



Evolution and Overgeneralization of Grammar

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Introduction

- Natural languages are characterized as a combination of rule-based generalization and lexical idiosyncrasy
- The rules governing the syntax are actually quasi regular.
- Apparently allowed constructions are idiosyncratically missing



Idiosyncracies

- Baker's Paradox

The English past tense where the irregular form
'went' replaces '*goed*'

- Dative Shift:

John gave/donated a book to the library

John gave/*donated the library a book



- *'to be'* deletion rule

The baby appears/seems to be happy

The baby appears/seems happy

The baby seems to be sleeping

*The baby appears/seems sleeping

- Lexical constraints

strong/high/*stiff winds

strong/*high/*stiff currents

strong/*high/stiff breeze



- Transitive/Intransitive

John broke the cup

The cup broke

John kissed Mary

*Mary kissed

- We cannot interpret syntactic behaviour from semantics

John waved Mary goodbye

John waved goodbye to Mary

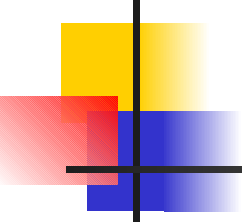
*John said Mary hello

John said hello to Mary



Question...

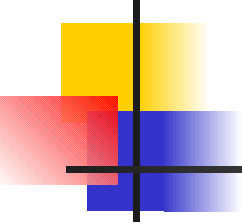
- Given these holes and quasi regular rules, what really is the learning mechanism ?

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- Since only a finite set of sentences are heard, absence of a form does not imply that it is not allowed.
 - Such holes are specific to languages so they cannot be attributed to postulating a Universal Grammar



Approach

- Learning quasi regular structures in a rudimentary language from positive evidence alone using the Simplicity principle.
- As a measure for simplicity, MDL (Minimum Description Length) was used: Kolmogorov complexity

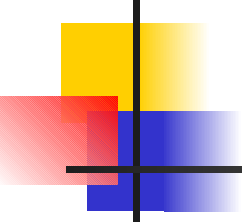
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- Simplicity :Cognitive Systems prefer simpler patterns over complex ones. The shortest program that regenerates the object is a natural measure of its complexity
 - Instead of actual binary coding, codelengths are calculated for this purpose.
 - All grammars or hypotheses are expressed

$$C = C(H)+C(D|H)$$



Simulation

- 2 approaches :
 - There is a “super speaker” for all the listeners who knows the correct grammar entirely. All his utterances shall be completely correct and can have no exceptions
 - Transmission over generations: The listener listens to sentences spoken by a speaker, who himself was the listener some time ago.

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- The first approach, though fair enough for simulation purposes, is unrealistic
 - The second is closer to reality.

It can be thought to be a model wherein a generation of parents instruct their successors about the exceptions in language. Children also posit exceptions on listening to their utterances



Algorithmic details:

- Rudimentary toy language:

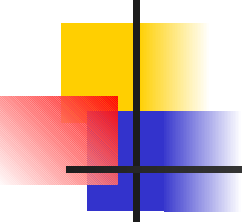
$$S1 = AB$$

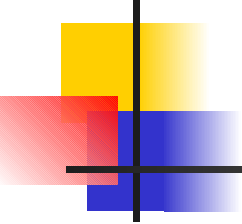
$$S2 = BA$$

$$A = \{ a1, a2, a3, a4 \}$$

$$B = \{ b1, b2, b3, b4 \}$$

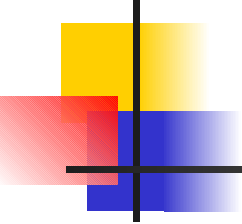
$$* = \{ (a1), (a2, b2), (a2, b3), (a2, b4), (b1, a1), \\ (b2, a1), (b3, a1), (b4, a1) \}$$

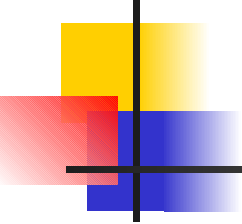
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- Grammars are represented by matrices of probabilities and an exception matrix.
 - Words are ranked according to their frequencies. The speaker and the listener share the probabilities of these words.
 - Using Zipf's law the probabilities are calculated: $p = f/\sum f$

- 
-
- Learning proceeds by gambles. The listener gambles whether a sentence can be an exception depending on whether it satisfies :

$$\text{Log} (1/p(x)) < N p(x)$$

- Scaling up of probabilities is done and if the gamble is correct, it results in shorter codelengths. If it is incorrect, the gamble is abandoned.

