly in a single **anechoic** or **reverberant** room (**4C-D**) show **no pre-test / post-test improvement**.



No evidence for implicit learning without room variation during training.

## 2. METHODS

**Subjects and experimental conditions:** Two groups (5 subjects each) were trained **explicitly** (**Fig. 1A-B, E-F**) with sounds presented in **anechoic (1-Room)** or in an **anechoic and 2 reverberant environments (3-Room)**. Fifteen participants were trained **implicitly** in **3 rooms**. During testing, rooms were presented in a **random** (7 people; current study) or **fixed** order (8 people, **Fig. 1D, 1H**; 1<sup>st</sup>: pg, 2<sup>nd</sup>: ba, 3<sup>rd</sup>: ca, 4<sup>th</sup>: an, 5<sup>th</sup>: of, Vlahou et al., 2014). 14 participants were trained **implicitly** in **1 room** (an: 8, **Fig. 1C, 1G**; ba: 2, pg: 4). 13 more subjects were tested and re-tested with the same material over a period of 10 days, without training in between (**no-training control group**).

**Phonetic stimuli and simulated room reverberation:** We used Hindi **dental-retroflex CV syllables** (Werker & Tees, 1984) from two native speakers. Each syllable was convolved with Binaural Room Impulse Responses (BRIRs) of 4 different rooms, termed “ping-pong” (pg), “bathroom” (ba), “cafeteria” (ca), “office” (of) and an anechoic environment (an; see Vlahou et al., 2014).

**Training:** One of the two Hindi speakers was used during training (“**Trained Voice**”), counterbalanced across participants) in 4 daily sessions, 45 min/session. In each session:

- 1-Room groups were trained with sounds presented in one room (anechoic, bathroom or ping-pong, 600 trials/session).
- 3-Room groups were trained with sounds presented in anechoic space and two reverberant environments (“bathroom” (ba) and “ping-pong” (pg), 200 trials/room in 40-trial randomly interspersed blocks).

Explicit training consisted of a 1I-2AFC test. Feedback was provided after each response. The implicit training paradigm is illustrated in **Fig. 2**.



**Figure 2.** Schematic representation of the **implicit training paradigm**. Implicit training employed a videogame which promoted stimulus-reward contingencies (Seitz & Watanabe, 2005).

In each trial, a character appeared on the screen and produced two identical Hindi sounds from one category (“**T1**”; retroflex for half participants). If the player managed to shoot the character, it produced two identical sounds from the other category (“**T2**”). As the player got better, characters were moving faster.

**Testing:**

- Before and after training, all groups were tested with sounds coming from **both** Hindi voices in **all 5 different** simulated rooms.
- The “trained voice” was presented first, followed by the “untrained voice”

**Analyses:** Proportion (percentage) correct responses were arcsine-square root transformed and entered into ANOVA analyses. In all figures, shaded areas show rooms used during training and error bars are SEMs, corrected for within-subject designs.

## 3. IMPLICIT TRAINING IN MULTIPLE ROOMS

**Figure 3.** Mean pre-test and post-test performance of the **implicit-3-Room group** for participants tested in **random** room order (**3A-B**), for all participants, averaged over random and fixed room order (**3C-D**), and the **control** group (**3E-F**), as a function of room, separately for the trained and untrained voice (for the control group, for Hindi voice presented 1<sup>st</sup> and 2<sup>nd</sup>).

Data from participants tested in random room order (**3A-B**):

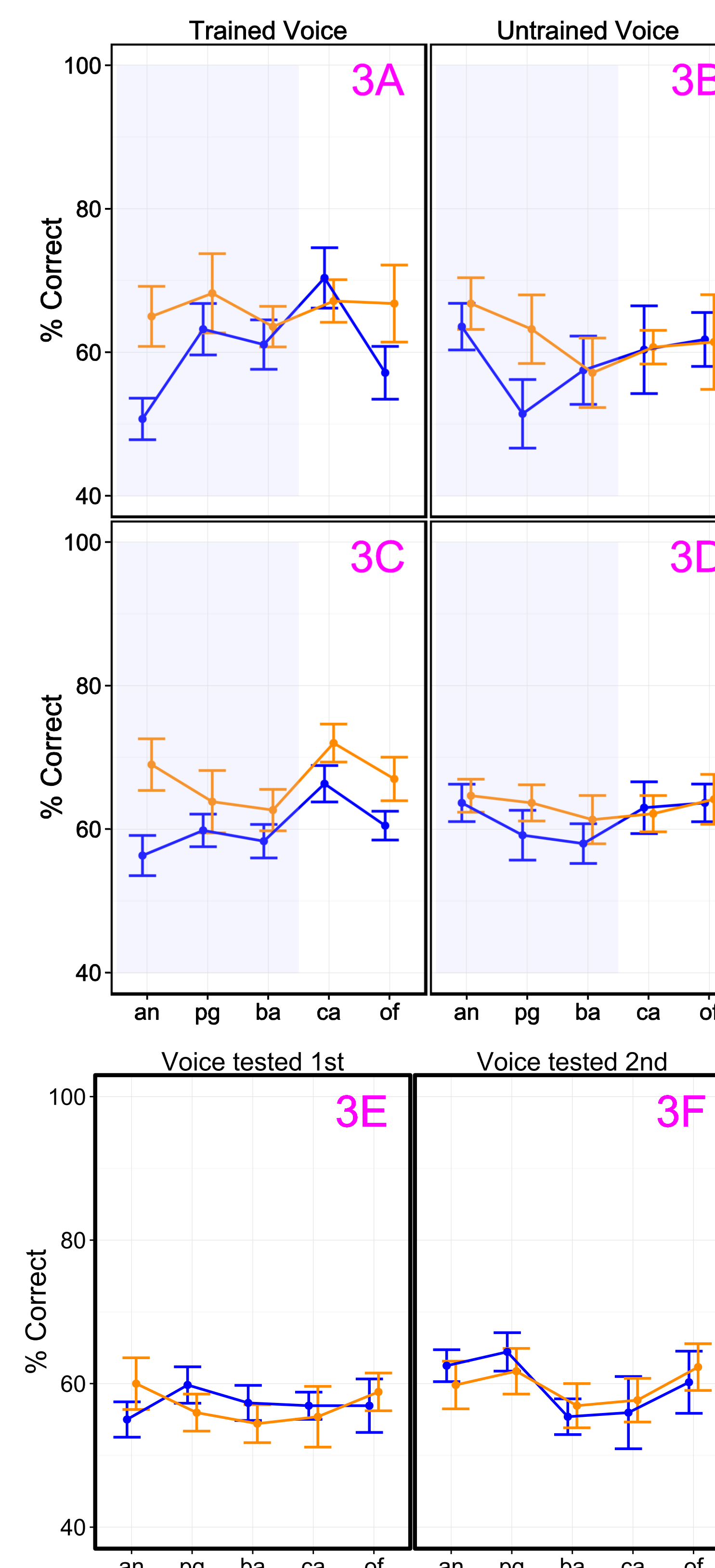
- Support previous findings of pre-post test **improvement** for speech stimuli coming from the **trained voice** (compare **Fig. 3A** to **Fig. 1D**).
- Do not confirm larger gains for the untrained reverberant rooms compared to the two trained reverberant rooms (compare **Fig. 3A** to **Fig. 1D**).
- Confirm previous findings of **no learning** for the **untrained voice** (compare **Fig. 3B** to **Fig. 1H**).

