20 000 files under the sea

What can distant reading of language archives tell us?

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by Sebastian Nordhoff
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on September 24, 2020
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» Depth of data analysis

1. Formalized data
 [+NASAL] → [+LABIAL] / __[+LABIAL]

- Descriptive data "There is regressive assimilation"
- Descriptive dates There is regressive
- 3. Raw data "kithampe"

» Depth of data analysis

- 2. Descriptive data "There is regressive assimilation"
- 3. Raw data "kithampe"
- 4. Annotated data: kitham=pe 1PL=POSS 'our'



» The QUEST project

- Quality Established: Testing and application of curation criteria and quality standards for audiovisual annotated language data (Krifka, Seifart, Seyfeddinipur)
- * 2019-2022
- * reuse of digital annotated language data
 - * analysis: what is being held in an archive?
 - * mobilization: how can we make third parties interact with the archive?
- perspectives
 - prospective: development of standards, curation criteria, and workflows
 - * retrospective: enrichment of existing legacy data
- today: retrospective analysis of data from 4 different DELAMAN archives
- * what types of answers can we get from their holdings?

» The DELAMAN archives

- Digital Endangered Languages and Musics Archives
 Network (DELAMAN)
- 12 full members; 7 associate members
- President: Mandana Seyfeddinipur
- * Archives considered in this talk:
 - The Archive of the Indigenous Languages of Latin America (AILLA)
 - Endangered Languages Archive at SOAS University of London (ELAR)
 - Pacific And Regional Archive for Digital Sources in Endangered Cultures (PARADISEC)
 - * The Language Archive/Dobes (TLA)
 - * Alaska Native Language Archive (ANLA)

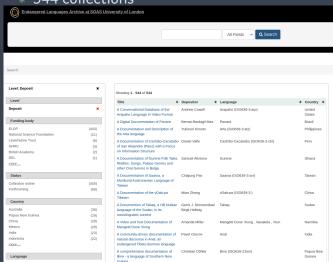
» AILLA

- * The Archive of the Indigenous Languages of Latin America
- * 226 collections



» ELAR

- Endangered Languages Archive at SOAS University of London
- * 544 collections



» PARADISEC

- Pacific And Regional Archive for Digital Sources in Endangered Cultures
- * 445 collections

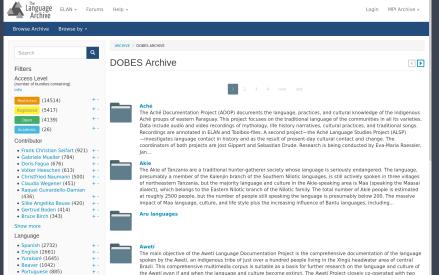


» TLA/Dobes archive

Bora (701)

Ocaina (652)

* 68 collections



other DOBES projects on languages in the area (Trumai and Kuikuro / Upper Xinguan Karib): all these languages are

genetically unrelated. Co-operation was to ensure, among other things, the creation of analogous corpora for the

» OLAC

Open Language Archives Community



OLAC Language Resource Catalog

Search for language resources

Catalog Home

- Search Strategies
- Advanced Search
- Advanced Sear
- New: Records recently added or modified

Navigating the Catalog

Quick Links

- Browse by Language
- Browse by Country
- Browse by Linguistic Field
- Browse by Linguistic Type
- Browse by Language Family
- Contacts
- Email Us

More information

- OLAC Homepage
 OLAC FAO
- Participating Archives

This catalog, developed by the **Open Language Archives Community (OLAC)**, provides access to a wealth of information about thousands of languages, including details of text collections, audio recordings, dictionaries, and software, sourced from dozens of digital and traditional archives.

Browse the OLAC records by Geographic region or by Language:



Undetermined (40207)
 Yuracare (1895)
 English (23053)
 Mandarin Chinese

go

- Dutch (19460)
- German (8814)
- Spanish (8458)
- Russian (5423)
- Japanese (4345)
- Turkish (3785)
- Bathari (3429)
- French (3229)
- Indonesian (3120)

- (1870)
- Kachin (1827)
- Yele (1754)
- Khmu (1698)
- Tzeltal (1640)
- Portuguese (1589)
- No linguistic content (1459)
- Tok Pisin (1436)
 - View more...



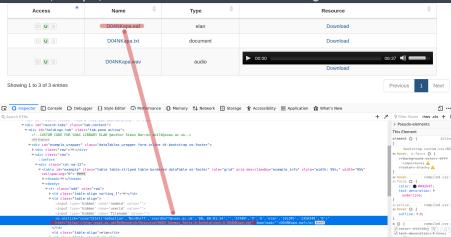


» Acquisition

- * enumerate: what do we have?
- * authenticate: provide identity and credentials
- * harvest: download resources we have access to

» Enumerate

- partially possible via OLAC and the OAI-PMH (Open Archives Initiative Protocol for Metadata Harvesting)
- * but information is not complete, so we have to extract (scrape) the websites of the archives, eg ELAR below.