- 
-
- Each time an exception is posited, a new hypothesis is generated
 - A sentence which has been heard is never posited as an exception.
 - The codelengths for these grammars are calculated.

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-
- Each hypothesis is exposed to 50 sentences of a grammar, which in the first approach are from the perfect grammar, and in the second from the previous grammar.
 - This attempts to mimic the situation of the poverty of stimulus, where one never hears all sentences and receive no negative feedback.


```

import java.io.* ;
import java.util.Random;

public class actual3
{

    static boolean[][] board;

    static generator[] array = new generator [10];

    static generator actual3 generator = new generator();
    final static int [][] actual3_except_row = {{1},{2}};
    final static int [][] actual3_except_col = {{1},{2}};
    // n = 1 static

    int[][] except_locs = {{2,3},{4,3},{5,3},{7,8},{1,1},{1,2},{1,3},{2,1},{4,1},{5,1},{7,1}};

    static int excep_row=0;
    static int excep_col=0;
    static boolean [][] posited = new boolean[8][4];
    boolean [][] tried_for_positing = new boolean[8][4];

    actual3()
    {
        for (int i=0;i<8;i++)
        {
            for (int j=0;j<4;j++)
            {
                tried_for_positing[i][j]=false;
            }
        }
    }

    //tries to implement the generator min and exceptions in given generator
    //returns row of excep in correct generator generated

```

```

//checks on argument the given num and exceptions in given number
//returns num of excep in correct format generated
public int generateGrammat(int gramNum, int excep, int x)
{

```

```

InputStreamReader in = new InputStreamReader (System.in);
BufferedReader br = new BufferedReader (in);

```

```

    boolean excep_coopec=true;
    int count=0;
    int v=0;
    int row;
    int col;
    int actcolfrom;
    int actcolto;
    int testcol;
    int [][] excep_exposed_to= new int [50][3];
    double prob_of_excep;
    double temp1=1;
    double temp2;
    double temp3;
    double temp4=0;
    double temp5;
    double temp6;
    double temp7=0;
    boolean once_done=false;
    boolean [][] once_calculated= new boolean [5][4];
    Random generator= new Random();
    for (int i=0;i<8;i++)
    {
        for (int j=0;j<4;j++)
        {
            once_calculated[i][j]=false;
        }
    }

```

```

    boolean once_done=false;
    boolean [][] once_calculated= new boolean [5][4];
    Random generator= new Random();
    for (int i=0;i<8;i++)
    {
        for (int j=0;j<4;j++)
        {
            once_calculated[i][j]=false;
        }
    }

    for (int i=1;i<=7;i++)
    {
        for (int j=0;j<4;j++)
        {
            tried_for_posting[i][j]=false;
        }
    }

    for ( i=0;i<50;i++)
    {
        do
        {
            actual3row = generator.nextInt( 8 );
            tempcol = generator.nextInt( 10);
            actual3col= array[gran_run+1].probab_chooseing_matrix[actual3row][tempcol];
        }
        while(!actual3_col.equals(0) || prob[actual3row][actual3col]==0);
        array[gran_run+1].indexof[actual3row][actual3col]=true;

        sent_exposed_t= [i][0]-actual3row;
        sent_exposed_c= [i][1]-actual3col;
    }

```

```

int loc;
double sum=0;
double sec=1;
double totsum=0;
if (max_nux == -1)
{
    for (int i = 0; i < 50; i++)
    {
        word = words_expanded_to [i][0];
        loc = words_expanded_to [i][1];
        sum = array[0].sec * word * prob[word][loc] * array[0].lit * word * prob[word];
        sec = Math.pow(sec, -1);
        totsum = totsum + Math.log(sec) / Math.log(2);
    }
    System.out.println("For the completely regular grammar code length = " + totsum);
    return 0;
}

// generates a possible LLN could be exception
do
{
    do
    {
        if (excep_exhausted; tried_for_position);
        :
        System.out.println("These are all the grammars that can be generated");
        System.exit(0);
        :
    } while (true);

    row = generator.nextInt( 8 );

    emp_col = generator.nextInt( 10 );
}

