Exercise 9

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First of all, obtain the most frequent translation word by word (assume here direct alignment) using python.

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at-voon { 'ok-voon ': 3}
bichat { 'ororok ': 2}
dat {'sprok': 5}
. {'.': 11, 'zanzanok': 1}
at-drubel {'ok-drubel': 1}
pippat { 'anok ': 2, 'drok ': 1}
rrat {'plok': 2}
totat {'erok': 1, 'wiwok': 2}
arrat {'izok': 2, 'crrrok': 1}
vat {'hihok': 2, 'izok': 1}
hilat {'ghirok': 1, 'clok': 1}
krat {'anok': 1, 'izok': 1}
sat {'brok': 1}
lat {'jok': 1, 'brok': 1}
jjat {'farok': 2}
quat {'izok': 2, 'jok': 1}
cat {'stok': 2}
wat {'lalok': 6}
eneat {'enemok': 1}
iat {'lalok': 1}
nnat { 'nok ': 3, 'mok': 1, 'rarok ': 1}
oloat {'kantok': 1}
at-yurp {'ok-yurp': 1}
gat {'nok': 1, 'mok': 1}
mat {'yorok': 1, 'hihok': 1}
bat {'ghirok': 1}
zanzanat {'yorok': 1}
forat {'nok': 1}
```

from this obtain initial vocabulary, assuming that words, which has only one translation and this translation was done more than once, it will be translation of this word. Also from statistics we can do some more conclusions: nnat will be translated to nok (because of highest rate of translations) and at-drubel \rightarrow ok-drubel, at-yurp \rightarrow ok-yurp by similarity.

Table 1: Initial vocabulary

Arcturian	Centauri	
at-voon	ok-voon	
bichat	ororok	
dat	sprok	
rrat	plok	
jjat	farok	
cat	stok	
wat	lalok	
nnat	nok	
at-yurp	ok-yurp	
at-drubei	ok-drubei	

Now we can go step by step through sentences and find intersection among possible translations.

1. Sentence 2:

pippat \rightarrow anok (only one word not in the initial vocabulary, so translation obtained directly)

2. Sentence 3:

otat \rightarrow erok, izok, hihok,ghirok arrat \rightarrow erok, izok, hihok,ghirok vat \rightarrow erok, izok, hihok,ghirok hilat \rightarrow erok, izok, hihok,ghirok

3. Sentence 4:

 $\operatorname{krat} \to \operatorname{drok}$, brok, jok $\operatorname{sat} \to \operatorname{drok}$, brok, jok $\operatorname{lat} \to \operatorname{deok}$, brok, jok

4. Sentence 5:

 $totat \rightarrow wiwok \text{ or izok}$ quat $\rightarrow wiwok \text{ or izok}$

5. Sentence 6:

krat \rightarrow izok or jok: from sentence 4 and 6 krat = jok quat \rightarrow izok, jok: according to previous obtained translation quat=izok

6. Return back to sentence 4 because of new vocabulary sat – $\+ \+$ drok, brok

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lat \rightarrow drok, brok
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7. Sentence 7 vat \rightarrow izok, enemok: from sentence 2 and current sentece 7 vat=izok eneat \rightarrow izok, enemok: eneat=enemok (because of vat translation)

8. Update sentence 3 according new translations:

 $totat \rightarrow erok$, hihok, ghirok

 $\operatorname{arrat} \to \operatorname{erok}$, hihok, ghirok

 $hilat \rightarrow erok$, hihok, ghirok

9. Sentence 8:

iat \rightarrow lalok, brok

lat \rightarrow lalok, brok: from sentence 4 and current lat=brok ==; iat=lalok

10. Sentence 9:

totat \to wiwok, kantok: from sentence 5 and current totat=wiwiok oloat \to wiwok,kantok from previous ==; oloat=kantok

11. Sentence 10:

gat \rightarrow mok, yorok, ghirok, clok

 $\mathrm{mat} \to \mathrm{mok}$, yorok, ghirok, clok

 $\mathrm{bat} \to \mathrm{mok}$, yorok, ghirok, clok

hilat → mok, yorok, ghirok, clok: from sentence 3 by intersection hilat=ghirok

12. Update sentence 3 with according new vocab:

totat \rightarrow erok, hihok

 $\operatorname{arrat} \to \operatorname{erok}$, hihok

13. Sentence 11:

arrat \rightarrow crrrok, hihok, yorok, zanzanok: from sentence 3 arrat=hihok == $\[\vdots \]$ totat=erok

