# **Progression in infants' vowel space:**

An analysis of deaf and hearing infants' sounds

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## ABSTRACT

An interesting but so far neglected topic in the development of infant sound production is the hypothesized progression toward adult vowel quality. Likely, this process is quite different for normally hearing babies and for deaf babies. A band filtering analysis method is used to measure the spectral envelope in these high-pitched infants' sounds automatically. The audio material of 5 hearing and 5 deaf babies is collected monthly between the 5<sup>th</sup> and 17<sup>th</sup> month, with an additional recording at 24 months. From each recording 50 randomly chosen utterances are digitized. In a PRAAT script criteria are set with regard to sound quality and  $F_0$ . The utterances are then analyzed resulting in spectral envelopes wherein the dependence on  $F_0$  is minimized. Via a PCA a 2 - dimensional reference vowel space of all the hearing children at 24 months is determined in which individual data are projected. Preliminary results: differences are found when comparing the 5<sup>th</sup> and the 24<sup>th</sup> months of two subjects, one hearing and one deaf child.

## 1. INTRODUCTION

Since the 1980s infant vocalizations are considered to be precursors of later speech [7], but the developmental process is not yet unraveled. This is at least partly due to the complexity of infant vocal behavior. The usual choice in research is to label the vocalizations perceptively, but already for the 'simple' utterances of the first 6 months, coding shows a low inter-listener-reliability [8]. Of course, the reliability ratings are related to the simplicity or the complexity of the coding system [4]. Serkane, Schwartz, Boë, Davis & Matyear [11] suggest two mechanisms for speech development: "exploration of the vocal tract sensori-motor abilities, and the imitation (overt stimulation) of caretakers' language sounds." (p. 45). In earlier work [5, 6] we found a predictable, possibly universal development with regard to coordination of respiration, phonation and articulatory movements in infancy. In that sensori-motor system the focus was on movements and not so much on sound description itself. This articulatory definition of (canonical) babbling became an important tool in diagnosis of deafness: deaf infants have a delayed babbling onset [4, 9]. This finding is congruent to the second mechanism proposed by Serkane et al. [11]. Deaf infants lack the possibility to imitate the adult acoustic examples.

In the present study we investigate unlabeled deaf and

hearing infant vocalizations acoustically in an automatic way. We assume that an anatomical change in the oral cavity is related to the use of that space as a resonator in sound production. At the same time, the use of the oral space very likely is driven perceptually as well. Thus, deaf and hearing babies will differ, possibly right from an early onset and certainly when they grow older. Yet, we have to reckon with enormous variability in developmental processes per child and over the deaf and normally hearing children. This phenomenon clearly complicates diagnosis.

#### 2. PHONETIC DATA

The participants in our study are 5 healthy born hearing boys (NH) matched to 5 boys born deaf (HI). Matching criteria were e.g. sex, birth order, living in and originating from the same geographical region [e.g. 3]. Specific information on the hearing status of the HI children (and communication method) is given in Table 1. The parents made monthly audio recordings of at least 30 minutes mother-infant interaction in naturalistic home situations, using the audio tracks of a video recorder with CD-quality sound recording. For this study we selected the recordings from the 5<sup>th</sup> to the 17<sup>th</sup> month, with an additional recording when the children were 2 years of age. In each recording 10 minutes were selected of ongoing vocal mother-infant interaction. Within that selection 50 utterances are randomly selected with speech motor milestones in mind [6]. So, the vocalizations were produced mostly during egressive respiration, with (interrupted) phonation, with or without one or more articulatory movements. Some overall statistical data are available for the first and the second year of life, respectively [1, 2, 4]. In the first year of life the mean number of utterances differed

Subject	Hearing	Loss with	Diagnosis	Hearing
/Lang.	loss best	hearing	at age	aid from
Ũ	ear (dB)	aid (dB)	(mnth)	age (mnth)
HI1/O	97	55	1.5	2.0
HI2/TC	93	55	3.0	3.5
HI3/O,TC	110	65	4.0	4.5
HI4/DSL	>120	not tested	0.5	no aid
HI5/DSL	120	not tested	3.0	6.5

**Table 1**: Loss characteristics of the deaf children (HI). Language: O = Oral method, TC = Total Communication, DSL = Dutch Sign Language. significantly for the NH and the HI infants; the latter produced more vocalizations than the normally hearing infants. With regard to the mean utterance duration in the first year, a significant difference between the two groups is found as well. This effect is mainly due to the long utterance durations in month 3.5 for the NH infants. For the recordings in the second year of life the mean number of spoken utterances per recording is not significantly different for the two groups of children. The mean duration however is significantly longer for the HI children than for the NH children.

The database used in this study thus consists of 10 children x 14 monthly recordings x 50 utterances = 7000 utterances.

