

Translation Inference in PanLex

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PanLex



<http://panlex.org>

First PanLex Summer Internship

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Summary

- Translation inference in PanDictionary
- Responsibility for translation inference
- Translation inference in PanLem
- Future work

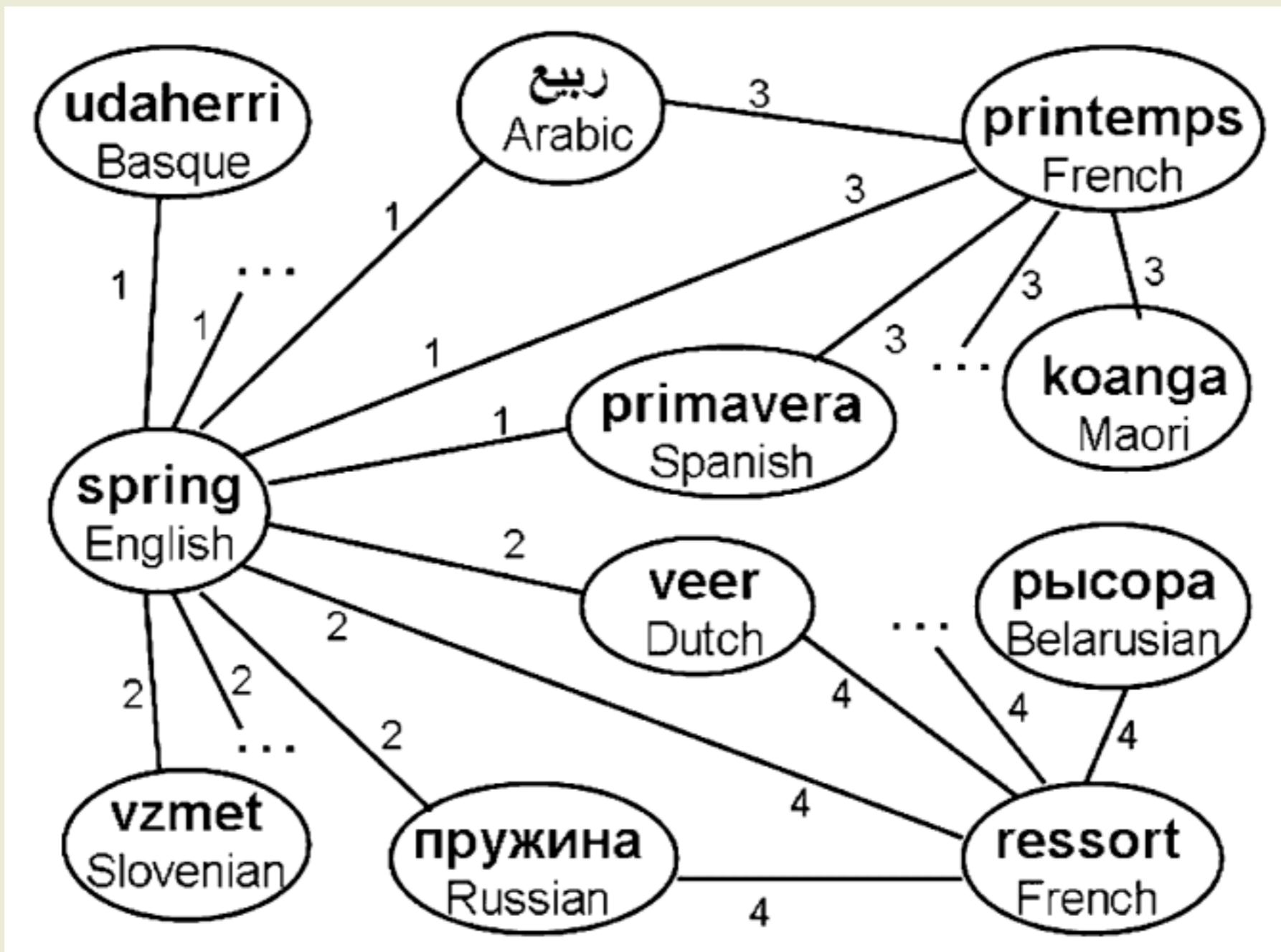
Translation inference in PanDictionary

TransGraph: Database from which PanLex was derived

PanDictionary: Translation-inference system based on
TransGraph:

- Mausam, Stephen Soderland, Oren Etzioni, Daniel S. Weld, Michael Skinner, and Jeff Bilmes, “[Compiling a Massive, Multilingual Dictionary via Probabilistic Inference](#)”, 2009.
- Mausam, Stephen Soderland, Oren Etzioni, Daniel S. Weld, Kobi Reiter, Michael Skinner, and Jeff Bilmes, “[Panlingual Lexical Translation via Probabilistic Inference](#)”, 2010.