» Authenticate

- Resources are either available to
 - everybody,
 - 1) to registered users,
 - 2) upon request, or
 - 3) never.
- Register with all archives in order to get access to levels
 0 and 1.
- Find a way to log in via the command line, bypassing the browser.
 - * OK for AILLA, ELAR, TLA, more cumbersome for PARADISEC.

» Log in and download

```
with requests.Session() as s:
    s = requests.Session()
    un_name = "name"
    pw_name = "pass"
    values = {
        un_name: username.strip(),
        pw_name: password,
        "op": "log+in",
        "form_id": "user_login_block",
    }
    s.post(base_url, data=values)
    session_id = s.cookies.get_dict().get("SSESS64f35ecaf4903fe27led0b0c15ee2bce")
    b_root = url2root(s, base_url)
    collection_links = b_root.findall(".//div/dl/dd/a")
    collection_urls = [
        "https://ailla.utexas.org/%s" % a.attrib["href"] for a in collection_links
}
```

- try to access each enumerated resource
- * if access is denied, skip to the next item in list
- st otherwise, download the resource and store it locally
- script runs for a couple of hours per archive, altogether several days
- Result: ~20 000 ELAN files could be retrieved



- supports a variety of audio and video formats
- * multi-speaker support
- time-aligned annotations
- * annotations are organized in tiers
- * tiers are organized hierarchically:
 - * translation is a child tier of transcription

» Multi-speaker

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» Translation

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A Words-txt-mos				
A Translation-gls-en	The story of tiger and armadil	lo	If we say how it ha	ppened, the tiger and the
A Participant-note-en				
Interlinear-title-mos				
				[45/45]

» Annotation

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A phrase-segnum-en		43											
A phrase-gls-en		this Kagate language v	vill not be lost, speaking										
A phrase-gls-ne													
A word-txt-syw-Latn-NP		dì	cùba	tám	tórteud	lze		mèòng	е		làpti		
A morph-txt-syw-Latn-NP		dì	cúuba	tám	tór	-teu	-dae	mè	òŋ	-ge	làp	-ti	
A morph-cf-syw-Latn-NP		dì	cúuba	tám	tór	-teu	-tse	mè	òŋ	-ke	làp	-di	
A morph-gls-en		this	Kagate	talk	lose	CAUS	INF	COP.NE	come	PRES	speak	IPFV	
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A morph-type		root	stem	stem	stem	suffix	suffix	stem	stem	suffix	stem	suffix	
A morph-variantTypes-en													
A word-gis-en		this	Kagate	talk									
A word-txt-qaa-x-SYW													
interlinear-text-title-syw-Latn-NP													
interlinear-text-comment-en													
interlinear-text-title-en													
(1)													

ST ELD archives Acquisition **ELAN** Analysis Linked Data Discussion Conclusion

» ELAN in the archives

·				
	collections	eaf files	transcribed	duration
AILLA	10	1674	1 447	532.7h
ELAR	201	13758	10 139	2588.3h
PARADISEC	78	2619	1776	302.0h
TLA	68	1 695	1 441	506.5h
total	289	19746	14803	3929.5h

 note the difference between the total number of collections given for the archives in the introduction and the collections with at least one accessible ELAN file, given here

