

Guide for Reproducibility of *Using a Text n-gram Distribution Model to Design Cache Approaches*

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1 Introduction

This is a guide to reproduce the results related to the content of the paper titled *Using a Text n-gram Distribution Model to Design Cache Approaches*. File CacheDesign.zip must be uncompressed and all files in it must be placed in the same folder. As explained in the next section, this set has python function files (*.py), which constitute the approach proposed in the paper; files containing the *spline* regressions obtained by the prediction model (as referred in the paper) during the training phase, (*.pkl); files generated after running the python functions; and files used in *gnuplot* to generate the Figures and other results of the paper. This is the whole set:

```
CacheDesignForLocalMax.py
Def_ConstantsAndGlobalVars.py
Def_DistByLangNandK.py
Def_KThresholds.py
Def_TestingCorporaSizes.py
Def_ValidationCorporaSizes.py
Def_Vocabulary.py
Def_monotony.py
Def_smooth_spline_results.pkl
Def_smooth_spline_results_const.pkl
EmpLocMaxCacheForHitRatioVsCorpusSize_en_0.75_1
EmpLocMaxCacheForHitRatioVsCorpusSize_en_0.75_2
EmpLocMaxCacheForHitRatioVsCorpusSize_en_0.85_1
EmpLocMaxCacheForHitRatioVsCorpusSize_en_0.85_2
EmpLocMaxCacheForHitRatioVsCorpusSize_en_0.95_1
EmpLocMaxCacheForHitRatioVsCorpusSize_en_0.95_2
EmpLocMaxCacheForHitRatioVsCorpusSize_en_0.99_1
EmpLocMaxCacheForHitRatioVsCorpusSize_en_0.99_2
EmpLocMaxPercentCacheForHitRatioVsCorpusSize_en_0.75_1
EmpLocMaxPercentCacheForHitRatioVsCorpusSize_en_0.75_2
EmpLocMaxPercentCacheForHitRatioVsCorpusSize_en_0.85_1
EmpLocMaxPercentCacheForHitRatioVsCorpusSize_en_0.85_2
EmpLocMaxPercentCacheForHitRatioVsCorpusSize_en_0.95_1
EmpLocMaxPercentCacheForHitRatioVsCorpusSize_en_0.95_2
```

