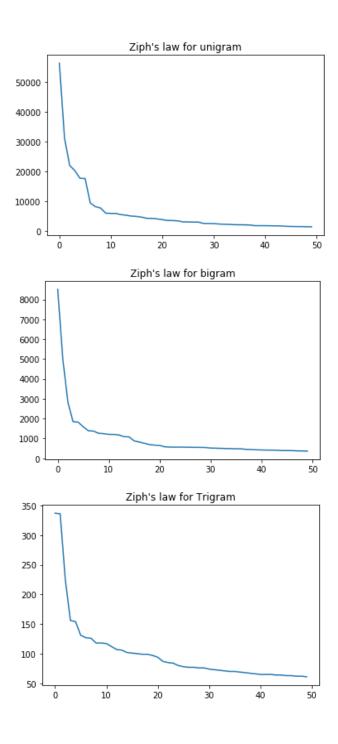
Language Modelling (Assignment 1)

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Task 1

• Ziph's law:



• Top 10 unigrams:

the	56448
	40000
<s></s>	40000
of	31276
and	22092
to	20341
а	17780
in	17705
is	9474
that	8240

Top 10 Bigrams:

of the	8508
<s> the</s>	5798
in the	4985
to the	2819
and the	1848
on the	1821
for the	1591
<s> in</s>	1585
<s> it</s>	1816
it is	1390

Top 10 Trigrams:

<s> <s> the</s></s>	5798
<s> <s> in</s></s>	1585
<s> <s> it</s></s>	1516
<s> <s> he</s></s>	1377
<s> <s> this</s></s>	1052
<s> <s> but</s></s>	1038
<s> <s> a</s></s>	955
<s> <s> and</s></s>	831
<s> <s> i</s></s>	675
<s> <s> they</s></s>	590

Results:

For Unigram

For sentence.. he lived a good life

probability: 6.31579394802e-15 log-likelihood: -14.1995720472 Perplexity: 691.69463863

For sentence.. the man was happy

probability: 3.83848564498e-11 log-likelihood: -10.4158400792 Perplexity: 401.753824571

For sentence.. the person was good

probability: 7.51041309361e-11 log-likelihood: -10.1243361749 Perplexity: 339.691002502

For sentence.. the girl was sad

For sentence.. he won the war

probability: 2.00987358508e-11 log-likelihood: -10.6968312575 Perplexity: 472.288982341

For Bigram

For sentence.. he lived a good life

probability: 2.37783822206e-12 log-likelihood: -11.6238176963 Perplexity: 211.233861956

For sentence.. the man was happy

probability: 2.88943840323e-10 log-likelihood: -9.53918655935 Perplexity: 242.547409099

For sentence.. the person was good

probability: 1.70995361896e-11 log-likelihood: -10.7670156693 Perplexity: 491.760812118

For sentence.. the girl was sad

probability: 1.70995361896e-11 log-likelihood: Inf Perplexity:Inf

For sentence.. he won the war

probability: 8.28700074926e-10 log-likelihood: -9.08160262189 Perplexity: 186.380578535

For Trigram

For sentence.. he lived a good life

probability: 8.28700074926e-10 log-likelihood: Inf Perplexity:Inf

For sentence.. the man was happy

probability: 8.28700074926e-10 log-likelihood: Inf Perplexity:Inf

For sentence.. the person was good

probability: 8.28700074926e-10 log-likelihood: Inf Perplexity:Inf

For sentence.. the girl was sad

probability: 8.28700074926e-10 log-likelihood: Inf Perplexity:Inf

For sentence.. he won the war

probability: 8.28700074926e-10 log-likelihood: Inf Perplexity:Inf

Task 2:

For Unigram

For k = 0.0001

For sentence.. he lived a good life

probability: 6.3156424219e-15 log-likelihood: -14.1995824668 Perplexity: 691.697957653

For sentence.. the man was happy

probability: 3.83841299156e-11 log-likelihood: -10.4158482995 Perplexity: 401.755725655

For sentence.. the person was good

For sentence.. the girl was sad

For sentence.. he won the war

probability: 2.00983541843e-11 log-likelihood: -10.6968395047 Perplexity: 472.29122451

For k = 0.001

For sentence.. he lived a good life

probability: 6.31427888826e-15 log-likelihood: -14.1996762402 Perplexity: 691.727828743