Translation inference in PanDictionary



PanDictionary infers that meanings 1 and 3 are identical, so “udaherri” is a translation of “koanga”.

Responsibility for translation inference

- PanLex project:
 - ▶ Produces data on *direct* (attested) translations.
 - ▶ Provides basic inference for demonstration and exploration.
- Researchers and developers:
 - ▶ Investigate methods of inference from direct translations.
 - ▶ Produce state-of-the-art inference tools, applications, and services.

Translation inference in PanLem

PanLem:

- An expert UI for PanLex
- Provides basic translation inference

What kind of translation inference?

- Distance-2 indirect translation (1 intermediate expression).
- Heterogeneous (2 translations by distinct sources).

Why distance = 2?

- Complexity: 3+ expensive in time and storage.
- Validity: “Semantic drift” grows with distance.

Why heterogeneous?

- Validity: Semantic drift more likely if homogeneous.

Translation inference in PanLem

Indirect translation

Validity problem with homogeneous indirect translation:

- Example:

| English | Russian | French | German |
|---------|---------|--------|---------|
| world | мир | monde | Welt |
| peace | мир | paix | Frieden |

“world” = “мир” = “paix”, but “world” ≠ “paix”

Distinct entries in a source are usually semantically different.

Entries in distinct sources are less often so.

Translation inference in PanLem

Indirect translation

PanLem also estimates indirect-translation qualities. Method:

- Find all heterogeneous distance-2 paths between 2 expressions.
- For each, multiply its 2 sources' estimated qualities (0–9).
- Add the products.

Translation inference in PanLem

Best IO translations with scores

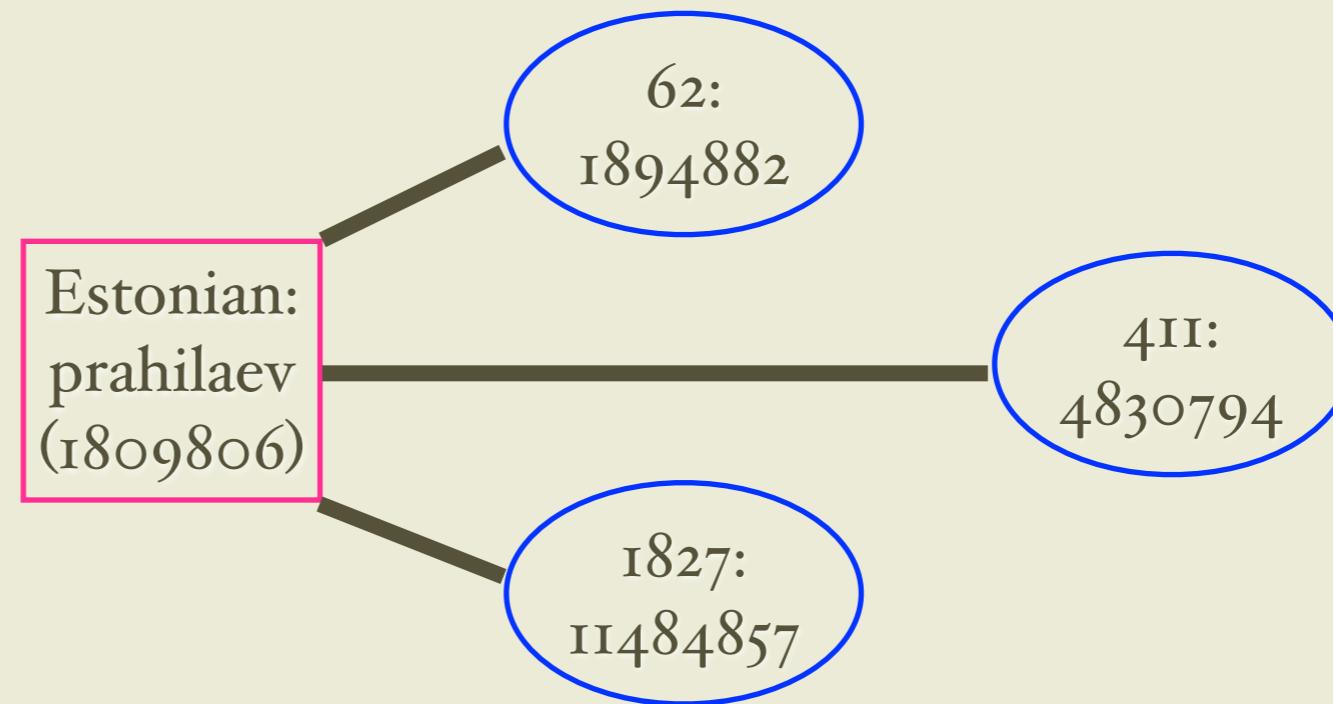
- Parameters
 - ▶ Expression to be translated: E
 - ▶ Language variety into which to translate it: L
 - ▶ Limit on the count of translations: N
- Example
 - ▶ E = Estonian: “prahilaev”
 - ▶ L = Russian
 - ▶ N = IO