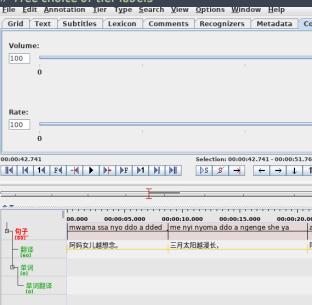
```
» XML
```

```
<?xml version="1.0" encoding="UTF-8"?>
<ANNOTATION DOCUMENT>
    <TIME ORDER>
        <TIME SLOT TIME SLOT ID="ts1"_TIME VALUE="740"/>
        <TIME SLOT TIME SLOT ID="ts2" TIME VALUE="1860"/>
        <TIME SLOT TIME SLOT ID="ts3" TIME VALUE="3718"/>
    </TTMF ORDER>
    <TIER TIER ID="ref@DAM" PARTICIPANT="Dambar Baram" ANNOTATOR="KP" LINGUISTIC TYPE REF="ref">
            <ANNOTATION>
                <ALIGNABLE ANNOTATION ANNOTATION ID="anno" TIME SLOT REF1="ts1" TIME SLOT REF2="ts2">
                    <ANNOTATION VALUE>. 001</annotation VALUE>
                </ALIGNABLE ANNOTATION>
            </ANNOTATION>
            <ANNOTATION>
                <ALIGNABLE ANNOTATION ANNOTATION ID="ann8" TIME SLOT REF1="ts3" TIME SLOT REF2="ts4">
                    <ANNOTATION VALUE>. 002</ANNOTATION VALUE>
                </ALIGNABLE ANNOTATION>
            </ANNOTATION>
    </TTFR>
    <TIER TIER ID="ut@DAM" PARTICIPANT="Dambar Baram" ANNOTATOR="KP" LINGUISTIC TYPE REF="ut" PARENT REF="ref@DAM">
            <ANNOTATION>
                <REF ANNOTATION ANNOTATION ID="ann1" ANNOTATION REF="ann0">
                    <ANNOTATION VALUE>əbə/ANNOTATION VALUE>
                </REF ANNOTATION>
            </ANNOTATION>
            <ANNOTATION>
                <REF ANNOTATION ANNOTATION ID="ann9" ANNOTATION REF="ann8">
                    <ANNOTATION_VALUE>kunai pudza tukle hon la malak/ANNOTATION VALUE>
                </REF ANNOTATION>
            </ANNOTATION>
            <ANNOTATION>
                <REF ANNOTATION ANNOTATION ID="ann36" ANNOTATION REF="ann35">
                    <aNNOTATION VALUE>hidi hudi pudza tukle alam alam wa lakle əbə</aNNOTATION VALUE>
                </REF ANNOTATION>
            </ANNOTATION>
    </TIFR>
   <LINGUISTIC_TYPE LINGUISTIC TYPE ID="ref"/>
    <LINGUISTIC TYPE LINGUISTIC TYPE ID="ut" CONSTRAINTS="Symbolic Association"/>
    <LINGUISTIC TYPE LINGUISTIC TYPE ID="txd" CONSTRAINTS="Symbolic Association"/>
    <LINGUISTIC TYPE LINGUISTIC TYPE ID="tx" CONSTRAINTS="Symbolic Subdivision"/>
    <LINGUISTIC TYPE LINGUISTIC TYPE ID="mb" CONSTRAINTS="Symbolic Subdivision"/>
   <LINGUISTIC TYPE LINGUISTIC TYPE ID="qe" CONSTRAINTS="Symbolic Association"/>
    <LINGUISTIC TYPE LINGUISTIC TYPE ID="ft" CONSTRAINTS="Symbolic Association"/>
</ANNOTATION DOCUMENT>
```

» Analysis of the XML

* simply look up the tiers called ut (utterance), mb (morpheme breaks), ge (gloss English), ft (free translation) and be done!

» Free choice of tier labels



ST ELD archives Acquisition **ELAN** Analysis Linked Data Discussion Conclusion

» Tier label inventories

glosses ge, morph-item, gl, Gloss, glosses, glosses, word-gls, gl (interlinear gloss).

translations eng, english translation, English translation, fe, fg, fn, fr, free translation, Free Translation, Free-translation, Free Translation (English), ft, fte, tf (free translation), Translation, tl, tn, tn (translation in lingua franca), tf_eng (free english translation), trad1, Traducción Español, Traducción, Traducción, Translate, trad, traducción, traducción, traducción, Traducción, Traducción español, Traduccion, translation, translation, Translation, xe, 翻译.

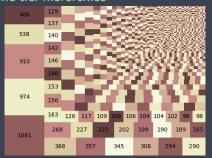
» Tier label inventories

transcriptions: arta, Arta, conversación, default-lt, default-lt, Dusun, Fonética, Frases, Hablado, Hakhun orthography, Hija, hija, ilokano, interlinear-text-item, Ikaan sentences, Khanty Speech, main-tier, Madre, madre, Matanvat text, Matanvat Text, Nese Utterances, o, or, orth, orthT, orthografia, orthografía, orthography, othography, po, po (practical orthography), phrase, phrase-item, Phrases, Practical Orthography, sentence, sentences, speech, Standardised-phonology, Sumi, t, Tamang, texo, text, Text, Text, texto, Texto, texto, Texto principal, Texto Principal, tl, time aligned, timed chunk, tl, Transcribe, Transcrição, TRANSCRIÇÃO, Transcript, Transcripción chol, transcripción chol, Transcripción, Transcripcion, transcripción, Transcription chol, transcript, Transcription, transcription, transcription orthography, trs, trs@, trs1, tx, tx2, txt, type utterance, unit, ut, utt, Utterance, utterance, uterrances, utterances, utterrances, Utterances, utterance transcription, UtteranceType, vernacular, Vernacular, vilela, Vilela, word-txt, word orthography, xv, default transcript, 句子, 句子, 句子.