```

```

        while (array[gran_num].index&lt;row || (col-->true) | (posited[ro] || (col-->true));
        prod_of_except=array[gran_num].til_word_prod[ro];*(array[gran_num].occ_word_prob[ro] || (col-->true));
        posited[ro][col]=true;

        if (once_done-->false)
        {
            for ( i=0; i<50; i++)
            {
                actia[0]=ents_exposed_to[i][0];
                actual3[0]=ents_exposed_to[i][1];

                array[gran_num+1].index&lt;heard[actia[0]][actual3[0]]=true;

                once_done=true;
                actual3[0]=ents_exposed_to [i][0];
                actia[0]=ents_exposed_to [i][1];

                if ((row--actual3[0])<<(col--actual3[0]))
                {
                    except_close=false;
                    break;
                }
                temp1=array[gran_num].til_word_prod[ro];*(array[gran_num].occ_word_prob[ro] || (col-->true));
                temp2=Math.pow(temp1,-1);
                temp3=Math.log(temp2)/Math.log(2);
                temp4=Math.pow(1-temp1,-1);
                if (1<(1-1)*temp_/temp:1)
                {
                    except_close=true;
                }
            }
        }
    }
}

```

```

    }
}
class
{
    for(int i=0; i<50;i++)
    {
        actualRow=entire_exposed_to[i][0];
        actualCol=entire_exposed_to[i][1];
        if ((row--actualRow)&&(col--actualCol))
        {
            excep_close=false;
            break;
        }
        temp1=(array_gran_num).bit_word_prod(row)^((array_gran_num).sec_word_prod(col));
        temp2=N-b*(arr[temp1],-1);
        temp3=Math.log(temp2)/Math.log(2);
        temp4=Math.pow(1-temp1,-1);
        if ((1+(1+temp2/2)^temp3)/temp4);
        {
            excep_close=true;
        }
    }
}
if (excep_close==true)
{
    break;
}
}
}

```

```

void CTrigram::
    CalcProbabilities()
{
    for (int i=0; i<8; i++)
    {
        for (int j=0; j<4; j++)
        {
            array[gram_num+1].fix_word_prob[i]-array[gram_num].fix_word_prob[i];
            array[gram_num+1].sec_word_prob[i][j]-array[gram_num].sec_word_prob[i][j];
            array[gram_num+1].exceptode_length=array[gram_num].exceptode_length;
        }
    }

    array[gram_num+1].sec_word_prob[0][0]=0;

    array[gram_num+1].sec_word_prob[0][0]=0;

    for (int i=0; i<8; i++)
    {
        for (int j=0; j<4; j++)
        {
            if (array[gram_num+1].sec_word_prob[i][j]!=0)
            {
                (array[gram_num+1].sec_word_prob[i][j]-((array[gram_num+1].fix_word_prob[i][j])*Math::pow(temp4,0.5)));
            }
        }
    }

    for (int i=0; i<8; i++)
    {
        (array[gram_num+1].fix_word_prob[i]-((array[gram_num+1].sec_word_prob[i][0])*Math::pow(temp4,0.5)));
    }
}

```

```

int counter=0;
int x=0;
if (gram_sum==0)
{
    array[gram_num+1].list_of_except_with_each_gram[""][0]=row;
    array[1].list_of_except_with_each_gram[0][0]=col;

    for(int i=0; i<f0; i++)
    {
        actual3row=cnts_exposed_to[1][1];
        octal3col=cnts_exposed_to[1][1];
        if (once_calculated[actual3row][actual3col]==true)
        {
            continue;
        }
        else
        {
            once_calculated[actual3row][actual3col]=true;
            temp1=Math.pow((array[gram_num+1].list_of_except_with_each_gram[""][0]+array[1].list_of_except_with_each_gram[0][0]),sec_word_prob[actual3row][actual3col]);
            temp2=(Math.log(temp1)/(Math.log(2)));
            array[gram_num+1].datacode.length+=array[gram_num+1].datacode.length/temp2;
        }
    }
}
System.out.println("datacode length for gram no "+(gram_num+1)+" is "+array[gram_num+1].datacode.length;
temp1=Math.pow((array[gram_num+1].list_of_except_with_each_gram[""][0]+array[1].list_of_except_with_each_gram[0][0]),sec_word_prob[row][col]);