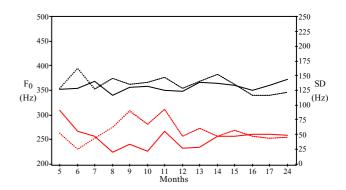
## 3. ACOUSTIC ANALYSIS

Estimating formants objectively in high-pitched sounds is notoriously difficult [e.g. 13, 12]. The vocal tract functions as a filter for the source sound. High pitch causes undersampling of the spectral envelope and source and filter functions, strictly spoken, cannot be separated. Many procedures have been developed, of which the LPC inverse filtering method is accepted as a reasonable compromise. Researchers usually select the vowels or syllable-like sounds perceptively and label them phonologically, which permits them to decide about the order of LPC analysis and the most probable formant positions. This procedure however biases the formant detection subjectively, and wrongly chosen parameters could easily produce very misleading results [13, 12].

In order to be able to compare vocalizations of 5-month-old infants (born deaf as well as normally hearing) all the way up to the age of two, Wempe [13] has developed a pitch-related band filter analysis via scripts in the PRAAT-program [e.g. 14].

First, we analyzed the distribution of the pitch ( $F_0$ ) in all voiced utterances. The inter-child variability in the utterances over the recordings was considerable. In all children the range is very large (about 100-800 Hz). Per child and per recording the mean  $F_0$  varied as well, but remained mainly below 400 Hz. In this manner we decided about the bandwidth of the filter (see below). In Figure 1 the overall mean and s.d. are given for the mean  $F_0$  per recording of the 5 HI and the 5 NH children.

Secondly, a script is written ultimately aiming at an estimation of a spectral representation of an utterance. The first module in that script divides each vocalization in 10 parts of equal duration, which permits distribution of measurement positions over the entire utterance, thus covering a possible articulatory change within that vocalization. Bandpass Filter Analysis, described below, is done in all 10 parts of each sound, theoretically resulting in maximally 500 measurements per month if all parts are voiced and meet the other criteria as well. The second module is concerned with sound quality: clipping and low-intensity, possibly representing consonantal parts of



**Figure 1**: Distribution of  $F_0$  in utterances per recording, drawn lines are used for the NH children, dotted for the HI. The left Y-axis gives frequencies for mean pitch, the right Y-axis for the s.d. values, given in red (lower graphs).

the vocalizations, are avoided (max.<-1dB and min.>-10 dB relative to the absolute peak level within the utterance).

The Bandpass Filter Analysis (BFA) is applied to those (maximally 10) parts of the utterance where  $F_0$  is below 425 Hz for at least 3 contiguous pitch frames. In the third module of the script one period is selected in each valid part of the sound. This period is recycled up to a duration of 0.1 second. This artificial sound is multiplied with a Gauss-window (10 Hz width) and pre-emphasis is used. Then a swept Gaussian bandpass filter analysis (step = effective BW/5, with an effective BW=1.1 x 425 Hz) is done. The choice of this filter bandwidth is a compromise between frequency resolution and  $F_0$  - ripple. Furthermore, an RMS level normalization to 0.3 Pa is applied to each measurement, which avoids energy variance caused by, sometimes big, differences in recording levels. An intensity contour can be plotted representing a bandfilter spectrum covering a range from 0 to 7 kHz. Linear rather than logarithmic spectra of each measurement are used for further analyses. The bin widths are set to 175 Hz resulting in 40 values per measurement. Ideally, per utterance 400 values are calculated (10 parts x 40 bins) and collected. Per child and per month a matrix is produced with the bin energies. Matrices thus represent the intensity in each of the 40 filters over the total number of measurements from a monthly recording ideally resulting in 10 parts \* 50 utterances = 500 values per frequency bin. The number of measurements per monthly recording is given in the matrix as well. In practice, the selection criteria limit this number to 38% on the average so that about 200 values per bin per monthly recording remain for further processing. The total number of values thus amounts to about 38% of 500 values \* 40 bins \* 14 months \* 10 children = 1.06 million. Each matrix represents a bandfilter spectrum covering a range from 0 - 7 kHz. In the spectra, maxima could be detected automatically, but this will not give consistent results either. That is why we choose the whole-spectrum approach and data reduction via PCA. Each bandfilter matrix then can be regarded as a point in a 40-dimensional space. By using the first two principal components the data are reduced and easily displayed.

The above scripts, subdivided in several modules, are applied to the digitized utterances of all10 children at all 14 time periods.

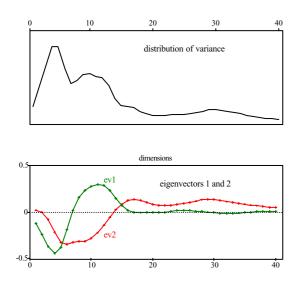
## 4. **RESULTS**

In order to compare deaf and hearing children in their development towards an adult vowel space, we constructed a 'reference plane'. The 40-dimension spectra of all utterances at 24 months of the 5 hearing children are merged into one table and reduced by means of a Principal Component Analysis (PCA). In figure 2 the overall distribution of variance is given. The weights of the first and second eigenvector are given as well. As can be seen from table 2, the first and second PC together explain 54.5 % of the variance. All 855 measurements of the 5 NH children are projected in a plane constructed by means of these first two PCs (see Figure 3).