Translation inference in PanLem

Best IO translations with scores

- Step 1. Create a table of the meanings of *E* and those meanings' sources.

| ap | mn |
|------|----------|
| 62 | 1894882 |
| 411 | 4830794 |
| 1827 | 11484857 |



```
$dbh->do(  
    'create temporary table temp0mn on commit drop as '  
    . "select ap, mn.mn from dn, mn where dn.ex = $_[0] and mn.mn = dn.mn"  
>;  
# Create a temporary table of all meanings of the specified expression and their sources.
```

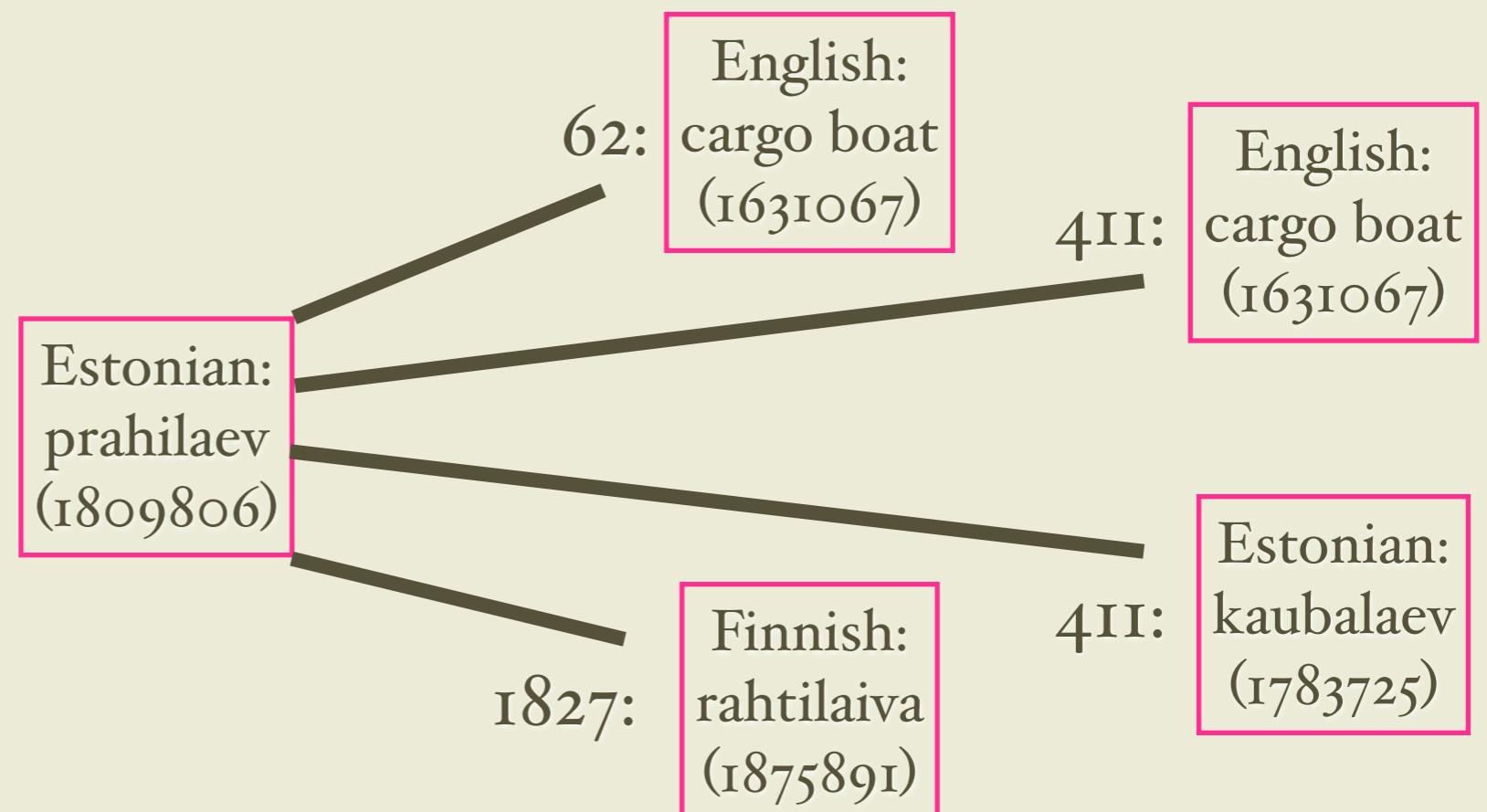
This and subsequent code is from subroutine TrtrQ in state file tvviz5w.pl