EmpLocMaxPercentCacheForHitRatioVsCorpusSize_en_0.99_1
 EmpLocMaxPercentCacheForHitRatioVsCorpusSize_en_0.99_2
 EmpLocalMaxCacheForCorpusSizeVsHitRatio_en_11344756233_2
 EmpLocalMaxCacheForCorpusSizeVsHitRatio_en_172051234833_2
 EmpLocalMaxCacheForCorpusSizeVsHitRatio_en_31487751867_2
 EmpLocalMaxCacheForCorpusSizeVsHitRatio_en_366397191_2
 EmpLocalMaxCacheForCorpusSizeVsHitRatio_en_82718285958_2
 EmpLocalMaxPercentCacheForCorpusSizeVsHitRatio_en_11344756233_2
 EmpLocalMaxPercentCacheForCorpusSizeVsHitRatio_en_172051234833_2
 EmpLocalMaxPercentCacheForCorpusSizeVsHitRatio_en_31487751867_2
 EmpLocalMaxPercentCacheForCorpusSizeVsHitRatio_en_366397191_2
 EmpLocalMaxPercentCacheForCorpusSizeVsHitRatio_en_82718285958_2
 FirstDkRatioForCorpora_Emp_16_en_1
 FirstDkRatioForCorpora_Emp_2_en_1
 FirstDkRatioForCorpora_Emp_4_en_1
 FirstDkRatioForCorpora_Emp_8_en_1
 FirstDkRatioForCorpora_Pred_16_en_1
 FirstDkRatioForCorpora_Pred_2_en_1
 FirstDkRatioForCorpora_Pred_4_en_1
 FirstDkRatioForCorpora_Pred_8_en_1
 LocMaxCacheForHitRatioVsCorpusSize_en_0.75_1
 LocMaxCacheForHitRatioVsCorpusSize_en_0.75_2
 LocMaxCacheForHitRatioVsCorpusSize_en_0.85_1
 LocMaxCacheForHitRatioVsCorpusSize_en_0.85_2
 LocMaxCacheForHitRatioVsCorpusSize_en_0.95_1
 LocMaxCacheForHitRatioVsCorpusSize_en_0.95_2
 LocMaxCacheForHitRatioVsCorpusSize_en_0.99_1
 LocMaxCacheForHitRatioVsCorpusSize_en_0.99_2
 LocMaxPercentCacheForHitRatioVsCorpusSize_en_0.75_1
 LocMaxPercentCacheForHitRatioVsCorpusSize_en_0.75_2
 LocMaxPercentCacheForHitRatioVsCorpusSize_en_0.85_1
 LocMaxPercentCacheForHitRatioVsCorpusSize_en_0.85_2
 LocMaxPercentCacheForHitRatioVsCorpusSize_en_0.95_1
 LocMaxPercentCacheForHitRatioVsCorpusSize_en_0.95_2
 LocMaxPercentCacheForHitRatioVsCorpusSize_en_0.99_1
 LocMaxPercentCacheForHitRatioVsCorpusSize_en_0.99_2
 LocalMaxCacheForCorpusSizeVsHitRatio_en_11344756233_2
 LocalMaxCacheForCorpusSizeVsHitRatio_en_172051234833_2
 LocalMaxCacheForCorpusSizeVsHitRatio_en_31487751867_2
 LocalMaxCacheForCorpusSizeVsHitRatio_en_366397191_2
 LocalMaxCacheForCorpusSizeVsHitRatio_en_82718285958_2
 LocalMaxEvolForFindBestCacheVsHitRatioPointForCorpusSize_en_40000000000.0_1_1
 LocalMaxEvolForFindBestCacheVsHitRatioPointForCorpusSize_en_40000000000.0_1_2
 LocalMaxFindBestCacheVsHitRatioPointForCorpusSize_en_40000000000.0_1_1
 LocalMaxFindBestCacheVsHitRatioPointForCorpusSize_en_40000000000.0_1_2

```

LocalMaxPercentCacheForCorpusSizeVsHitRatio_en_11344756233_2
LocalMaxPercentCacheForCorpusSizeVsHitRatio_en_172051234833_2
LocalMaxPercentCacheForCorpusSizeVsHitRatio_en_31487751867_2
LocalMaxPercentCacheForCorpusSizeVsHitRatio_en_366397191_2
LocalMaxPercentCacheForCorpusSizeVsHitRatio_en_82718285958_2
GerFigFirstkDistinctNgramsRatio_en_1g.txt
GerLocMaxCacheForHitRatioVsCorpusSize_en_WithOutBloomF.txt
GerLocMaxPercentCacheForHitRatioVsCorpusSize_en_WithBloomF.txt
GerLocMaxPercentCacheForHitRatioVsCorpusSize_en_WithOutBloomF.txt
GerLocalMaxEvolForFindBestCacheVsHitRatioPointForCorpusSize_en_40000000000_1_1.txt
GerLocalMaxPercentCacheForCorpusSizeVsHitRatio_en_WithBloomF.txt

```

2 How results were obtained

In this section we explain how each Figure and results in the paper was generated.

2.1 Ratio of distinct 1-grams occurring less than k times, relative to the total number of distinct ones – Fig 1

By running the function *FirstDkRatioForCorpora* (in file *CacheDesignForLocalMax.py*) for English 1-grams and for the *corpora* size range from 3×10^7 to 3×10^{12} words, separately for k values less than 2, 4, 8 and 16, that is,

```

FirstDkRatioForCorpora('en 1, 2, CorpusSizeLimInf=3e7, CorpusSizeLim-
Sup=3e12)
FirstDkRatioForCorpora('en 1, 4, CorpusSizeLimInf=3e7, CorpusSizeLim-
Sup=3e12)
FirstDkRatioForCorpora('en 1, 8, CorpusSizeLimInf=3e7, CorpusSizeLim-
Sup=3e12)
FirstDkRatioForCorpora('en 1, 16, CorpusSizeLimInf=3e7, CorpusSizeLim-
Sup=3e12)

```

It produces the files

```

FirstDkRatioForCorpora_Pred_2_en_1
FirstDkRatioForCorpora_Emp_2_en_1
FirstDkRatioForCorpora_Pred_4_en_1
FirstDkRatioForCorpora_Emp_4_en_1
FirstDkRatioForCorpora_Pred_8_en_1
FirstDkRatioForCorpora_Emp_8_en_1
FirstDkRatioForCorpora_Pred_16_en_1
FirstDkRatioForCorpora_Emp_16_en_1 .