For sentence.. the man was happy

probability: 3.83775919093e-11 log-likelihood: -10.4159222796 Perplexity: 401.772835338

For sentence.. the person was good

probability: 7.50891593486e-11 log-likelihood: -10.1244227577 Perplexity: 339.707933486

For sentence.. the girl was sad

For sentence.. he won the war

probability: 2.00949196076e-11	log-likelihood: -10.6969137269	Perplexity: 472.311403944
For k= 0.01 For sentence he lived a good life probability: 6.30066346575e-15	log-likelihood: -14.2006137165	Perplexity: 692.026528598
For sentence the man was happy probability: 3.83122910912e-11	log-likelihood: -10.4166618762	Perplexity: 401.943924965
For sentence the person was goo probability: 7.49545858027e-11 For sentence the girl was sad	log-likelihood: -10.1252017914	Perplexity: 339.860308933
probability: 1.50401765742e-12 For sentence he won the war	log-likelihood: -11.822747065	Perplexity: 902.997953916
probability: 2.00606155941e-11	log-likelihood: -10.697655744	Perplexity: 472.513189843
For k= 0.1 For sentence he lived a good life probability: 6.16647766171e-15	log-likelihood: -14.2099628374	Perplexitv: 695.01242304
For sentence the man was happy		
probability: 3.76671290546e-11 For sentence the person was goo		Perplexity: 403.654101792
probability: 7.36255821705e-11 For sentence the girl was sad	log-likelihood: -10.1329712581	Perplexity: 341.383726303
probability: 1.48535363493e-12 For sentence he won the war	log-likelihood: -11.8281701366	Perplexity: 905.821311355
probability: 1.97217093176e-11	log-likelihood: -10.7050554466	Perplexity: 474.53020513
For k= 1		
For sentence he lived a good life probability: 5.000612657e-15 For sentence the man was happy	log-likelihood: -14.3009767842	Perplexity: 724.76190333
probability: 3.19281231757e-11 For sentence the person was goo	log-likelihood: -10.4958266098	Perplexity: 420.684637146
probability: 6.18516058945e-11	log-likelihood: -10.20864902	Perplexity: 356.584330571
For sentence the girl was sad probability: 1.31511720174e-12	log-likelihood: -11.8810355416	Perplexity: 933.810784827
For sentence he won the war probability: 1.67080125936e-11	log-likelihood: -10.7770752061	Perplexity: 494.616729534
For Bigram		
For k= 0.0001 For sentence he lived a good life		
probability: 1.58008582943e-21 For sentence the man was happy	log-likelihood: -20.8013193218	Perplexity: 14463.182436
probability: 1.2294491527e-19 log	g-likelihood: -18.910289428 Perp	olexity: 53403.824129
For sentence the person was goo probability: 1.13480298836e-20	a log-likelihood: -19.9450795292	Perplexity: 96887.9757234
For sentence the girl was sad probability: 7.57238354186e-23	log-likelihood: -22.1207673971	Perplexity: 338993.873368

For sentence.. he won the war

probability: 6.43868815942e-19	log-likelihood: -18.1912026083	Perplexity: 35302.109042