Translation inference in PanLem

Best 10 translations with scores

- Step 2. Create a table of the direct translations of *E* and their sources.

| ap | ex |
|------|---------|
| 62 | 1631067 |
| 411 | 1631067 |
| 411 | 1783725 |
| 1827 | 1875891 |



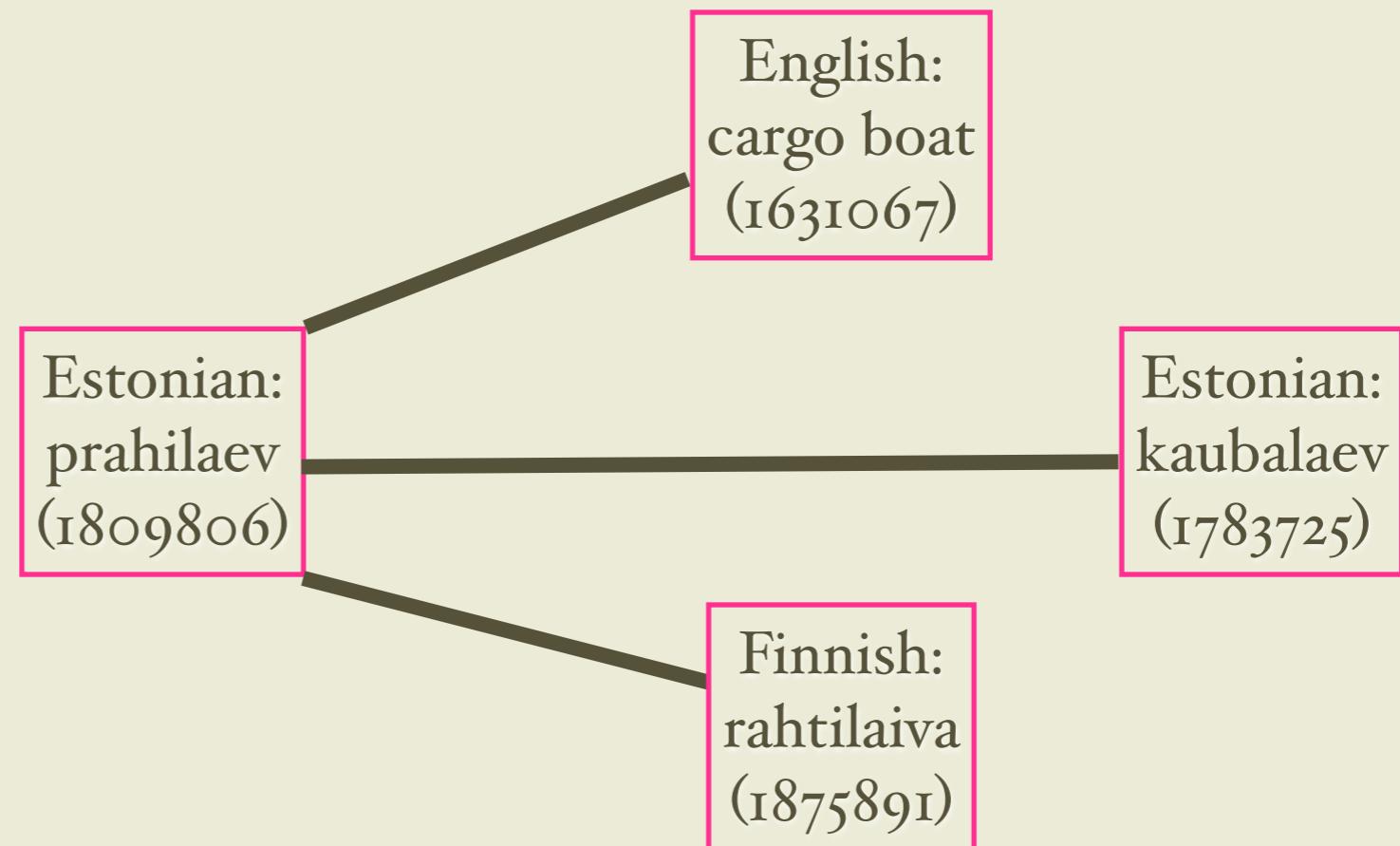
```
$dbh->do(
    'create temporary table temp0tr on commit drop as '
    . "select distinct ap, ex from temp0mn, dn where dn.mn = temp0mn.mn and ex != $_[0]"
);
# Create a temporary table of all distinct combinations of those meanings' sources and those
# sources' direct translations of the specified expression, i.e. expressions with those
# meanings except the specified expression.
```