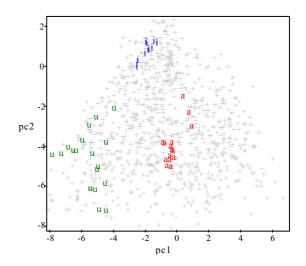
eigenvector 1	32.5 %	
eigenvector 2	22.0 %	
eigenvector 3	10.2 %	
eigenvector 4	9.3 %	
eigenvector 5	5.6 %	
eigenvector 6	4.6 %	

**Table 2**: Percentage variance explained by each of the first 6 vectors in a PCA over the variance-covariance matrix of all analyzable utterances of the 5 two-year-old NH children (see also Figure 2).

The first and the second eigenvectors are used to draw a plane in which all bin spectra are displayed as points. This PC1-PC2 plane is often taken as an analogue to the  $F_1$ - $F_2$  plane.

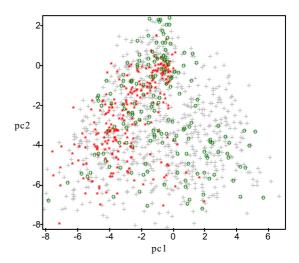


**Figure 2**: Graphs of the distribution of variance and the contribution of the first 2 eigenvectors after PCA of the first 2 eigenvectors after PCA of the values for the 5 NH children in the  $24^{\text{th}}$  month.

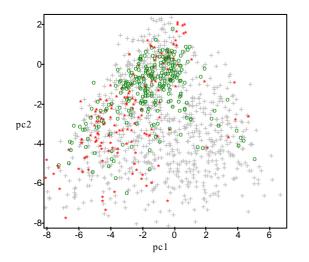


**Figure 3**: Normal reference vowel space for all analyzable utterances of the 5 normally hearing children (gray +). Labeled vowels from an adult female speaker are projected in this plane as well (/i/, /u/, and /a/).

In the above-described manner the distribution of points in Figure 3 can be considered as the vowel space of normally developing two-year-olds. However, the utterances were unlabeled and therefore we added some adult labeled vowels for reference as well. These labeled vowels originate from isolated words of a female speaker and were analyzed similarly to the procedure used for the utterances of the 10 children. As can be seen, the vowels are almost distributed like in an adult vowel formant space (although in a somewhat different direction), and they all fall within the children's space. This is congruent with growth models, and can be explained by considering the changing vocal tract qua size and shape in young children.



**Figure 4**: Reference plane with the utterances of a 5-month-old (red\*) and a 24-month-old (green o) NH child (subject NH2) projected into that plane.



**Figure 5**: Reference plane with the utterances of a 5-month-old (red\*) and a 24-month-old (green o) HI child (subject HI5) projected into that plane.

The data per child and per month are calculated. For this presentation, we display only the months 5 and 24 from a NH child (subject NH2), and the months 5 and 24 from a HI child (subject HI5) into the 24-months reference plane, see Figures 4 and 5 respectively. Of course, data from the NH child is part of the reference plane.

## 5. PRELIMINARY CONCLUSIONS

In all monthly recordings of our NH and HI subjects we found a large range in  $F_0$  (100-800 Hz). Papaeliou, Minadakis & Cavouras [10] found different acoustic patterns in 7- to 11-month-old children: durations differed, and peak and final  $F_0$  are higher for the expression of emotion than for utterances with a communicative function. The s.d. in  $F_0$  did not differ for these types of vocalizations. In our data (Figure 1) the s.d. in that age period is much larger for the HI children than for the NH. Possibly, our HI children, then, express more emotions than the NH children. Yet, with regard to the mean distribution of  $F_0$  no significant difference is seen between the deaf and hearing children over the monthly recordings.

The data on vowel space development (5 and 24 months) indicate that a randomly chosen NH child (subject NH2) is expanding towards the normal reference space for 24-month-old children. This is no surprise: this child's data were used to construct the reference plane. In the randomly chosen HI child (subject HI5) this expansion is less obvious. In the 24<sup>th</sup> month most points are still in the same area as found for the 5<sup>th</sup> month. In both children we see a concentration along the line between the adults' /u/ and /i/ projections: the closed vowels. The open vowel area /a/ possibly permits more variance in voiced sound production.

These preliminary results on just two subjects point to interesting aspects for further research. We will look for differences in durations and  $F_0$  changes in the utterances in our database. Furthermore the development of the vowel

space over the different months in individual children is quite interesting as well.

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