



# FINITE-STATE MORPHOLOGICAL TRANSDUCERS FOR THREE KYPCHAK LANGUAGES

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- Turkic languages (SOV, agglutinative, vowel harmony)

|                        | Kazakh          | Tatar         | Kumyk    |
|------------------------|-----------------|---------------|----------|
|                        | /qazaq/         | /totar/       | /qumuq/  |
| classification         | Southern        | Northern      | Western  |
| population of speakers |                 |               |          |
| number                 | 8M-12M          | 5.4M          | 430K     |
| primary                | Kazakhstan      | Tatarstan     | Dagestan |
| secondary              | China, Mongolia | Bashqortostan | —        |
| external influences    |                 |               |          |
| Mongolic               | moderate        | light         | light    |
| Oghuz                  | —               | light         | moderate |
| Persian                | heavy           | heavy         | heavy    |
| Russian                | heavy           | heavy         | heavy    |

## Morphological transducers

- Take a surface form, and produce valid lexical form(s)
- Take a lexical form, and produce valid surface form(s)

‘алдым’ ↔ ал<v><tv><ifi><p1><sg>, алд<n><px1sg><nom>

## Transducers for Turkic languages

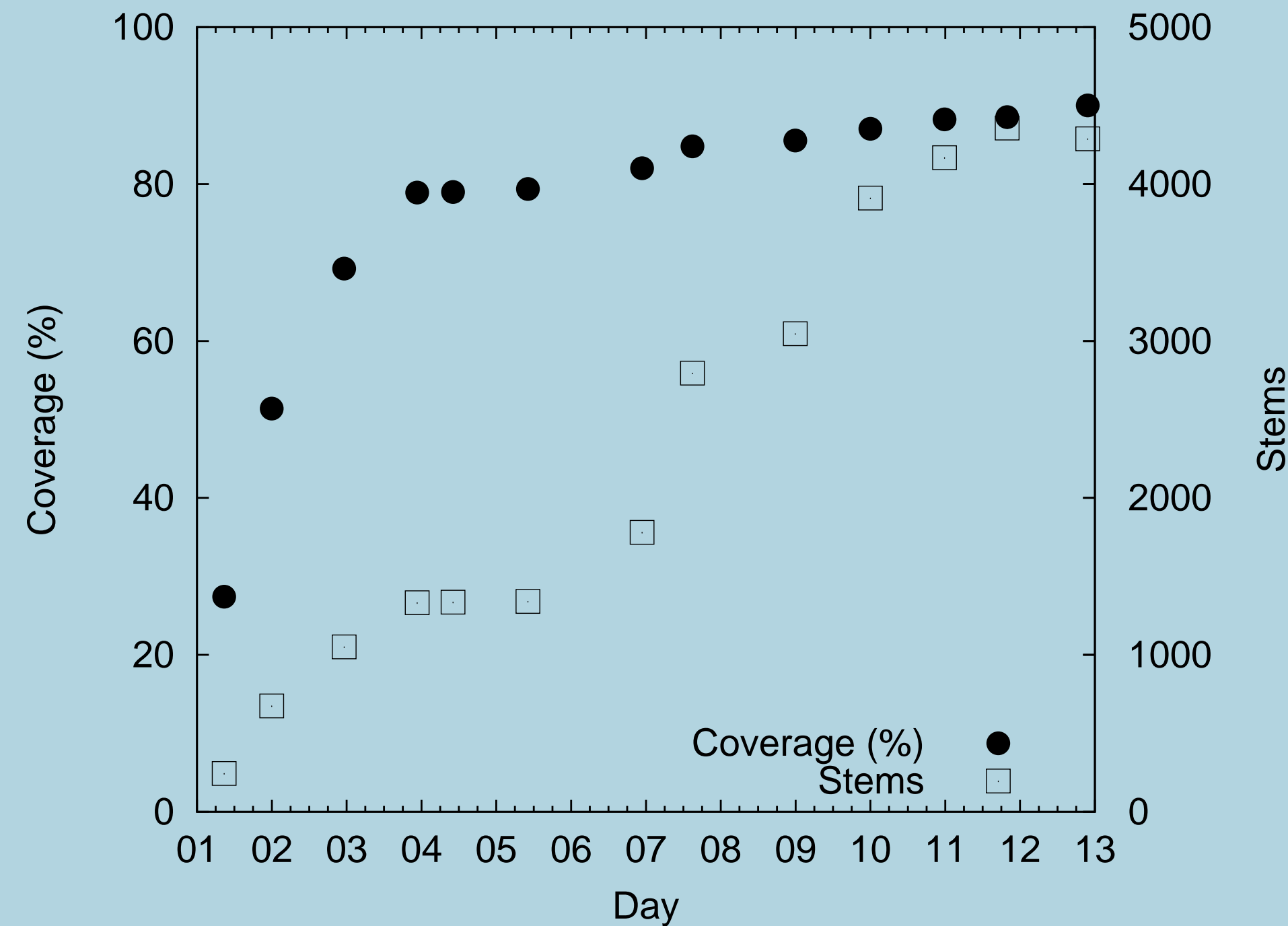
- Turkish (Çöltekin, 2010 & 2014; Öflazer, 1994)
- Crimean Tatar (Altıntaş, 2001)
- Turkmen (Tantuğ et al., 2006)
- Kyrgyz (Washington et al., 2012)
- Kazakh (Бекманова & Махимов, 2013)
- our Kazakh, Tatar, Kumyk: all GPL (=free and open)!