 $\mathrm{mat} \to \mathrm{crrrok},\, \mathrm{yorok},\, \mathrm{zanzanok} \,\, (\mathrm{sent} \,\, 10$ - $\mathrm{yorok})$

 $zanzanat \rightarrow crrrok$, yorok, zanzanok

14. Sentence 12:

for at \rightarrow rarok, mok

gat \rightarrow rarok, mok: From sentence 10 gat=mok ==; forat=rarok

15. Update sentence 10:

bat = clock

16. Last translation

zanzanat → crrrok, zanzanok (by posotion assign zananat=zanzanok)

From this produce final vocabulary:

Table 2: Final vocabulary

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Arcturian	Centauri		
at-voon	ok-voon		
bichat	ororok		
dat	sprok		
rrat	plok		
jjat	farok		
cat	stok		
wat	lalok		
nnat	nok		
at-yurp	ok-yurp		
at-drubel	ok-drubel		
pippat	anok		
krat	jok		
quat	izok		
lat	brok		
iat	lalok		
vat	izok		
eneat	enemok		
totat	wiwok, erok		
oloat	kantok		
hilat	ghirok		
arrat	hihok		
mat	yorok		
gat	mok		
forat	rarok		
bat	clock		
zanzanat	zanzamok		

Translation according the vocabulary:

- direct: lalok brok anok enemok ghirok kantok ok-yurp
 There is no bigrams (enemok, ghirok) and (ghirok, kantok) =; change the
 order of enemok and ghirok
 Result: lalok brok anok ghirok enemok kantok ok-yurp
- 2. direct: wiwok/erok nok rarok hihok yorok clock From bigrams result: wiwok rarok nok hihok yorok clock
- 3. direct: lalok sprok izok stok ___ ok-drubel The missing word obtained from bigrams: vok Result: lalok sprok izok stok vok ok-drubel

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The error rates implemented in error_rates.py python file.

With punctuation (average error rate):

WER: 0.4778153295397505 PER: 0.4497648514271587

Without punctuation (average error rate):

WER: 0.5142105431874499 PRE: 0.4487520419983171

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(a)

IBM Model 2 addresses the issue of alignment with an explicit model for alignment based on the positions of the input and output words. The translation of a foreign input word in position i to an English word in position j is modeled by an alignment probability distribution

(b)

(c)

Add fertility model. Fertility of input words is modeled directly with a probability distribution $p(\phi|f)$.

For each foreign word f, this probability distribution indicates how many $\phi=0,1,2,\dots$ output words it usually translates to.

(d)

In IBM Model 4, each word is dependent on the previously aligned word and on the word classes of the surrounding words. That means that some words trigger reordering and creates a condition for how the reordering should be made

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The implementation is done in ibm1.py Top 30 english words with most probable translations (with vocabulary size 10000 woeds):

the	die 0.16	UNK 0.15	der 0.13
,	, 0.23	UNK 0.21	die 0.07
	. 0.27	UNK 0.16	die 0.09
of	UNK 0.22	der 0.14	, 0.09
to	, 0.18	zu 0.17	UNK 0.13
and	und 0.49	UNK 0.13	, 0.07
in	in 0.299	UNK 0.1405	, 0.07
a	UNK 0.16	eine 0.15	ein 0.12
that	dass 0.28	, 0.22	die 0.09
is	ist 0.39	. 0.09	, 0.08
0-0	UNK 0.29	@-@ 0.10	, 0.09
's	UNK 0.24999	der 0.15	die 0.09
for	für 0.39	UNK 0.13	die 0.08
"	" 0.72	UNK 0.08	, 0.04
-	- 0.75	UNK 0.05	die 0.02
it	es 0.28	, 0.13	sie 0.11
as	wie 0.20	als 0.19	UNK 0.12
be	werden 0.18	sein 0.17	, 0.10
on	auf 0.25	UNK 0.15	, 0.09
are	sind 0.36	, 0.09	UNK 0.098
with	mit 0.48	UNK 0.11	, 0.06
but	aber 0.39	doch 0.19	allerdings 0.06
by	durch 0.20	UNK 0.15	von:0.10
not	nicht 0.63	sondern 0.05	, 0.04
has	hat:0.43	UNK 0.07	. 0.07
have	haben 0.37	UNK 0.08	, 0.08
this	dies 0.16	diese 0.13	dieser 0.11
will	wird 0.41	werden 0.19	, 0.06
from	von 0.20	aus 0.20	UNK 0.13
its	seine 0.18	seiner 0.09	ihre 0.08