```

These last files are used to generate Figure 1 of the paper (*FirskDistinctNgramsRatio_en_1g.eps*), by running file

GerFigFirstkDistinctNgramsRatio_en_1g.txt in *gnuplot* prompt, that is,
`gnuplot> load GerFigFirstkDistinctNgramsRatio_en_1g.txt .`

Furthermore, while running one of the cases, for example, *FirstDkRatioForCorpora('en 1, 4, CorpusSizeLimInf=3e7, CorpusSizeLimSup=3e12)*, it prints the relative errors for each test corpus:

Prediction for the ratio of number of first 3 distinct n -grams over D for Corpus 366397191 : 0.7907795685460486. Empirical: 0.7875648783126498. (Relative Error: 0.0040818100475560355

Prediction for the ratio of number of first 3 distinct n -grams over D for Corpus 11344756233 : 0.7940190436657513. Empirical: 0.7973389651597089. (Relative Error: 0.004163751727965116

Prediction for the ratio of number of first 3 distinct n -grams over D for Corpus 31487751867 : 0.7941224491885197. Empirical: 0.7939425255684908. (Relative Error: 0.00022662045958567558

Prediction for the ratio of number of first 3 distinct n -grams over D for Corpus 82718285958 : 0.7962679621229566. Empirical: 0.7949950803480521. (Relative Error: 0.001601119058934559

Prediction for the ratio of number of first 3 distinct n -grams over D for Corpus 172051234833 : 0.7928595737358247. Empirical: 0.7914959448340341. (Relative Error: 0.0017228501430624286

Average Relative Errors: 0.002359230287420763

2.2 Predicted and empirical global cache values, as a function of the *corpus* size, for different hit ratio values (0.75, 0.85, 0.95, 0.99), using no Bloom filters – Fig. 2

By running the function *EvalLocalMaxRealAndPercentCacheForHitRatioVsCorpusSizeWithoutBloomF* (in file *CacheDesignForLocalMax.py*) for English, using 1-grams to 6-grams and for the *corpora* size range from 4×10^8 to 4×10^{11} words with 50 steps, separately for hit-ratio values (0.75, 0.85, 0.95, 0.99), that is,

`EvalLocalMaxRealAndPercentCacheForHitRatioVsCorpusSizeWithoutBloomF('en 6,0.75,4e8,4e11,50,verb=True)`

`EvalLocalMaxRealAndPercentCacheForHitRatioVsCorpusSizeWithoutBloomF('en 6,0.85,4e8,4e11,50,verb=True)`

`EvalLocalMaxRealAndPercentCacheForHitRatioVsCorpusSizeWithoutBloomF('en 6,0.95,4e8,4e11,50,verb=True)`

`EvalLocalMaxRealAndPercentCacheForHitRatioVsCorpusSizeWithoutBloomF('en 6,0.99,4e8,4e11,50,verb=True)` ,

it produces the files

LocMaxCacheForHitRatioVsCorpusSize_en_0.75_1
 EmpLocMaxCacheForHitRatioVsCorpusSize_en_0.75_1
 LocMaxCacheForHitRatioVsCorpusSize_en_0.85_1

```

EmpLocMaxCacheForHitRatioVsCorpusSize_en_0.85_1
LocMaxCacheForHitRatioVsCorpusSize_en_0.95_1
EmpLocMaxCacheForHitRatioVsCorpusSize_en_0.95_1
LocMaxCacheForHitRatioVsCorpusSize_en_0.99_1
EmpLocMaxCacheForHitRatioVsCorpusSize_en_0.99_1.