Translation inference in PanLem

Best IO translations with scores

- Step 3. Create a table of the direct translations of E .

| ex |
|---------|
| 1631067 |
| 1783725 |
| 1875891 |

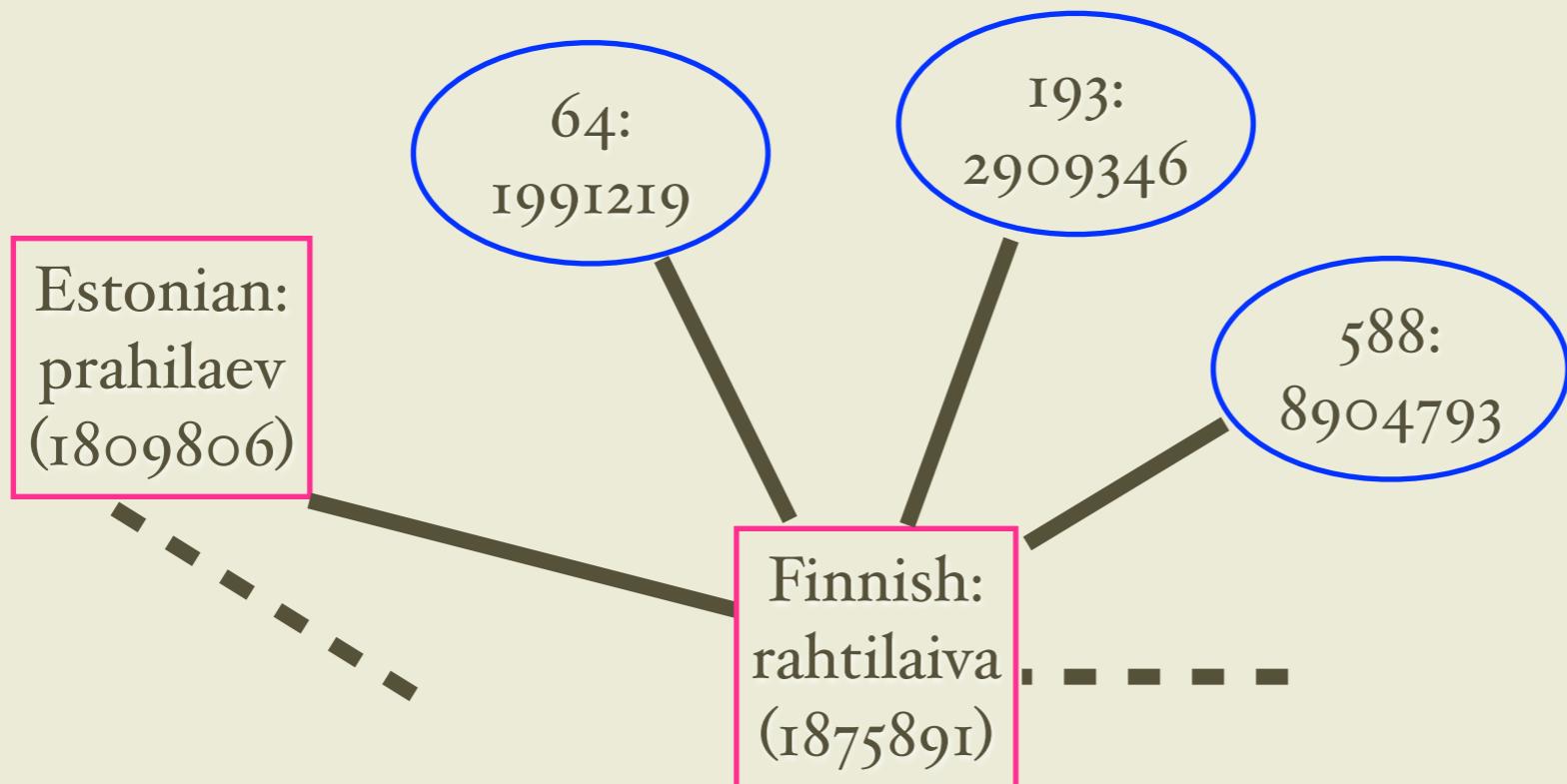


```
$dbh->do('create temporary table temp0ex on commit drop as select distinct ex from temp0tr');  
# Create a temporary table of all those distinct direct translations of the specified expression.
```

Translation inference in PanLem

Best 10 translations with scores

- Step 4. Create a table of the direct translations of E , their meanings, and their sources.



