

# Mobilizing Smaller Datasets for Large-Scale Phonetic Analysis: Web-Databases and Semi-Automatic Analyses

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## Abstract

In this paper, we consider what can be gained by aggregating smaller, individual recording collections into large, user-centric web-based archives. We review two web-based archiving projects, the Online Speech/Corpora Archive and Analysis Resource (OSCAAR) and the Sociolinguistic Archive and Analysis Project (SLAAP), both of which feature organization and analysis tools that connect and enhance the overall usefulness of the archived recordings. We also briefly provide an example from research on speech timing that illustrates how these tools can help aggregate across research collections and empower new analyses.

**Index Terms:** speech databases, audio archives, speech timing

## 1. Introduction

Recordings of speech comprise the backbone of acoustic phonetic, speech perception, and much general linguistic research. The creation of these speech recordings (e.g., recording equipment and its use) and their analysis (e.g., appropriate statistical methods) tend to be thoroughly treated in methodology sections of papers and in specialized methodology textbooks. However, the storage, management, and preservation of these resources are rarely discussed in the academic literature, though these practices influence both the short term and long term usability of these resources. Improving our data storage and management strategies allow us to leverage new technologies so that our data archives become not just usable, but maximally useful.

In many areas of linguistic and speech science research a large amount of time, energy, and cost goes into the recording and development of specialized datasets for the pursuit of specific research questions. For instance, sociolinguists often generate individual collections of field-recorded sociolinguistic interviews in the pursuit of their specific research questions, and phoneticians often engage in the design and collection of highly controlled, lab-based recordings for the same reasons. In both cases, fairly small numbers of subjects are traditionally recorded. As theories of speech and language production and perception have moved towards understanding the sources and consequences of intra- and inter-talker variability, and as computational and storage media resources have evolved, greater emphasis has been placed on the compilation of larger digitized speech databases. Such multi-talker databases support increasingly detailed and sophisticated sociophonetic and acoustic phonetic analyses and provide stimuli for speech perception experiments that directly address the nature and extent of speech signal variability. Nevertheless, the typical digitized speech recording dataset collected within the context of linguistic research still cannot be considered very large scale and there is very limited aggregation across isolated datasets. Many papers have recently argued (e.g., [1], [2]) for improving methods of

linguistic data archiving and preservation so that diverse recording collections can be aggregated and mobilized for the pursuit of new, broader, deeper and often unplanned for research questions.

In this paper, we present two related web-based archiving projects, the Sociolinguistic Archive and Analysis Project (SLAAP) and the Online Speech/Corpora Archive and Analysis Resource (OSCAAR). Each of these web-based resources features organization and analysis tools that enhance the overall usefulness of the archived recordings. Crucially, they allow researchers to span across collections of recordings and annotations from different projects in order to mobilize disparate, smaller datasets for large-scale phonetic research. To illustrate this, and to exemplify some substantive outcomes of these projects, we conclude the paper by briefly presenting some new approaches to investigating sociolinguistic and sociophonetic variation from a large-scale research project, which has been made possible by SLAAP's software.

## 2. Web-based speech archives

While the past several decades have seen a massive increase in the availability of public collections of language data for research purposes (thanks in no small part to groups like the Linguistic Data Consortium [<http://ldc.upenn.edu/>] and the TalkBank project [<http://talkbank.org/>]), most emphasis in the publication and dissemination of language data resources has been placed on the development of *individual* corpora. The TalkBank.org website is one major exception in that it presents an umbrella interface over a large range of individual data collections [3]. OSCAAR and SLAAP, two projects that we have been involved in, we believe, represent another set of exceptions, and we turn to describe these now. We begin with OSCAAR, the newer of the two projects. (SLAAP is given a briefer treatment here as it has been described in several publications, e.g., [2], [4], [5].)

### 2.1. OSCAAR

OSCAAR, the Online Speech/Corpora Archive and Analysis Resource [<http://oscaar.ling.northwestern.edu/>], was begun in the Fall of 2009 in the Speech Communication Research Lab of the Northwestern University Linguistics Department [6]. OSCAAR seeks to provide a web-based storage and access facility for speech recordings from numerous talkers, languages, speaking styles, and elicitation methods that have accumulated over the past decade of research in the lab. OSCAAR allows for the flexible organization of various kinds of speech recordings so that researchers can more easily

- retrieve and review possible speech recordings for acoustic or other linguistic analysis (as in Figure 1);
- retrieve and review possible speech recordings for use as stimuli in speech recognition and perception experiments;

- search across recording collections to access, compare, analyze, etc. recordings from multiple collections
- gain new perspectives on their data (see Figures 4 & 5 for examples); and, of course,
- preserve recording collections, and share them, via the web-interface, with colleagues (while following security and access procedures that respect talker privacy as specified in IRB-approved consent forms).