```

These files are used to generate Figure 2 of the paper (LocMaxCacheForHitRatioVsCorpusSize_en_WithOutBloomF.eps), after running in the *gnuplot* prompt,

```
gnuplot> load GerLocMaxCacheForHitRatioVsCorpusSize_en_WithOutBloomF.txt.
```

Besides, while running one of the cases, for example,

```
EvalLocalMaxRealAndPercentCacheForHitRatioVsCorpusSizeWithOutBloomF('en',
6,0.95,4e8,4e11,50,verb=True)
```

it also prints the relative errors obtained for each test corpus:

```

Relative Error of LocalMax cache size for HitRatio 0.95 and corpus size
366397191 : 0.00990597096447563
Relative Error of LocalMax cache size for HitRatio 0.95 and corpus size
11344756233 : 0.011629639685973005
Relative Error of LocalMax cache size for HitRatio 0.95 and corpus size
31487751867 : 0.005166363015926882
Relative Error of LocalMax cache size for HitRatio 0.95 and corpus size
82718285958 : 0.01793819088845537
Relative Error of LocalMax cache size for HitRatio 0.95 and corpus size
172051234833 : 0.003724417534384178
Avg Error 0.009672916417843012

```

2.3 Finding the Cache Elasticity Minimum Point (CEMP), using no Bloom filters – Fig. 3

In order to predict the CEMP for a 40 billion word English *corpus*, as well as the evolution of the hit ratio as a function of the number of entries of the global cache (for 1-grams to 6-grams), when using no Bloom filters, the function

LocalMaxFindBestCacheVsHitRatioPointForCorpusSizeWithOutBloomF (in file *CacheDesignForLocalMax.py*) must run, that is,

```
LocalMaxFindBestCacheVsHitRatioPointForCorpusSizeWithOutBloomF('en',
6,4e10,0.65,0.0025,CacheImportance=1,verb=True)
```

where 0.65 is the starting point for hit ratio, and 0.0025 is the value for $\Delta HitRatio$. It produces the file

LocalMaxEvolForFindBestCacheVsHitRatioPointForCorpusSize_en_40000000000.0_1_1 which is used when running, in *gnuplot*,

```
gnuplot> load
GerLocalMaxEvolForFindBestCacheVsHitRatioPointForCorpusSize_en_40000000000_1_1.txt
```

to produce Figure 3 of the paper (LocalMaxEvolForFindBestCacheVsHitRatioPointForCorpusSize_en_4e10_1_1.eps).

While the

LocalMaxFindBestCacheVsHitRatioPointForCorpusSizeWithoutBloomF('en', 6, 4e10, 0.65, 0.0025, CacheImportance=1, verb=True)

is running, it prints the prediction of the CEMP for the 40 billion word corpus:

Most efficient HitRatio Vs Cache size for LocalMax application, for 40000000000.0 corpus size : 0.9274999999999941 (Hit Ratio); 20065236111.98228 (Cache Size) corresponding to 0.6118918126508907 of cache size for 100% Hit ratio.

2.4 Ratio of global cache size with respect to full cache size for different hit ratio values (0.75, 0.85, 0.95, 0.99), using no Bloom filters – Fig. 4

By running the function *EvalLocalMaxRealAndPercentCacheForHitRatioVsCorpusSizeWithoutBloomF* (in file *CacheDesignForLocalMax.py*) for English, using 1-grams to 6-grams and for the *corpora* size range from 4×10^8 to 4×10^{11} words with 50 steps, separately for hit-ratio values (0.75, 0.85, 0.95, 0.99), as it was done in Subsection (2.2), that is,

EvalLocalMaxRealAndPercentCacheForHitRatioVsCorpusSizeWithoutBloomF('en', 6, 0.75, 4e8, 4e11, 50, verb=True)

EvalLocalMaxRealAndPercentCacheForHitRatioVsCorpusSizeWithoutBloomF('en', 6, 0.85, 4e8, 4e11, 50, verb=True)

EvalLocalMaxRealAndPercentCacheForHitRatioVsCorpusSizeWithoutBloomF('en', 6, 0.95, 4e8, 4e11, 50, verb=True)

EvalLocalMaxRealAndPercentCacheForHitRatioVsCorpusSizeWithoutBloomF('en', 6, 0.99, 4e8, 4e11, 50, verb=True) ,

it also produces the files

```
LocMaxPercentCacheForHitRatioVsCorpusSize_en_0.75_1
EmpLocMaxPercentCacheForHitRatioVsCorpusSize_en_0.75_1
LocMaxPercentCacheForHitRatioVsCorpusSize_en_0.85_1
EmpLocMaxPercentCacheForHitRatioVsCorpusSize_en_0.85_1
LocMaxPercentCacheForHitRatioVsCorpusSize_en_0.95_1
EmpLocMaxPercentCacheForHitRatioVsCorpusSize_en_0.95_1
LocMaxPercentCacheForHitRatioVsCorpusSize_en_0.99_1
EmpLocMaxPercentCacheForHitRatioVsCorpusSize_en_0.99_1 .
```