For k= 0.001		
For sentence he lived a good life		
probability: 2.22934374909e-22	log-likelihood: -21.6518229612 Perplexity: 21397.5767224	
For sentence the man was happy	log intellineda. 21.0010220012 1 olploxity. 21001.0101221	
probability: 8.24147478332e-20	log-likelihood: -19.0839950659 Perplexity: 59019.9403814	
For sentence the person was goo	• •	
probability: 3.74391660904e-21	log-likelihood: -20.4266738332 Perplexity: 127840.499336	
For sentence the girl was sad		
probability: 2.19866352726e-23	log-likelihood: -22.6578412279 Perplexity: 461806.782402	
For sentence he won the war		
probability: 1.41883121111e-19	log-likelihood: -18.8480692666 Perplexity: 51524.9188731	
For k= 0.01		
For sentence he lived a good life		
probability: 3.24713855941e-24	log-likelihood: -23.4884991791 Perplexity: 49853.9800796	
For sentence the man was happy		
probability: 1.3374480405e-20 log	n-likelihood: -19.8737230812 Perplexity: 92988.8271985	
For sentence the person was goo	d	
probability: 3.18534759617e-22	log-likelihood: -21.496843169 Perplexity: 236706.831581	
For sentence the girl was sad		
probability: 2.59082348343e-24	log-likelihood: -23.5865621751 Perplexity: 788207.465164	
For sentence he won the war		
probability: 9.86706241699e-21	log-likelihood: -20.0058121245 Perplexity: 100335.133102	
,	, ,	
For k= 0.1		
For k= 0.1 For sentence, he lived a good life.		
For sentence he lived a good life	log-likelihood: -26 4056004509. Perpleyity: 191038 144011	
For sentence he lived a good life probability: 3.93006333315e-27	log-likelihood: -26.4056004509 Perplexity: 191038.144011	
For sentence he lived a good life probability: 3.93006333315e-27 For sentence the man was happy		
For sentence he lived a good life probability: 3.93006333315e-27 For sentence the man was happy probability: 2.48623706383e-22	log-likelihood: -21.6044574635 Perplexity: 251834.001302	
For sentence he lived a good life probability: 3.93006333315e-27 For sentence the man was happy probability: 2.48623706383e-22 For sentence the person was goo	log-likelihood: -21.6044574635 Perplexity: 251834.001302 d	
For sentence he lived a good life probability: 3.93006333315e-27 For sentence the man was happy probability: 2.48623706383e-22 For sentence the person was goo probability: 5.57308739996e-24	log-likelihood: -21.6044574635 Perplexity: 251834.001302	
For sentence he lived a good life probability: 3.93006333315e-27 For sentence the man was happy probability: 2.48623706383e-22 For sentence the person was goo probability: 5.57308739996e-24 For sentence the girl was sad	log-likelihood: -21.6044574635 Perplexity: 251834.001302 d log-likelihood: -23.2539041461 Perplexity: 650842.697677	
For sentence he lived a good life probability: 3.93006333315e-27 For sentence the man was happy probability: 2.48623706383e-22 For sentence the person was goo probability: 5.57308739996e-24 For sentence the girl was sad probability: 1.82997270951e-25	log-likelihood: -21.6044574635 Perplexity: 251834.001302 d	
For sentence he lived a good life probability: 3.93006333315e-27 For sentence the man was happy probability: 2.48623706383e-22 For sentence the person was goo probability: 5.57308739996e-24 For sentence the girl was sad probability: 1.82997270951e-25 For sentence he won the war	log-likelihood: -21.6044574635 Perplexity: 251834.001302 d log-likelihood: -23.2539041461 Perplexity: 650842.697677 log-likelihood: -24.7375553869 Perplexity: 1528934.38105	
For sentence he lived a good life probability: 3.93006333315e-27 For sentence the man was happy probability: 2.48623706383e-22 For sentence the person was goo probability: 5.57308739996e-24 For sentence the girl was sad probability: 1.82997270951e-25	log-likelihood: -21.6044574635 Perplexity: 251834.001302 d log-likelihood: -23.2539041461 Perplexity: 650842.697677	
For sentence he lived a good life probability: 3.93006333315e-27 For sentence the man was happy probability: 2.48623706383e-22 For sentence the person was goo probability: 5.57308739996e-24 For sentence the girl was sad probability: 1.82997270951e-25 For sentence he won the war	log-likelihood: -21.6044574635 Perplexity: 251834.001302 d log-likelihood: -23.2539041461 Perplexity: 650842.697677 log-likelihood: -24.7375553869 Perplexity: 1528934.38105	