While still in its early phases of development, OSCAAR already houses many of the speech recording collections developed by the Speech Communication Research Lab and we are actively adding data collections from other researchers. At the time of this writing, there are approximately 45,000 audio recordings stored in OSCAAR. These range from one-second long recordings of individual words and sentences to 30-minute long recordings of task-based spontaneous speech. As an example of OSCAAR's interface, Figure 1 displays a screenshot of English language recordings in the Wildcat Corpus [7] from native Spanish language talkers. Users can view, explore, and search the recordings in a variety of other ways, from characteristics of the talker, to collection-specific organizational terms (the "Diapix", "NN1-NN2", "Reading Passage", "Reading Sentences", and "Reading Words" headers in Figure 1 are all custom, sort-able filter-able organizational terms within the Wildcat Corpus; other collections can use other terms and categories), and, finally, to complex searches across multiple collections.

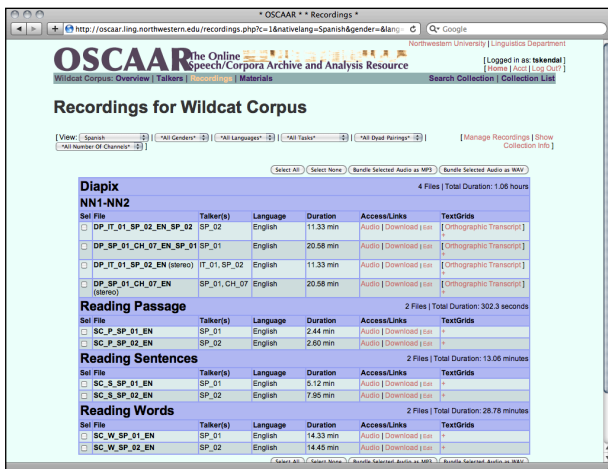


Figure 1: Screenshot of OSCAAR recordings view

In addition to the speech recordings themselves, OSCAAR also stores information about the talkers, and the associated materials for those recordings, such as the reading passages, interview protocols, or other stimuli used in eliciting the speech. These can be reviewed within OSCAAR and users can quickly peruse the recordings derived from a given material. This is demonstrated in Figure 2, a picture used for the "Diapix" task in the Wildcat Corpus [7].

Figure 3 displays an inline audio player for one of the Wildcat Corpus recordings derived from the picture shown in Figure 2. Here a user can create – and later search and/or return to – time-stamped notes that can be associated to specific moments in an audio recording. Directly from the audio player page, users can also review the stimuli used to elicit the recording (if any) and "zoom in" and view a spectrogram for a short span of the audio. Users can also

download complete audio files or extract portions of the audio by entering a time-range.

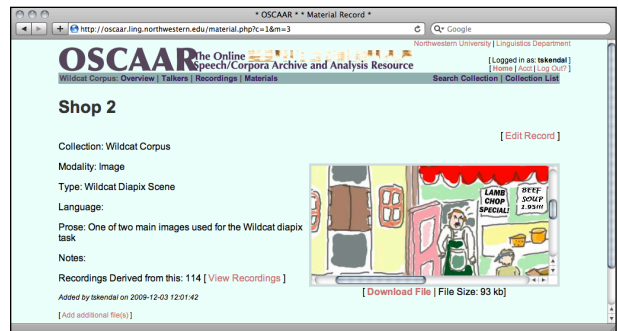


Figure 2: OSCAAR interface to a picture stimuli for the Wildcat Corpus

Additionally, OSCAAR provides a static URL and a "homepage" (not shown) for each data collection, so that researchers can publish persistent links to their dataset and then chose how much access to give public viewers. Visitors to OSCAAR can view basic information about data collections, but must be granted access by the site's administrator and the collection's owner to access each individual recording collection.