These files are used to generate Figure 4 of the paper

(*LocMaxPercentCacheForHitRatioVsCorpusSize_en_WithoutBloomF.eps*), after running in the *gnuplot* prompt,

```
gnuplot> load GerLocMaxPercentCacheForHitRatioVsCorpusSize_en_WithoutBloomF.txt
```

2.5 Ratio of global cache size with respect to full cache size, as a function of *corpus* size, for different hit ratio values (0.75, 0.85, 0.95, 0.99), using Bloom filters – Fig.5

By running the function *EvalLocalMaxRealAndPercentCacheForHitRatioVsCorpusSizeWithBloomF* (in file *CacheDesignForLocalMax.py*) for English, using 1-grams to 6-grams and for the *corpora* size range from 4×10^8 to 4×10^{11} words with 50 steps, separately for hit-ratio values (0.75, 0.85, 0.95, 0.99), that is,

```
EvalLocalMaxRealAndPercentCacheForHitRatioVsCorpusSizeWithBloomF('en
6,0.75,4e8,4e11,50,verb=True)
EvalLocalMaxRealAndPercentCacheForHitRatioVsCorpusSizeWithBloomF('en
6,0.85,4e8,4e11,50,verb=True)
EvalLocalMaxRealAndPercentCacheForHitRatioVsCorpusSizeWithBloomF('en
6,0.95,4e8,4e11,50,verb=True)
EvalLocalMaxRealAndPercentCacheForHitRatioVsCorpusSizeWithBloomF('en
6,0.99,4e8,4e11,50,verb=True) .
```

It produces the files

```
LocMaxPercentCacheForHitRatioVsCorpusSize_en_0.75_2
EmpLocMaxPercentCacheForHitRatioVsCorpusSize_en_0.75_2
LocMaxPercentCacheForHitRatioVsCorpusSize_en_0.85_2
EmpLocMaxPercentCacheForHitRatioVsCorpusSize_en_0.85_2
LocMaxPercentCacheForHitRatioVsCorpusSize_en_0.95_2
EmpLocMaxPercentCacheForHitRatioVsCorpusSize_en_0.95_2
LocMaxPercentCacheForHitRatioVsCorpusSize_en_0.99_2
EmpLocMaxPercentCacheForHitRatioVsCorpusSize_en_0.99_2 .
```

These files are used to generate Figure 5 of the paper
(*LocMaxPercentCacheForHitRatioVsCorpusSize_en_WithBloomF.eps*), after running in the *gnuplot* prompt,
gnuplot> load GerLocMaxPercentCacheForHitRatioVsCorpusSize_en_WithBloomF.txt.

Furthermore, while running one of the cases, for example,

```
EvalLocalMaxRealAndPercentCacheForHitRatioVsCorpusSizeWithBloomF('en
6,0.95,4e8,4e11,50,verb=True),
```

it also prints the relative errors obtained for each test corpus:

Relative Error of LocalMax cache size for HitRatio 0.95 and corpus size
366397191 : 0.004636328842249107

Relative Error of LocalMax cache size for HitRatio 0.95 and corpus size
11344756233 : 0.041352682483483005

Relative Error of LocalMax cache size for HitRatio 0.95 and corpus size
31487751867 : 0.000591719361396837

Relative Error of LocalMax cache size for HitRatio 0.95 and corpus size
82718285958 : 0.009329605207396802

Relative Error of LocalMax cache size for HitRatio 0.95 and corpus size
 172051234833 : 0.005259150707476063
 Avg Error 0.012233897320400363