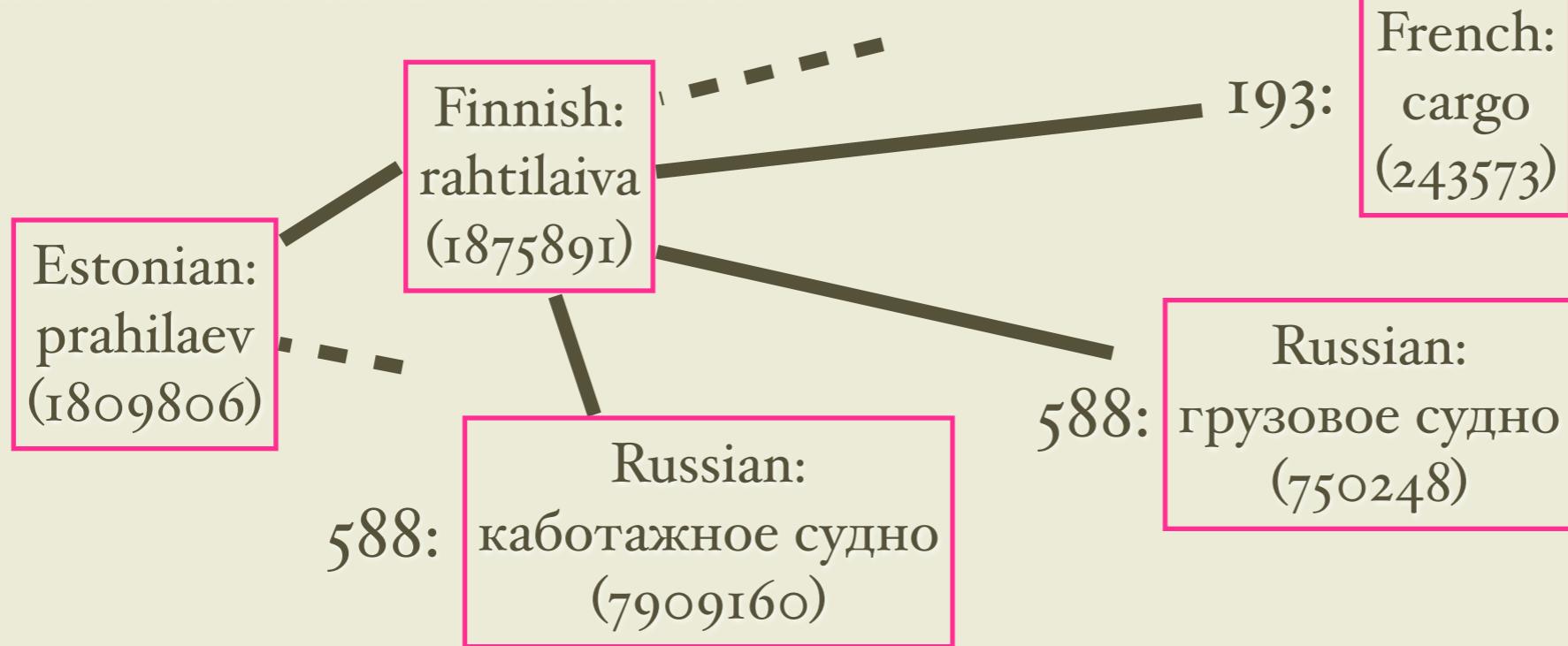
```
$dbh->do(
    'create temporary table temp1mn on commit drop as '
    . 'select dn.ex, ap, dn.mn from temp0ex, dn, mn '
    . 'where dn.ex = temp0ex.ex and mn.mn = dn.mn'
);
# Create a temporary table of those direct translations, all their meanings,
# and those meanings' sources.
```

| | ex | ap | mn |
|---------|------|----------|----|
| 1631067 | 62 | 1894882 | |
| 1631067 | 68 | 2046115 | |
| 1631067 | 116 | 2436134 | |
| 1631067 | 116 | 2449647 | |
| 1631067 | 123 | 2485030 | |
| 1631067 | 411 | 4830794 | |
| 1631067 | 422 | 5044265 | |
| 1631067 | 563 | 7340025 | |
| 1631067 | 571 | 7900041 | |
| 1631067 | 1523 | 18351618 | |
| 1631067 | 1890 | 14324463 | |
| 1631067 | 2562 | 17179450 | |
| 1631067 | 2566 | 17275450 | |
| 1783725 | 62 | 1883065 | |
| 1783725 | 62 | 1894885 | |
| 1783725 | 62 | 1894895 | |
| 1783725 | 62 | 1922661 | |
| 1783725 | 411 | 4821827 | |
| 1783725 | 411 | 4827719 | |
| 1783725 | 411 | 4830794 | |
| 1783725 | 411 | 4830797 | |
| 1783725 | 411 | 4830807 | |
| 1783725 | 411 | 4852058 | |
| 1783725 | 411 | 4868066 | |
| 1783725 | 411 | 4891307 | |
| 1783725 | 1827 | 11477382 | |
| 1875891 | 64 | 1991219 | |
| 1875891 | 193 | 2909346 | |
| 1875891 | 588 | 8904793 | |
| 1875891 | 1441 | 11716326 | |
| 1875891 | 1710 | 15489575 | |
| 1875891 | 1710 | 15493201 | |
| 1875891 | 1827 | 11484857 | |

