# Machine Learning and Technology for Endangered Languages 

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## Web as Linguistic Archive

- Billions of unique resources, +1
- Raw data only, no annotations, -1
- Wide range of languages represented, +1
- Very little material in endangered languages, -1
- Full text searchable, +1
- Can't search archive by language, -1
- Snapshots archived periodically, +1
- Resources removed or changed at random, -1
- Free to download, +1
- Usage rights unclear for vast majority of resources, -1


## An Crúbadán: History

- First attempt at crawling Irish web, Jan 1999
. 50M words of Welsh for historical dict., 2004
- ~150 minority languages, 2004-2007
- ~450 languages for WAC3, 2007
- Unfunded through 2011
- Search for "all" languages, started c. 2011


## How many languages?

- Finishing a 3-year NSF project
- Phase one: aggressively seek out new langs
- Phrase two: produce free+usable resources
- Current total: 2168
- At least 200 more queued for training
. 3000?


## Design principles

- Orthographies, not languages
- Labelled by BCP-47 codes
- en, chr, sr-Latn, de-AT, fr-x-nor, el-Latn-x-chat
- Real, running texts (vs. word lists, GILT)
- Get "everything" for small languages
- Large samples for English, French, etc.


## How we find languages

- Lots of manual web searching!
- Special code monitors WP, JW, UN, bible.is
- Typing/OCR of scanned or offline texts
- Build statistical language ID models
- Special thank to Ed Jahn, George Mason
- NSF grant 1159174


## Adding Value

- Separating orthographies/dialects
- Clean boilerplate text
- Convert to UTF-8 text + normalize
- Sentence segment and tokenize
- Produce formats useful for NLP


## UTF-8 Normalization

- Fonts (Sámi, Mongolian, dozens of others)
- Lookalikes (az: ə/ə, bua: $ү / \gamma$, ro: ş/ș)
- Shortcuts (haw, mi, etc. äëïöü for āēīōū)
- Encoding issues (tn, nso: ß/š from Latin-2)
- Fun w/ apostrophes:


## Three modules

- Traditional web crawler
- Twitter crawler
- Blog tracker


## Twitter crawler

- Twitter's REST API
- Seed searches with words from web corpora

- Language ID particularly challenging
- Crawl social graph to find new tweets
- http://indigenoustweets.com/



## Blog tracker

- Blogger platform only
- Works hand-in-hand with traditional crawler
- Registers all blogs with an in-language post
- Tracks all past and future posts
- http://indigenousblogs.com/


## Deliverables

- See http://crubadan.org/
- Word and bigram frequency lists
- Character trigram frequencies
- Lists of URLs in each language
- Discoverable as an OLAC repository


## Spelling and grammar checkers

- Corpus-based Irish spellchecker, 2000
- Grammar checker, 2003
- 28 new spellcheckers since 2004
- Collaborations with native speakers
- All under open source licenses


## Computational Morphology

- Finite-state transducers (Xerox FST, foma)
- Very fast + bidirectional
- Cover most morphology of human langs
- Hunspell uses "two-fold affix stripping"
- Morphological analysis only
- Not as powerful, theoretically
- But, simpler formalism, better user support


## Powerful enough?

- Hungarian
- Northern Sámi
- Basque
- Lingala, Kinyarwanda, Swahili, Chichewa
- Nishnaabemwin


## Language ID

- Component and an application of Crúbadán
- Character n-grams + word models
- NLTK 3-gram data set
- Indigenous Tweets and Blogs


## Predictive text

－T9 input
－Adaptxt
－Firefox OS
－Dasher

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## accentuate.us

- Web service for diacritic restoration

- Eni kookan lo ni eto si omi nira lati ni imoran ti o wu u, ki o si so iru imoran bee jade
- Ẹnì kọ̀ọkan ló ní ẹtọ́ sí òmì nira láti ní ìmọràn tí ó wù ú, kí ó sì sọ irú ìmọ̀ràn bẹẹ̣ jáde
- End-user clients for Firefox, LibreOffice
- Perl, Python, Haskell libraries
- Joint work with Michael Schade


## Orthotree

- http://indigenoustweets.blogspot.com/2011/12/
- https://github.com/kscanne/orthotree



## N-gram language models

- Opens NLP to 100's of languages
- Noisy channel model
- Spelling and grammar checking
- OCR correction (e.g. old Irish fonts)
- Speech recognition
- Machine translation and related tasks