2.6 Ratio of global cache size with respect to full cache size, as a function of hit ratio, using Bloom filters – Fig. 6

By running the function *EvalLocalMaxRealAndPercentCacheForCorpusSizeVsHitRatioWithBloomF* (in file *CacheDesignForLocalMax.py*) for English, using 1-grams to 6-grams, for 50 hit ratio step values starting from 0.75, for different *corpus* sizes, that is,

```
EvalLocalMaxRealAndPercentCacheForCorpusSizeVsHitRatioWithBloomF('en',
6,366397191,0.75,50,verb=True)
EvalLocalMaxRealAndPercentCacheForCorpusSizeVsHitRatioWithBloomF('en',
6,11344756233,0.75,50,verb=True)
EvalLocalMaxRealAndPercentCacheForCorpusSizeVsHitRatioWithBloomF('en',
6,31487751867,0.75,50,verb=True)
EvalLocalMaxRealAndPercentCacheForCorpusSizeVsHitRatioWithBloomF('en',
6,82718285958,0.75,50,verb=True)
EvalLocalMaxRealAndPercentCacheForCorpusSizeVsHitRatioWithBloomF('en',
6,172051234833,0.75,50,verb=True),
```

it produces the files

```
LocalMaxCacheForCorpusSizeVsHitRatio_en_366397191_2
EmpLocalMaxPercentCacheForCorpusSizeVsHitRatio_en_366397191_2
LocalMaxCacheForCorpusSizeVsHitRatio_en_11344756233_2
EmpLocalMaxPercentCacheForCorpusSizeVsHitRatio_en_11344756233_2
LocalMaxCacheForCorpusSizeVsHitRatio_en_31487751867_2
EmpLocalMaxPercentCacheForCorpusSizeVsHitRatio_en_31487751867_2
LocalMaxCacheForCorpusSizeVsHitRatio_en_82718285958_2
EmpLocalMaxPercentCacheForCorpusSizeVsHitRatio_en_82718285958_2
LocalMaxCacheForCorpusSizeVsHitRatio_en_172051234833_2
EmpLocalMaxPercentCacheForCorpusSizeVsHitRatio_en_172051234833_2.
```

These files are used to generate Figure 6 of the paper
 (LocalMaxPercentCacheForCorpusSizeVsHitRatio_en_WithBloomF.eps), after running in the *gnuplot* prompt,

```
gnuplot> load
```

```
GerLocalMaxPercentCacheForCorpusSizeVsHitRatio_en_WithBloomF.txt.
```

Furthermore, while running one of the cases, for example, *EvalLocalMaxRealAndPercentCacheForCorpusSizeVsHitRatioWithBloomF*('en', 6,82718285958,0.75,50,verb=True), it prints the relative error for the test *corpus*, for each hit ratio value, for example:

...
 ...
 Relative Error of cache size for HitRatio 0.9950397263139075 and corpus size
 82718285958 : 0.01323376549391151
 Relative Error of cache size for HitRatio 0.9954210902778164 and corpus size
 82718285958 : 0.012858306064061674
 Mean Error: 0.013493339316773937 ; Mean Square Root Error: 0.016446999441402883

2.7 Finding the Cache Elasticity Minimum Point (CEMP), using Bloom filters

In order to predict the CEMP for a 40 billion word English *corpus*, as well as the evolution of the hit ratio as a function of the number of entries of the global cache (for 1-grams to 6-grams), when using Bloom filters, the function

LocalMaxFindBestCacheVsHitRatioPointForCorpusSizeWithBloomF (in file *CacheDesignForLocalMax.py*) must run, that is,

LocalMaxFindBestCacheVsHitRatioPointForCorpusSizeWithBloomF('en', 6, 4e10, 0.75, 0.0025, CacheImportance=1, verb=True), where 0.75 is starting point for hit ratio, and 0.0025 is the value for $\Delta HitRatio$. It produces the file

LocalMaxEvolForFindBestCacheVsHitRatioPointForCorpusSize_en_40000000000.0_1_2 containing the mentioned evolution. When the function is running, it prints the prediction of the CEMP for the 40 billion word *corpus* when using Bloom filters:

Most efficient HitRatio Vs Cache size for LocalMax application, for 40000000000.0 corpus size : 0.8074999999999988 (Hit Ratio); 2886573848.7816358 (Cache Size) corresponding to 0.08802642016392201 of cache size for 100% Hit ratio.

2.8 The prediction model

The software implementing the statistical prediction model, which is one of the pillars supporting the approach proposed in the paper, can be accessed at <https://github.com/OurName1234/ngrams> .