## Framework: HFST

- Reimplements Xerox FST formalisms (lexc & twol)
- Also provides a wrapper around popular free/open-source FST toolkits: SFST, OpenFST, and Foma

## Development effort

- Kumyk transducer based on Kazakh, Tatar transducers
- ~1 week to reach 80% coverage, +1 week to reach 90%



- Other Turkic transducers: 0-derivation (overgenerates)
- Our approach: categorization (e.g., adjectives, below)

| Type | Gloss   | <adj>(<comp>)  | <adj>(<comp>)<subst> | <adj>(<comp>)<advl> |
|------|---------|----------------|----------------------|---------------------|
| A1   | ‘good’  | яхшы (яхшырак) | яхшы (яхшырак)       | яхшы (яхшырак)      |
| A2   | ‘old’   | иске (искерек) | иске (искерек)       | — (—)               |
| A3   | ‘dead’  | үле (—)        | үле (—)              | — (—)               |
| A4   | ‘basic’ | төп (—)        | — (—)                | — (—)               |

- Part of Apertium Turkic project:  
[http://wiki.apertium.org/wiki/Apertium\\_Turkic](http://wiki.apertium.org/wiki/Apertium_Turkic)
- Transducers available live at [turkic.apertium.org](http://turkic.apertium.org)
- Source code available from apertium’s svn repo
- Turkic RBMT mailing list (>25 subscribers):  
[apertium-turkic@lists.sourceforge.net](mailto:apertium-turkic@lists.sourceforge.net)
- Feel free to post in any language!
- See our paper in the LREC 2014 proceedings
- And feel free to contact the authors any time!

## Gloss

(1) Құдай Өзінің жаратқандарының бәріне карап, өте жақсы екенін көрді.  
Аллаһ Үзе яратқан нәрсәләргә карап, аларның бик яхшы икәнен күрде.  
Аллаһь Озью яратгъан затлагъа къарап, олар бек яхшы экенин гёрген.  
God own-his created [everything/thing-s]-to looked.at, they/their very good being saw.  
‘God looked at everything he had created and saw that it was very good.’

## Output

| Kazakh (kaz)   | Tatar (tat)   | Kumyk (kum)  |
|--|---|--|
| Құдай Өзінің жаратқандарының бәріне қарап, өте жақсы екенін көрді.   | Аллаһ Үзе яратқан нәрсәләргә карап, аларның бик яхшы икәнен күрде.  | Аллаһь Озью яратгъан затлагъа къарап, олар бек яхшы экенин гёрген.   |
| Құдай<n><nom><br>Өз<prn><ref><px3sp><gen><br>жарат<v><tv><ger_past><pl><px3sp><gen><br>бәрі<prn><qnt><px3sp><dat><br>қара<v><tv><gna_perf><br>,<cm><br>—<br>өте<adv><br>жақсы<adj><br>е<cop><ger_past><px3sp><acc><br>көр<v><tv><ifi><p3><sg><br>,<sent> | Аллаһ<n><nom><br>Үз<prn><ref><px3sp><nom><br>ярат<v><tv><gpr_past><br>нәрсә<n><pl><dat><br>кара<v><tv><gna_perf><br>,<cm><br>алар<prn><pers><p3><pl><gen><br>бик<adv><br>яхшы<adj><br>и<cop><ger_past><px3sp><acc><br>күр<v><tv><past><p3><sg><br>,<sent> | Аллаһь<n><nom><br>Озь<prn><ref><px3sp><nom><br>ярат<v><tv><gpr_past><br>зат<n><pl><dat><br>къара<v><tv><gna_perf><br>,<cm><br>олар<prn><pers><p3><pl><nom><br>бек<adv><br>яхшы<adj><br>э<cop><ger_past><px3sp><acc><br>гёр<v><tv><past><p3><sg><br>,<sent> |