Averaged data over all participants trained implicitly in multiple rooms (**3C-D**) show:

- **Learning** for the implicit-3-room group for sounds coming from the **trained voice** (**3C-D**; Interaction time x voice,  $F_{(1,14)} = 6.52$ ,  $p = .0229$ ).
- Good **generalization** to untrained rooms coming from the trained voice (**3C**). The anechoic environment tends to show larger improvement.
- **No (or little) generalization** of learning to the **untrained voice** (**3D**).

**No learning** for the **control** group (**3E-F**) from pre-test to post-test, for either room/voice tested 1<sup>st</sup> or 2<sup>nd</sup>.

Implicit training is **effective** when speech sounds are presented in **multiple rooms**. Learning generalizes to untrained reverberant rooms when the stimuli come from the **trained voice**. However, **no generalization** is observed for speech coming from an **untrained voice**.



## 5. CONCLUSIONS

- Implicit training in **varying** acoustic environments is effective whereas implicit training in a **single** room is not. For the **3-Room** group, significant improvement is observed for speech sounds coming from the **trained** voice, for both **trained** and **untrained** acoustic environments (**Fig. 3C**). For the **1-Room** group, no pre-test / post-test improvement is observed, independent of whether participants are trained in an **anechoic** (**Fig. 1C**) or **reverberant** environment (bathroom or ping-pong; **Fig. 4A**).
- This finding suggests that **room variation** during training is likely to be important for spontaneous phonetic learning. In line with previous studies (Lim & Holt, 2011), we show that increased variability along a **non-informative** dimension (room acoustics) shifts perceptual categorization towards more reliable cues, namely the invariant phonetic features that are robust against the variations that one experiences in different rooms. This leads to improved categorization performance for speech in reverberation but also to substantial improvement in the anechoic environment.
- This interpretation is consistent with the finding of **no generalization** of learning to an **untrained voice** for either 3- or 1-Room training groups (**Figs. 3D & 4D**). Since only one Hindi voice was used during training, participants were not able to ignore variations due to voice characteristics, possibly forming overspecified perceptual categories that included phonetically irrelevant talker-specific details.
- In sum, our results suggest that exposure to diverse room acoustics during the acquisition of novel phonetic categories facilitates nonnative phonetic learning.

## REFERENCES

- Nábělek, A. K. & Donahue, A. M. (1984). Perception of consonants in reverberation by native and nonnative listeners. *Journal of the Acoustical Society of America*, 75, 632–634.
- Lim, S.-J. & Holt, L. L. (2011). Learning foreign sounds in an alien world: Videogame training improves non-native speech categorization. *Cognitive Science*, 35, 1390–1405.
- Seitz, A. R. & Watanabe, T. (2005). A unified model for perceptual learning. *Trends in Cognitive Sciences*, 9, 329–334.
- Vlahou, E., Seitz, A. & Kopčo, N. (2014). ARO Abstract #806.
- Werker, J. F. & Tees, R. C. (1984). Phonemic and phonetic factors in adult cross-language speech perception. *Journal of the Acoustical Society of America*, 75, 1866–1878.

## ACKNOWLEDGMENTS

UCR research assistants: Ruchi Modi, Arjie Florentino, Rukayat Salaam, Surangi Jayasinghe & Catherine Nolasco.

Work supported by

- Slovak Research and Development Agency, SRDA, contract No. APVV-0452-12.
- TECHNICOM, ITMS R01DC009477, grant of the Research & Development Programme funded by the ESF of the European Union
- NSF-BCS-1057625.