» Configurations

- * Instead of tier names, we can look at the tier hierarchies
- Relation between tiers can be "time subdivision", "symbolic subdivision", "symbolic association"
- We can establish file fingerprints based on the tier hierarchies
- * The root tier of a speaker is labelled "x"
- A file with the fingerprint [xx] would have two speakers and no further tiers
- * A file with a [x[aa]] would have one speaker with two dependent tiers of type "symbolic association"
- * A file with a [x[aa]x[aa]] would have two speakers with two dependent tiers of type "symbolic <u>association</u>" each
- * Maybe some tier hierarchies are very frequent, and we can take advantage of this for our analyses? This would allow us to disregard the tier labels.

» Found tier hierarchies



- * there are 2187 different fingerprints
- each box represents a different tier hierarchy/fingerprint
- numbers show how often the given hierarchy occurs in the dataset
- * conclusion: the tier hierarchies are very heterogeneous
- * not a very promising route

» Semantic content analysis

- * What are the holdings of the archives about?
- Most files have transcriptions, but not all files have translations
- Translation is a faithful rendering of the content of an utterance in another language
- Topics in the source language should be found in the translated language as well
- Named Entity Recognition with Grobid/NERD based on translations
 - * "Gestern haben wir Karneval gefeiert und ich war als Bär verkleidet"
 - * "Yesterday we celebrated carnival and I was disguised as a bear"

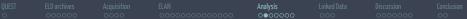
» Close reading/distant reading

- Named Entity Recognition allows for Distant Reading of a collection
- Close reading: examine one text very thoroughly
- Distant reading: examine a wealth of texts, less thoroughly
 - originated in literature studies to cover "the great unread", not only the 1% of canonised texts
 - * used in library science for instance to describe holdings
 - * eg "78% of our holdings deal with Europe; 50% of our holdings deal with other continents; 15% of our holdings have no identified geographical coverage"

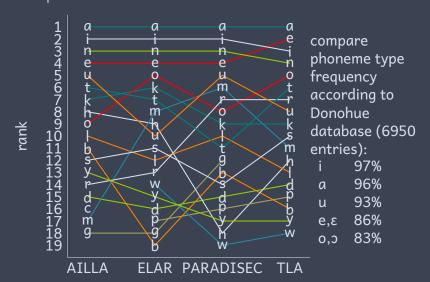
» Elements

	utterances	words	translations	glossed words	entity types	tokens
AILLA	633 520	1 957 913	*14 248	*57 371	1532	703
ELAR	2 221 543	8 119 023	306 836	2 628 943	20 991	8 192
TLA	675 934	2 102 332	247 946	474 705	10346	4249
PARADISEC	224 923	942 615	49 641	105 243	1163	683
total	3 755 920	13 121 883	*618671	*3 266 262	34032	(11715)

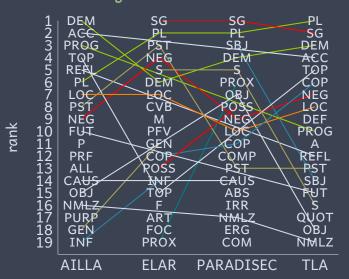
* What kind of analyses can we run on these data?



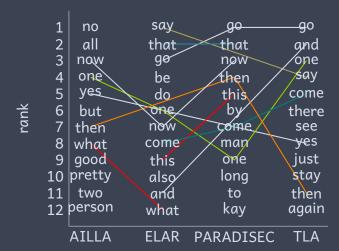
» Graphemes



» Grammatical categories



» Lexical glosses





» Named entities

rank



ST ELD archives Acquisition ELAN **Analysis** Linked Data Discussion Conclusio oo⊙ oo⊙ooo oo

» Biases in semantic domains

- Definitely too many Caucasus-related concepts in TLA (Svan, Svaneti, Svans, Georgia, Tbilisi)
 - * One very large and thorough collection dominates the rest
 - * TLA is biased towards the Caucasus
- * But why are almost all other concepts about crops and livestock?
- * Do the populations really talk about agriculture the whole day?
- * When did you last talk about agriculture?
- * Or is it maybe the linguists who happen to ask only about those domains?
- * What does this tell us about the way Western academia envisions language documentation? Peasants all over the place?