For sentence he lived a good life probability: 3.93006333315e-27 For sentence the man was happy probability: 2.48623706383e-22 For sentence the person was goo probability: 5.57308739996e-24 For sentence the girl was sad probability: 1.82997270951e-25 For sentence he won the war	log-likelihood: -21.6044574635 Perplexity: 251834.001302 d log-likelihood: -23.2539041461 Perplexity: 650842.697677 log-likelihood: -24.7375553869 Perplexity: 1528934.38105	
For sentence he lived a good life probability: 3.93006333315e-27 For sentence the man was happy probability: 2.48623706383e-22 For sentence the person was goo probability: 5.57308739996e-24 For sentence the girl was sad probability: 1.82997270951e-25 For sentence he won the war probability: 1.47551588312e-22	log-likelihood: -21.6044574635 Perplexity: 251834.001302 d log-likelihood: -23.2539041461 Perplexity: 650842.697677 log-likelihood: -24.7375553869 Perplexity: 1528934.38105	
For sentence he lived a good life probability: 3.93006333315e-27 For sentence the man was happy probability: 2.48623706383e-22 For sentence the person was goo probability: 5.57308739996e-24 For sentence the girl was sad probability: 1.82997270951e-25 For sentence he won the war probability: 1.47551588312e-22 For k= 1	log-likelihood: -21.6044574635 Perplexity: 251834.001302 d log-likelihood: -23.2539041461 Perplexity: 650842.697677 log-likelihood: -24.7375553869 Perplexity: 1528934.38105	
For sentence he lived a good life probability: 3.93006333315e-27 For sentence the man was happy probability: 2.48623706383e-22 For sentence the person was good probability: 5.57308739996e-24 For sentence the girl was sad probability: 1.82997270951e-25 For sentence he won the war probability: 1.47551588312e-22 For k= 1 For sentence he lived a good life	log-likelihood: -21.6044574635 Perplexity: 251834.001302 dd log-likelihood: -23.2539041461 Perplexity: 650842.697677 log-likelihood: -24.7375553869 Perplexity: 1528934.38105 log-likelihood: -21.8310561112 Perplexity: 286922.117836	
For sentence he lived a good life probability: 3.93006333315e-27 For sentence the man was happy probability: 2.48623706383e-22 For sentence the person was goo probability: 5.57308739996e-24 For sentence the girl was sad probability: 1.82997270951e-25 For sentence he won the war probability: 1.47551588312e-22 For k= 1 For sentence he lived a good life probability: 2.46538077359e-30 For sentence the man was happy	log-likelihood: -21.6044574635 Perplexity: 251834.001302 dd log-likelihood: -23.2539041461 Perplexity: 650842.697677 log-likelihood: -24.7375553869 Perplexity: 1528934.38105 log-likelihood: -21.8310561112 Perplexity: 286922.117836 log-likelihood: -29.6081159952 Perplexity: 834878.349871	
For sentence he lived a good life probability: 3.93006333315e-27 For sentence the man was happy probability: 2.48623706383e-22 For sentence the person was goo probability: 5.57308739996e-24 For sentence the girl was sad probability: 1.82997270951e-25 For sentence he won the war probability: 1.47551588312e-22 For k= 1 For sentence he lived a good life probability: 2.46538077359e-30 For sentence the man was happy probability: 9.0780623742e-25	log-likelihood: -21.6044574635 Perplexity: 251834.001302 dd log-likelihood: -23.2539041461 Perplexity: 650842.697677 log-likelihood: -24.7375553869 Perplexity: 1528934.38105 log-likelihood: -21.8310561112 Perplexity: 286922.117836 log-likelihood: -29.6081159952 Perplexity: 834878.349871 d-likelihood: -24.0420068376 Perplexity: 1024475.81268	