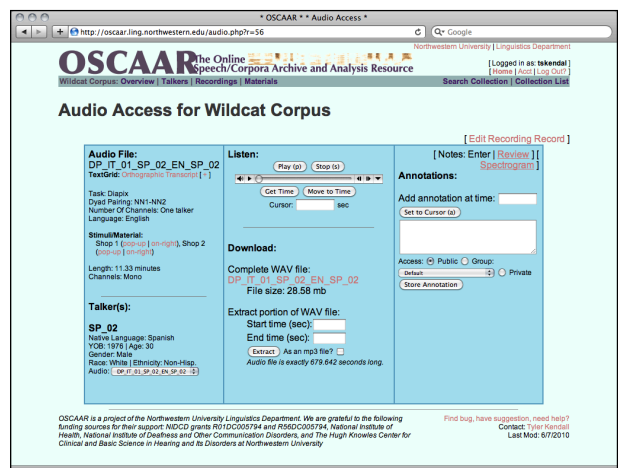


Figure 3: Audio access within OSCAAR

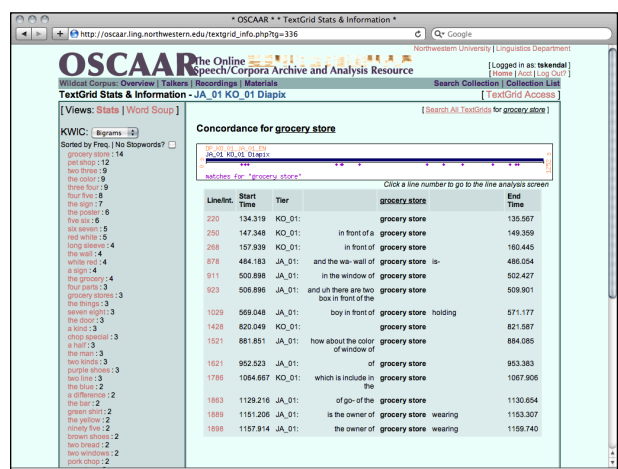


Figure 4: Concordance view with time information

For transcribed data in OSCAAR, users have access to corpus-like features that are enhanced through the time-alignment built into the implementation of the transcripts (see §3). Figure 4, for instance, displays a concordance for “grocery store” for one of the Wildcat Corpus diapix task recordings. Figure 4 also automatically shows us that “grocery store” is the most frequent two-word collocation in the recording, and displays, in addition to a normal concordance view of the text, the time-stamps of each relevant utterance and their location on a graphical time-line of the recording.

OSCAAR further provides a range of advanced features that provide new insight into spoken language recording collections. For instance, Figure 5, using data from [8], provides one example of a way that OSCAAR dynamically provides new ways to interface with and view speech data.

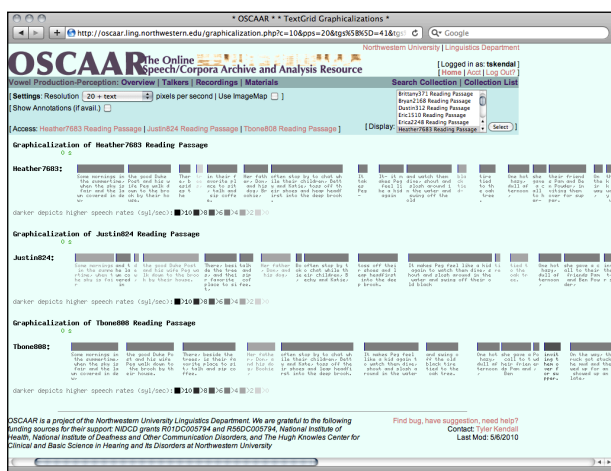


Figure 5: OSCAAR graphicalization of aligned orthographic text for two talkers reading the same reading passage

This *graphicalization* (cf. [4]) depicts the speech timing of talkers reading (aloud) the same reading passage. The darkness of shading of each gray block indicates the rate of speech (automatically determined by the software) and the width of each block its duration. Blank areas reflect silent pauses, with the width of the blank area depicting the duration of the silent pause. The version displayed in Figure 5 is set to a resolution of 20 pixels per second and to display the utterances’ time-aligned textual representations beneath each block. These kinds of displays are widely customizable by OSCAAR’s users.

## 2.2. The Sociolinguistic Archive and Analysis Project

While OSCAAR is designed to be a general-purpose speech archive, SLAAP, an older project, was developed for specifically sociolinguistic purposes. SLAAP is housed at North Carolina State University and is jointly supported by the NCSU Libraries and the North Carolina Language and Life Project, a research and outreach project led by Walt Wolfram and colleagues at NCSU. SLAAP features a growing archive of sociolinguistic audio recordings along with dynamic interfaces to those recordings. Many of the features are similar to those described above for OSCAAR, though SLAAP, since it has existed longer and has been designed around a specific research focus has additional tools developed for sociolinguistic analysis.

At the time of this writing, over 1,600 interview recordings are stored in and accessible through SLAAP, amounting to over 1,300 hours of recorded speech. The centerpiece of the SLAAP software is a time-aligned

annotation framework that is integrated with analytic software (including Praat [9] and R [10]) allowing for features like the automatic generation of spectrograms within the web-based audio player, the extraction of phonetic data from within a recording’s transcript, multiple and dynamic displays of each transcript, and corpus linguistic analyses across the diverse materials in the archive. At present (only) 3% of the total archive is transcribed. This constitutes a 385,000 word searchable corpus, representing 38.5 hours of recorded talk, time-aligned at the utterance level. Like the digitization and entry of the audio recordings, transcription is ongoing, though – as is evident from the small percentage of transcribed talk – is more slow-going than digitization. (SLAAP and its features are discussed more fully in [4], [11], and [12].)