Translation inference in PanLem

Best 10 translations with scores

- Step 5. Create a table of the direct translations of E , their direct translations other than E , and the latter translations' sources.



```
$dbh->do(
    'create temporary table temp1tr on commit drop as '
    . 'select distinct temp1mn.ex as ex1, ap, dn.ex as ex2 from temp1mn, dn '
    . "where dn.mn = temp1mn.mn and dn.ex != temp1mn.ex and dn.ex != ${_0}"
);
# Create a temporary table of all distinct combinations of those direct
# translations, their meanings' sources, and all their direct translations
# differing from both the specified expression and its direct translations.
```

| ex1 | ap | ex2 |
|---------|------|----------|
| 1631067 | 68 | 243573 |
| 1631067 | 116 | 2344398 |
| 1631067 | 116 | 2353233 |
| 1631067 | 123 | 2056015 |
| 1631067 | 411 | 1783725 |
| 1631067 | 422 | 7654272 |
| 1631067 | 563 | 750248 |
| 1631067 | 571 | 750248 |
| 1631067 | 1523 | 2056015 |
| 1631067 | 1890 | 13947545 |
| 1631067 | 2562 | 368212 |
| 1631067 | 2562 | 368215 |
| 1631067 | 2562 | 419960 |
| 1631067 | 2562 | 1131413 |
| 1631067 | 2562 | 12556265 |
| 1631067 | 2562 | 15730838 |
| 1631067 | 2566 | 12556265 |
| 1783725 | 62 | 342897 |
| 1783725 | 62 | 368212 |
| 1783725 | 62 | 419960 |
| 1783725 | 62 | 1631070 |
| 1783725 | 411 | 342897 |
| 1783725 | 411 | 360936 |
| 1783725 | 411 | 368212 |
| 1783725 | 411 | 419960 |
| 1783725 | 411 | 476971 |
| 1783725 | 411 | 599318 |
| 1783725 | 411 | 1046968 |
| 1783725 | 411 | 1631067 |
| 1783725 | 411 | 1631070 |
| 1783725 | 411 | 1779343 |
| 1783725 | 411 | 1783727 |
| 1783725 | 411 | 1783914 |
| 1783725 | 411 | 1783918 |
| 1783725 | 411 | 1809810 |
| 1783725 | 411 | 1820710 |
| 1783725 | 411 | 1824654 |
| 1783725 | 411 | 7600471 |
| 1783725 | 1827 | 232308 |
| 1875891 | 64 | 368212 |
| 1875891 | 193 | 243573 |
| 1875891 | 588 | 750248 |
| 1875891 | 588 | 7909160 |
| 1875891 | 1441 | 419960 |
| 1875891 | 1710 | 1433254 |
| 1875891 | 1710 | 14830495 |

Translation inference in PanLem

Best 10 translations with scores

- Step 6. Create a table of the sources and expressions producing the heterogeneous indirect translations of E in the specified language variety.

| ap0 | ex1 | ap | ex2 |
|-------------------------------------|--------------|-------------|-----|
| English: cargo boat (1631067) | 62 1631067 | 563 750248 | |
| | 62 1631067 | 571 750248 | |
| | 411 1631067 | 563 750248 | |
| | 411 1631067 | 571 750248 | |
| Finnish: rahtilaiva (1875891) | 1827 1875891 | 588 750248 | |
| | 1827 1875891 | 588 7909160 | |

English: cargo boat (1631067) → Russian: грузовое судно (750248)

Finnish: rahtilaiva (1875891) → Russian: каботажное судно (7909160)

```
$dbh->do(
    'create temporary table temp2tr on commit drop as '
    . 'select temp0tr.ap as ap0, temp1tr.* from temp0tr, temp1tr, ex where ex1 = temp0tr.ex '
    . "and temp1tr.ap != temp0tr.ap and ex.ex = ex2 and lv = $_[1]"
);
# Create a temporary table of the combinations of sources and expressions constituting
# 2-source, 2-hop translations of the specified expression into the specified variety.
```

Translation inference in PanLem

Best 10 translations with scores

- Step 7. Introduction.