For sentence he lived a good life probability: 3.93006333315e-27 For sentence the man was happy probability: 2.48623706383e-22 For sentence the person was goo probability: 5.57308739996e-24 For sentence the girl was sad probability: 1.82997270951e-25 For sentence he won the war probability: 1.47551588312e-22 For k= 1 For sentence he lived a good life probability: 2.46538077359e-30 For sentence the man was happy probability: 9.0780623742e-25 log For sentence the person was good	log-likelihood: -21.6044574635 Perplexity: 251834.001302 dd log-likelihood: -23.2539041461 Perplexity: 650842.697677 log-likelihood: -24.7375553869 Perplexity: 1528934.38105 log-likelihood: -21.8310561112 Perplexity: 286922.117836 log-likelihood: -29.6081159952 Perplexity: 834878.349871 g-likelihood: -24.0420068376 Perplexity: 1024475.81268 dd	
For sentence he lived a good life probability: 3.93006333315e-27 For sentence the man was happy probability: 2.48623706383e-22 For sentence the person was good probability: 5.57308739996e-24 For sentence the girl was sad probability: 1.82997270951e-25 For sentence he won the war probability: 1.47551588312e-22 For k= 1 For sentence he lived a good life probability: 2.46538077359e-30 For sentence the man was happy probability: 9.0780623742e-25 For sentence the person was good probability: 3.35027830407e-26	log-likelihood: -21.6044574635 Perplexity: 251834.001302 dd log-likelihood: -23.2539041461 Perplexity: 650842.697677 log-likelihood: -24.7375553869 Perplexity: 1528934.38105 log-likelihood: -21.8310561112 Perplexity: 286922.117836 log-likelihood: -29.6081159952 Perplexity: 834878.349871 d-likelihood: -24.0420068376 Perplexity: 1024475.81268	
For sentence he lived a good life probability: 3.93006333315e-27 For sentence the man was happy probability: 2.48623706383e-22 For sentence the person was good probability: 5.57308739996e-24 For sentence the girl was sad probability: 1.82997270951e-25 For sentence he won the war probability: 1.47551588312e-22 For k= 1 For sentence he lived a good life probability: 2.46538077359e-30 For sentence the man was happy probability: 9.0780623742e-25 For sentence the person was good probability: 3.35027830407e-26 For sentence the girl was sad	log-likelihood: -21.6044574635 Perplexity: 251834.001302 dd log-likelihood: -23.2539041461 Perplexity: 650842.697677 log-likelihood: -24.7375553869 Perplexity: 1528934.38105 log-likelihood: -21.8310561112 Perplexity: 286922.117836 log-likelihood: -29.6081159952 Perplexity: 834878.349871 g-likelihood: -24.0420068376 Perplexity: 1024475.81268 dd log-likelihood: -25.4749191151 Perplexity: 2337382.44952	
For sentence he lived a good life probability: 3.93006333315e-27 For sentence the man was happy probability: 2.48623706383e-22 For sentence the person was good probability: 5.57308739996e-24 For sentence the girl was sad probability: 1.82997270951e-25 For sentence he won the war probability: 1.47551588312e-22 For k= 1 For sentence he lived a good life probability: 2.46538077359e-30 For sentence the man was happy probability: 9.0780623742e-25 For sentence the person was good probability: 3.35027830407e-26 For sentence the girl was sad probability: 6.32850487942e-27	log-likelihood: -21.6044574635 Perplexity: 251834.001302 dd log-likelihood: -23.2539041461 Perplexity: 650842.697677 log-likelihood: -24.7375553869 Perplexity: 1528934.38105 log-likelihood: -21.8310561112 Perplexity: 286922.117836 log-likelihood: -29.6081159952 Perplexity: 834878.349871 g-likelihood: -24.0420068376 Perplexity: 1024475.81268 dd	
For sentence he lived a good life probability: 3.93006333315e-27 For sentence the man was happy probability: 2.48623706383e-22 For sentence the person was good probability: 5.57308739996e-24 For sentence the girl was sad probability: 1.82997270951e-25 For sentence he won the war probability: 1.47551588312e-22 For k= 1 For sentence he lived a good life probability: 2.46538077359e-30 For sentence the man was happy probability: 9.0780623742e-25 For sentence the person was good probability: 3.35027830407e-26 For sentence the girl was sad	log-likelihood: -21.6044574635 Perplexity: 251834.001302 dd log-likelihood: -23.2539041461 Perplexity: 650842.697677 log-likelihood: -24.7375553869 Perplexity: 1528934.38105 log-likelihood: -21.8310561112 Perplexity: 286922.117836 log-likelihood: -29.6081159952 Perplexity: 834878.349871 g-likelihood: -24.0420068376 Perplexity: 1024475.81268 dd log-likelihood: -25.4749191151 Perplexity: 2337382.44952	