## 3. Data-based and Praat-based annotations

Both OSCAAR and SLAAP have been designed around a data-based time-aligned annotation model where all annotation layers reside in a MySQL relational database. While the systems themselves are agnostic about how annotation types like transcription and aligned text are developed, the most common formats for these to originate in are Praat TextGrids [9]. Praat TextGrids allow flexible kinds of annotation for audio recordings with arbitrarily fine temporal precision. This allows both gross and extremely fine time-alignment, and types of annotation ranging from phonetic and phone-level transcription to grammatical mark up and coding to orthographic and utterance-level broad transcription.

Once created, TextGrids can be uploaded and attached to their source audio in both OSCAAR and SLAAP. The systems parse the TextGrid files and store the annotations as relational database data. Users can export the annotations out of the system back to a TextGrid format or as tab-delimited text. While not a direct implementation of the *annotation graph* framework [13], the model developed here bears many similarities.

Relational databases provide an extremely fast and stable backend for web-based corpora. Davies [14], for example, has demonstrated that relational databases make efficient storage and search engines even for extremely large corpora.

## 4. Aggregating across collections

One major advantage, we argue, to the web- and data-based approach we have taken to managing speech data collections is that software tools, like features in OSCAAR and SLAAP or other, customized analysis scripts, can reach across independent recording collections to perform analyses spanning across the boundaries of the projects from which the original datasets came.

For instance, in [11], SLAAP was used to conduct a corpus sociophonetic analysis of speech timing across fourteen separate sociolinguistic research projects. In addition to examining variation in articulation rate and silent pause durations, which were measured by mining the databased, time-aligned transcripts, a software-based plotting method was also developed that allowed for the investigation of the influence of *hesitancy* on the realization of morphosyntactic and phonological sociolinguistic variables. This method involves the generation of *Henderson graphs* (cf. [11] and [15]) and the use of the Henderson graphs’ *slopes* as an independent predictor in the statistical analysis of other variables. Figure 6 displays a screenshot of a Henderson graph in SLAAP (data come from [16]).

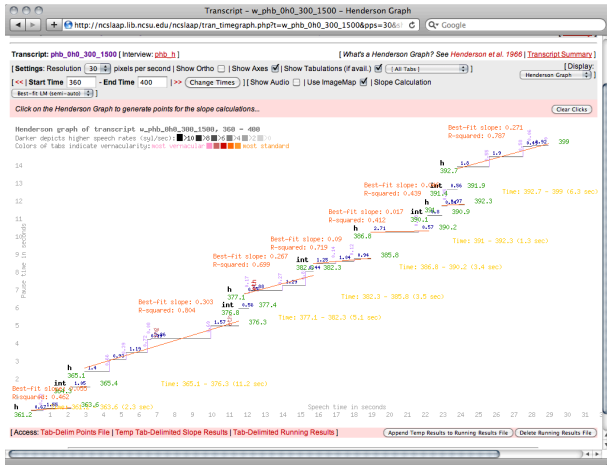


Figure 6: SLAAP Henderson graph showing best-fit slope lines and the occurrence of sociolinguistic variables

The Henderson graph slopes prove to be a useful independent variable in statistical models of several sociolinguistic variables and allow for the testing of hypotheses, new and old [17], about the relationship between paralinguistic cues, like hesitation phenomena, and the realization of variable forms.

For instance, in examining the productions of variable (ing), the alternation between [ɪn] and [ɪŋ] in word-final *-ing* in English, the slope of the stretch of talk containing each (ing) is found to be a statistically significant predictor in logistic regressions. Steeper slopes – representing a quantitative and systematic measure of more hesitant speech – are more likely to be realized as full [ɪŋ] than shallower slopes. Importantly, for the purposes of this paper, we observe that through SLAAP’s software and collective archive, we can readily test (and have tested) this analysis against multiple recording collections.

## 5. Conclusion

In closing, we argue that web-based archives such as OSCAAR and SLAAP, which seek to develop organizational systems for multiple recording collections allow for the collected recordings to be better preserved, more accessible, and better mobilized for larger, aggregated analysis. These resources are particularly important for leveraging the full analytic potential of lab-based and interview-based speech and language corpora, however, this basic design approach also holds significant potential for very large-scale phonetic research based on corpora captured from broadcast and other public media such as radio, television and film. We believe that storage, management and preservation tools like these are an essential complement to the very-large-scale corpus analysis tools and methodologies that are increasingly available to speech and language researchers and innovators.

## 6. Acknowledgements

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