## Tagset

|       |              |       |              |        |                          |            |                                    |
|-------|--------------|-------|--------------|--------|--------------------------|------------|------------------------------------|
| <n>   | Noun         | <p3>  | Third person | <pers> | Personal                 | <px3sp>    | 3rd person poss. (Singular/Plural) |
| <v>   | Verb         | <pl>  | Plural       | <cm>   | Comma                    |            |                                    |
| <prn> | Pronoun      | <nom> | ‘Nominative’ | <sent> | Sentence                 | <gna_perf> | Verbal adverb (Perfect)            |
| <det> | Determiner   | <gen> | Genitive     | <past> | Past (General)           |            |                                    |
| <adj> | Adjective    | <acc> | Accusative   | <ifi>  | Past (Eyewitness/Recent) | <gpr_past> | Verbal adjective (Past)            |
| <adv> | Adverb       | <dat> | Dative       |        |                          | <ger_past> | Verbal noun (Past)                 |
| <iv>  | Intransitive | <qnt> | Quantifier   |        |                          |            |                                    |
| <tv>  | Transitive   | <ref> | Reflexive    |        |                          |            |                                    |

## Ambiguous characters

- Have front- and back-vowel readings in native words

|     | letters | values                               | examples  |
|-----|---------|--------------------------------------|---|
| kaz | и, у, ю | /əj, əw, jəw/<br>/əj, əw, jəw/       | қиюда ‘chopping down’<br>киюде ‘getting dressed’  |
| tat | е       | э / C _<br>/j/ +ы<br>/j/ +ә          | дәрәсләр ‘lessons’<br>еллар ‘years’<br>егетләр ‘boys’   |
| kum | ё, ю    | /ø, y/ / C _<br>/jø, jy/<br>/jo, ju/ | гюнлер ‘days’<br>гёзлер ‘eyes’<br>юреклер ‘hearts’<br>ёнкюлер ‘darlings’<br>юлдузлар ‘stars’<br>ёллар ‘roads’ |

- solution: hairy twol rules for majority of cases
- unaccounted-for words marked harmony-forcing char
- adjust rules for harmony-forcing characters

## Loanwords

- Letters that represent front vowels in native words may represent back vowels in Russian words

|     | native word example   | Russian word example        |
|-----|-----------------------|-----------------------------|
| kaz | елдін ‘country’s’     | Назарбаевтың ‘Nazarbayev’s’ |
| tat | галимнәр ‘scientists’ | артистлар ‘artists’         |
| kum | сёзлер ‘words’        | самолётлар ‘airplanes’      |

- solution: separate continuation lexicon (messy rules)

|                                   |
|-----------------------------------|
| LEXICON N1-RUS                    |
| :%{a%} N1 ;                       |
| LEXICON Nouns                     |
| артист:артист N1-RUS ; ! "artist" |
| галим:галим N1 ; ! "scientist"    |

## Acronyms and numerals

- twol rules handle phonology for spelled-out words  
отыздан ‘from thirty’, бесден ‘from five’
- no phonological triggers available in numerals (etc.)  
30-дан ‘from 30’, 5-тен ‘from 5’
- solution: phonology-triggering characters

4:4%{ə%}%{c%} NUM-DIGIT ; ! "төрт"  
5:5%{ə%}%{c%} NUM-DIGIT ; ! "бес"  
3%0:3%0%{a%}%{z%} NUM-DIGIT ; ! "отыз"