For Trigram

probability: 1.62498261755e-33

For k = 0.0001For sentence.. he lived a good life probability: 5.62434468386e-38 log-likelihood: -37.2499280718 Perplexity: 28182895.7618 For sentence.. the man was happy probability: 2.74225843469e-31 log-likelihood: -30.561891619 Perplexity: 43699141.4719 For sentence.. the person was good probability: 1.3432921425e-35 log-likelihood: -34.8718295256 Perplexity: 522344927.24 For sentence.. the girl was sad probability: 1.1336777668e-31 log-likelihood: -30.9455103705 Perplexity: 54497627.062 For sentence.. he won the war probability: 1.07198068772e-27 log-likelihood: -26.9698130386 Perplexity: 5526539.26124 For k = 0.001For sentence.. he lived a good life probability: 1.63463227777e-38 log-likelihood: -37.7865799297 Perplexity: 36084108.9918 For sentence.. the man was happy probability: 5.86743990639e-32 log-likelihood: -31.2315513497 Perplexity: 64252175.5729 For sentence.. the person was good probability: 1.3432921425e-35 log-likelihood: -34.8718295256 Perplexity: 522344927.24 For sentence.. the girl was sad probability: 1.32020942703e-32 log-likelihood: -31.8793571705 Perplexity: 93290902.1001 For sentence.. he won the war probability: 1.31349038456e-29 log-likelihood: -28.8815731021 Perplexity: 16610904.2764 For k = 0.01For sentence.. he lived a good life probability: 2.03714919086e-39 log-likelihood: -38.6909771642 Perplexity: 54726217.5885 For sentence.. the man was happy probability: 6.63375112737e-33 log-likelihood: -32.1782408256 Perplexity: 110805216.437 For sentence.. the person was good probability: 1.3432921425e-35 log-likelihood: -34.8718295256 Perplexity: 522344927.24 For sentence.. the girl was sad probability: 1.35421953896e-33 log-likelihood: -32.8683109244 Perplexity: 164845741.011 For sentence.. he won the war probability: 1.36691937578e-31 log-likelihood: -30.8642571004 Perplexity: 52007296.1063 For k = 0.1For sentence.. he lived a good life probability: 2.27210310541e-40 log-likelihood: -39.6435719647 Perplexity: 84862220.821 For sentence.. the man was happy log-likelihood: -33.1648883139 Perplexity: 195533907.179 probability: 6.84087549214e-34 For sentence.. the person was good probability: 1.3432921425e-35 log-likelihood: -34.8718295256 Perplexity: 522344927.24 For sentence.. the girl was sad probability: 1.47734802349e-34 log-likelihood: -33.8305171845 Perplexity: 286833119.469 For sentence.. he won the war

log-likelihood: -32.7891512803 Perplexity: 157502633.621

For k=1

For sentence.. he lived a good life

probability: 4.1410682511e-41 log-likelihood: -40.3828876116 Perplexity: 119282716.858

For sentence.. the man was happy

probability: 8.05858492971e-35 log-likelihood: -34.0937412127 Perplexity: 333760781.134

For sentence.. the person was good

probability: 1.3432921425e-35 log-likelihood: -34.8718295256 Perplexity: 522344927.24

For sentence.. the girl was sad

probability: 2.68653457976e-35 log-likelihood: -34.570807565 Perplexity: 439240008.481

For sentence.. he won the war

probability: 5.37303602316e-35 log-likelihood: -34.2697802477 Perplexity: 369355918.035

Task 4:

For lamda = 0.2

For sentence.. he lived a good life

probability: 1.0732086659e-13 log-likelihood: -12.9693158292 Perplexity: 392.521243338

For sentence.. the man was happy

probability: 1.21661485434e-09 log-likelihood: -8.9148468853 Perplexity: 169.321349562

For sentence.. the person was good

probability: 2.41687507101e-10 log-likelihood: -9.61674579782 Perplexity: 253.621723478

For sentence.. the girl was sad

probability: 1.05573937824e-09 log-likelihood: -8.9764432793 Perplexity: 175.432810028

For sentence.. he won the war

probability: 3.76308204424e-09 log-likelihood: -8.42445631291 Perplexity: 127.67741412

For lamda = 0.5

For sentence.. he lived a good life

probability: 1.19344118558e-12 log-likelihood: -11.9231989788 Perplexity: 242.459829682

For sentence.. the man was happy

probability: 6.91848307481e-09 log-likelihood: -8.15998911717 Perplexity: 109.64713271

For sentence.. the person was good

probability: 1.42574518904e-09 log-likelihood: -8.8459580852 Perplexity: 162.738204953

For sentence.. the girl was sad

probability: 6.34406984773e-09 log-likelihood: -8.19763204411 Perplexity: 112.049006727

For sentence.. he won the war

probability: 2.41164040854e-08 log-likelihood: -7.61768744787 Perplexity: 80.2457170216

For lamda = 0.8

For sentence.. he lived a good life

probability: 2.62707518982e-12 log-likelihood: -11.580527497 Perplexity: 207.064429144

For sentence.. the man was happy

probability: 5.52207825154e-09 log-likelihood: -8.25789744341 Perplexity: 116.004372942

For sentence.. the person was good

probability: 1.14583988759e-09 log-likelihood: -8.94087606369 Perplexity: 171.877495165

For sentence.. the girl was sad

probability: 4.17517182855e-09 log-likelihood: -8.37932564649 Perplexity: 124.403159854

For sentence.. he won the war

probability: 1.95152712135e-08 log-likelihood: -7.70962540873 Perplexity: 84.6070109289