» Shortcomings of the approach

- Dirty data
 - * An unknown amount of the 20k files are faulty/erroneous
 - * empty files
 - * syntactically invalid files
 - * empty tiers
 - * semantic nonsense
 - * semantic underspecification
 - st But estimations are possible based on sampling
 - * calibration
- * Type/token problem
 - * do we have more (a) because more lexemes have (a) or because the lexemes with (a) are more frequent? Or because there is one large collection of an (a)-heavy language which dominates the rest?
 - * areal/genealogical distribution
 - * This can be controlled for by integrating data from other knowledge bases, but has not been done yet.

» Linguistic Linked Open Data Cloud

- Connect different knowledge bases via shared vocabularies.
- Every blob is a knowledge base, every edge is a connection
- * Connections are typed, eg Work123 dc:language Lg456



» Three types of metadata/annotations

- 1. context (who, when, where, in what medium)
 - * Dublin Core (Creator, Topic, Title, Language)
 - * WGS84 (Geo coordinates)
 - * Glottolog (Genealogical relationships)
- 2. structure (part-whole relations of the resource)
 - Linked Interlinear Glossed Text (LIGT; Utterances, Words, Glosses)
- 3. content (what)
 - * Wikidata (Concepts)
- 4. We can integrate existing knowledge from these other repositories to enrich our own knowledge base.

» Usage

* discovery

- integration of the Wikidata concept hierarchy (instance of, sublass of)
- * search for "bird" yields "cardinal woodpecker" as well

* merger

- Dataset can be merged with the APICS dataset (not done yet)
- * enrichment
 - * Additional data from Glottolog, OLAC
 - * control for genealogical, areal bias
 - * Gloss translations from DBnary (Chiarcos et al. 2017)
 - can mediate between English/Spanish metalanguages, eg AILLA

» So, how far can you get with "unanalyzed" data?

- Different types of data:
 - * raw
 - * annotated
 - * analyzed
- st the data at hand show no traces of syntactic analyses
- * possible research questions about:
 - * languages: which languages have value X for feature F?
 - * texts: which texts from which languages/cultures contain X?
 - * scientific communities: who works on what?

» Semantic questions: foodstuff

- * why is the cow more frequent than the pig in AILLA, ELAR & PARADISEC but it's the other way round in PARADISEC?
 - easy answer: PARADISEC contains mainly content from cultures from the Pacific, where the pig is a much more important animal than the cow.
 - the same is true for the dominance of potatoes (AILLA, Andes), sago (PARADISEC, Pacific), rice (ELAR, PARADISEC, Asia), and cheese (TLA, Caucasus)

» Number questions: why the frequency difference between SG/PL?

- in some archives, SG is more frequent as a gloss, in others PL
- * explanations favouring SG:
 - there are more singular referents than plural referents in the world
 - * text genres archived are more often monological
- * explanations favouring PL:
 - * optional number marking in many languages
 - * even when number is obligatory, SG is often zero-marked
- * which one is the right explanation?

» Graphemes: why the frequency differences between <a,i,e,u,o>?

- * favouring (a)
 - many orthographies use (a) for schwa as well, and schwa is a frequent sound.
- * favouring (e)
 - historical reasons: English and French colonizers use (e) for schwa, not (a)
- * favouring (i,u) over (e,o)
 - * maximize vocalic space
- * favouring (i,e) over (u,o)
 - * frontness preferred (but why?)
- * which one is the right explanation?
 - * analogous approach for consonants

» Disentangling hypotheses/biases

- * universal preferences
 - * anatomy (phonemes), cognition (number?)
- * language specific preferences
 - areal and genetic bias; "historical accidents";
 extralinguistic factors
- * collectors' preferences
 - * "agricultural bias"
- * should apply to "analyzed" data as well

» Prospects for distant reading

- * data in endangered language archives
 - * nominal (X is present)
 - * ordinal (There is more X than Y)
 - * scalar (X is factor 1.5 more than Y)
- * how far can you get in phonology:
 - * somewhere
- * how far can you get in grammatical categories:
 - * somewhere
- * how far can you get in syntax:
 - * nowhere
- * how far can you get in (formal) semantics:
 - * nowhere
- * how far can you get in sociology of science:
 - * good prospects

» Why do distant reading?

- * costs for unanalyzed data
 - * data acquisition: several days computing time
 - * analysis: couple of hours computing time
 - * colexification analysis of whole archive: 30 seconds
- * costs for "analyzed data":
 - * data acquisition: weeks to months to years
 - * data analysis: months/years
- tradeoff between depth of analysis and time/cost to produce a resource

» Conclusion

- * distant reading is a coarse approach
- can answer some questions
- * can generate some hypotheses
- * opens up surprising new fields for research

» Thank you