## Irish standardization

- Irish spelling/grammar reform in the late 40s
- Presents huge problems for Irish NLP
- Search (web texts, corpora for lexicography)
- Using old texts for NLP (parallel corpora)
- Solution is to treat this as an MT problem
- "IBM Model 1" + spelling changes
- In use at two big Irish dictionary projects


## Intergaelic

- "Q-Celtic": Irish, Scottish, Manx Gaelic
- Scottish to Irish similar to standardization
- Same engine works
- Irish is strongest of the 3; big n-gram models
- Facilitates communication in social media
- Open to big "market" of Irish speakers




## Twitter stream

BBCSpors BBC Spòrs Gaelic
http://t.co/rtrxR8FFYd Rugbaidh \#PRO12 | Dùn Èideann v Ospreys |
Tòiseachadh aig 5.50 uf air @bbcalba | @HughDan1956 @calum_macaulay

akerbeltzalba Akerbeltz
Duilich tha coltas gu bheil òstair an fhaclair * air fad * shìos, fiù an làrach aca-san. Bidh sinn air ais cho luath 's a ghabhas.
\% lá ó shin फ Freagra 47 Atweetáll ひ̂? Rélltín suíomh

## BBC

naEnencrean
bbcnaidheachdan BBC Naidheachdan
Aithris bhideo: Morair Mhinginis ag ràdh g'eil foghlam tro mheadhan na Gàidhlig a' toirt fein aithne air ais... https://t.co/OAOHpeMjXr
V 1 lá ó shin क Freagra Lz Atweetáil $\hat{\text { ô Rélltín }}$

## BBC

nazerenoean
bbcnaidheachdan BBC Naidheachdan
Aithris bhideo: Ceist mu dè a bu chòir tachairt do dh'aitreabh Sgoil t-Oib anns na Hearadh. https://t.co/JcndcvZNKZ


## BBCAimsir BBC Aimsir

Chuala sibh mu bogha frois ach dè mu dheidhinn bogha ceò? Abair dealbh inntinneach! https://t.co/98rsSaOllx

1 lá ó shin か Freagra $\uparrow 7$ Atweetáll $\hat{\mathbf{V}}$ Réltín

## Clilstore

Ailstore Guthan nan Eilean Iain Tormod MacLeòid Alex, Kathleen \& Micheal

Unit info

## Foghlam Fad Beatha agus Sabhal Mòr Ostaig



Chaidh Sabhal Mòr Ostaig a stèidheachadh mar cholaiste Ghàidhlig ann an 1973 ann an Slèite san Eilean Sgitheanach. Thairis air na bliadhnaichean tha e air fàs gu luath, le togalaichean ùra aig Àrainn Ostaig an toiseach, agus an uair sin faisg air làimh aig Àrainn Chaluim Chille, le seallaidhean brèagha air an Linne Shleibhteach.



```
    FOCLÓIR AISTRIÚCHÁN
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    sealladh
    seall | fealladh | gealladh | mealladh

## X sealladh

AINMFHOCAL FIRINSCNEACH
faclair.com *
11 amharc
potafocal.com *
III radharc
potafocal.com *

## intergaelic.com

FOCLÓIR
AISTRIÚCHÁN

> Tha ceannard ionmhais NHS na Gàidhealtachd ag ràdh gur dòcha gun tèid iad $£ 5 \mathrm{~m}$ thairis air a' bhuidseat aca ro dheireadh na bliadhna-ionmhais, mura tèid aca air cosgaisean a ghearradh mar a tha còir.

Tha ceannard ionmhais NHS na Gàidhealtachd ag ràdh gur dòcha gun tèid iad $£ 5 \mathrm{~m}$ Tá ceannaire chiste NHS na Gaeltachta ag rá gur dócha go rachaidh siad $£ 5$ rn thairis air a' bhuidseat aca ro dheireadh na bliadhna-ionmhais, mura tèid aca air thairis an bhuiséad acu roimh dheireadh na bliadhna-ionmhais, mura rachaidh acu ar cosgaisean a ghearradh mar a tha còir.
táilli a ghearradh mar atá ceart.

A rèir Nick Kenton, tha cosgaisean a bharrachd an lùib seirbheisean a chumail ri
De réir Nick Kenton, tá costas sa bhreis ceangailte le seirbhisí a choinneáil le
euslaintich san iar-thuath agus Ospadal an Ràthaig Mhòir a' cur ris an uallach a th' orra.
othair san iarthuaisceart agus Ospidéal an Ràthaig Mhóir ag cur leis an ualach atá orthu.