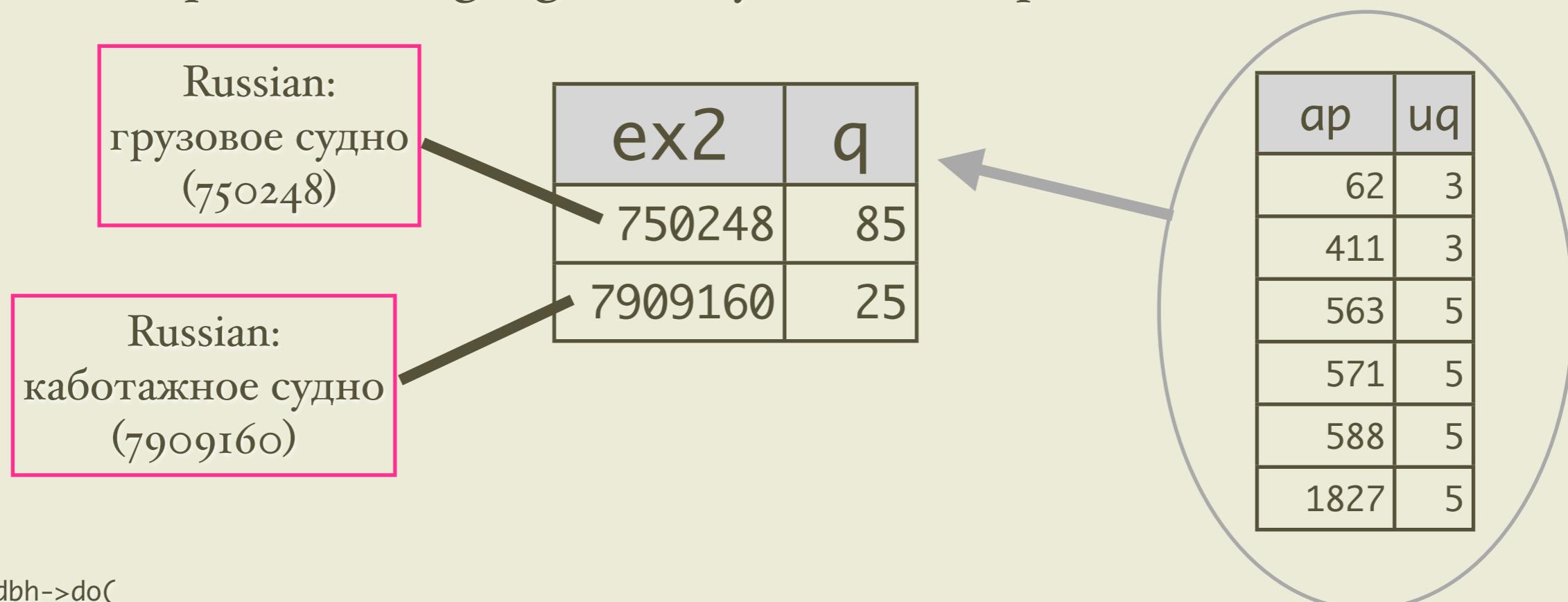
Heterogeneous indirect translation quality

Let E and G be expressions, let G be a heterogloss of E , let $\{A, B\}, \{C, D\}, \dots \{\Upsilon, Z\}$ be the source pairs of the heterogeneous indirect translations between E and G , and let $q(I)$ be the editor-estimated quality of source I . Then the *quality* of G as a heterogloss of E is $q(A)q(B) + q(C)q(D) + \dots + q(\Upsilon)q(Z)$.

Translation inference in PanLem

Best 10 translations with scores

- Step 7. Create a table of the heterogeneous indirect translations of E in the specified language variety and their qualities.



```
$dbh->do(  
    'create temporary table tempq on commit drop as '  
    . 'select ex2, sum (ap0.uq * ap1.uq) as q from temp2tr, ap as ap0, ap as ap1 '  
    . "where ap0.ap = ap0 and ap1.ap = temp2tr.ap group by ex2 order by q desc limit $_[2]"  
>;  
# Create a temporary table of those combinations' distinct target expressions and each one's  
# quality estimate, defined as the sum of the products of the estimated qualities of the 2  
# sources of the combinations with it as their target expression.
```

Translation inference in PanLem

Best 10 translations with scores

- Future improvements
 - ▶ Combine direct and indirect quality-rated translation
 - ▶ Divide uq by 10 or more to weight direct translations more
 - ▶ 3 user alternatives: all direct, all direct + indirect separately, best