## A resulting messy twol rule

|   |
|---|
| RdYotVow = ё ю ё ю ;<br>AbstractVow = %{a%} %{ə%} %{y%} %{o%} ;<br>"A front unrounded harmony"<br>%{A%}:e <=> [ [ :FrontVow [ [ :Vow :ь ] ] :Cns :Cns* ]/:0 _ ;<br>[ [ :RdVow :ь ] ] :Cns :Cns* ]/:0 _ ;<br>[ [ [ [ \ .# . ] :Vow ] ] :RdYotVow ] :Cns :Cns* ]/:0 _ ;<br>[ [ :RdYotVow й:0 :RdYotVow :Cns :Cns* ]/:0 _ й:0 ] _ ;<br>[[%{ə%}:0%{y%}:0] :Cns* ]/[ [ :0 - AbstractVow: ]   %:- ]* _ ;<br>except<br>[ [ :RdYotVow :Cns* %{a%}:0 :Cns* ]/[ [ :0 - %{a%}:0 ] _ ;<br>[ [ :Cns :p %{a%}: %> :Cns* ]/:0 _ ;<br>[ [ :Vow - :RdYotVow ] :RdYotVow :Cns :Cns* ]/:0 _ ;<br>[ [ :Vow ]/[ [ :0 - й:0 ]   %>: ] _ ; |
|---|

## Number of stems

| Part of speech | Number of stems |       |       |
|----------------|-----------------|-------|-------|
|                | Kazakh          | Tatar | Kumyk |
| Noun           | 2640            | 2795  | 2568  |
| Verb           | 1470            | 1143  | 386   |
| Adjective      | 754             | 816   | 219   |
| Proper noun    | 5701            | 5361  | 1443  |
| Adverb         | 171             | 177   | 63    |
| Numeral        | 63              | 63    | 44    |
| Conjunction    | 46              | 45    | 13    |
| Postposition   | 50              | 43    | 12    |
| Pronoun        | 32              | 28    | 17    |
| Determiner     | 39              | 34    | 9     |
| Total:         | 11224           | 10737 | 4845  |

## Test corpora

|     | Wikipedia | News                | Religion                |
|-----|-----------|---------------------|-------------------------|
| kaz | Wikipedia | azattyk.org         | Quran + Bible           |
| tat | Wikipedia | tat.tatar-inform.ru | Quran + New Testament   |
| kum | —         | yoldash.etnosmi.ru  | Genesis + New Testament |

## Evaluation measures

- Naïve coverage - percentage of surface forms in a given corpus receiving ≥ 1 analysis
- Mean ambiguity - average number of analyses for each surface form found in analysed corpus
- Precision - of a form’s analyses, % correct
- Recall - % of analyses provided by transducer that are correct for a form, by comparing against a gold standard

## Evaluation results

|          | Corpus    | Tokens | Coverage (%)     | Amb. |
|----------|-----------|--------|------------------|------|
| Kazakh   | Wikipedia | 25.6M  | 85.61 $\pm$ 1.37 | 2.43 |
|          | News      | 3.8M   | 92.12 $\pm$ 2.72 | 2.88 |
|          | Religion  | 851K   | 92.49 $\pm$ 1.66 | 2.63 |
| (r50547) | Average   |        | 90.07 $\pm$ 1.91 | 2.64 |
| Tatar    | Wikipedia | 159K   | 86.35 $\pm$ 2.17 | 2.24 |
|          | News      | 5.2M   | 89.75 $\pm$ 0.07 | 2.30 |
|          | Religion  | 382K   | 91.25 $\pm$ 2.55 | 2.24 |
| (r50260) | Average   |        | 89.12 $\pm$ 1.60 | 2.26 |
| Kumyk    | News      | 286K   | 91.10 $\pm$ 0.86 | 1.53 |
|          | Religion  | 227K   | 92.47 $\pm$ 1.03 | 1.53 |
| (r50300) | Average   |        | 91.78 $\pm$ 0.94 | 1.53 |

- selected & proofed unique random surface forms from news corpora

| Language | Forms | Precision (%) | Recall (%) |
|----------|-------|---------------|------------|
| Kazakh   | 1000  | 98.61         | 57.98      |
| Tatar    | 1000  | 95.03         | 85.65      |
| Kumyk    | 500   | 96.57         | 69.11      |

- Disambiguation, more stems
- Machine translation between these languages
- Other Turkic lgs.: Nogay, Bashqort, Uzbek, Chuvash