```



```

temp2= Math.log(temp1)/(Math.log(2));

array[gran_num+1].excpcode_length = array[gran_num+1].excpcode_length+temp2;
System.out.println("excep code length = " + array[gran_num+1].excpcode_length);

}

while (!array[gran_num].list_of_excep_with_each_gran[s][0] == -1)
{
array[gran_num+1].list_of_excep_with_each_gran[s][0]=array[gran_num].list_of_excep_with_each_gran[s][0];
array[gran_num+1].list_of_excep_with_each_gran[s][1]=array[gran_num].list_of_excep_with_each_gran[s][1];
s++;
}

counter=0;
if (gran_num!=0)
{
int exchange=counter;
while (array[gran_num+1].list_of_excep_with_each_gran[counter][0]!=-1)
{

exchange=counter-1;
for (int i=0; i<exchange; i++)
{
actual3ioL=sents_exposed_to[i][1];
actual3ioL=sents_exposed_to[i+1][1];

if
(!array[gran_num+1].list_of_excep_with_each_gran[counter][0]==actual3ioL+s*(array[gran_num+1].list_of_excep_with_each_gran[counter][1]

```

```

array[gram_num+1].sec_word_prob[actual3row][actual3col] = array[0].sec_word_prob[actual3row][actual3col];
temp6 = Math.pow((array[0].fir_word_prob[actual3row])*(array[0].sec_word_prob[actual3row][actual3col]), 2);

temp6 = (Math.log(temp6/5))/(Math.log(2));
array[gram_num+1].excepodelength = array[gram_num+1].excepodelength-temp6;

array[gram_num+1].list_of_excep_with_each_gram[counter][0] = array[gram_num+1].list_of_excep_with_each_gram[exch
array[gram_num+1].list_of_excep_with_each_gram[counter][1] = array[gram_num+1].list_of_excep_with_each_gram[exch
array[gram_num+1].list_of_excep_with_each_gram[exchangecounter][0] = 1;
array[gram_num+1].list_of_excep_with_each_gram[exchangecounter][1] = 1;
exchangecounter++;
//Scale down probabilities
for (int j=0; j<E; j++)
{
    for (int k=0; k<E; k++)
    {
        array[gram_num+1].sec_word_prob[j][k] = (array[gram_num+1].sec_word_prob[j][k])*(1/(array[0].fir_word_prob[j]
    }
}
for (int j=0; j<E; j++)
{
    array[gram_num+1].fir_word_prob[j] = array[gram_num+1].fir_word_prob[j]*Math.pow((1+array[0].fir_word_prob[j]), -1);
}
}
}
counter++;
}
array[gram_num+1].list_of_excep_with_each_gram[counter][0] = row;

```

```

array[gram_num+1].sec_word_prob[actual3row][actual3col] = array[0].sec_word_prob[actual3row][actual3col];
temp6 = Math.pow((array[0].fir_word_prob[actual3row])*(array[0].sec_word_prob[actual3row][actual3col]), 2);

temp6 = (Math.log(temp6/5))/(Math.log(2));
array[gram_num+1].excepodelength = array[gram_num+1].excepodelength-temp6;

array[gram_num+1].list_of_excep_with_each_gram[counter][0] = array[gram_num+1].list_of_excep_with_each_gram[exch
array[gram_num+1].list_of_excep_with_each_gram[counter][1] = array[gram_num+1].list_of_excep_with_each_gram[exch
array[gram_num+1].list_of_excep_with_each_gram[exchangecounter][0] = 1;
array[gram_num+1].list_of_excep_with_each_gram[exchangecounter][1] = 1;
exchangecounter++;
//Scale down probabilities
for (int j=0;j<E;j++)
{
    for (int k=0;k<E;k++)
    {
        array[gram_num+1].sec_word_prob[j][k] = (array[gram_num+1].sec_word_prob[j][k])*(1/(array[0].fir_word_prob[j]
    }
}
for (int j=0;j<E;j++)
{
    array[gram_num+1].fir_word_prob[j] = array[gram_num+1].fir_word_prob[j]*Math.pow((1+array[0].fir_word_prob[j]), -1);
}
}
}
counter++;
}
array[gram_num+1].list_of_excep_with_each_gram[counter][0] = row;

```

```

    }
    System.out.println("data code length for grammar number "+(gram_num+1)+" is "+array[gram_num-1].datacode.length);

    temp1=Math.pow((array[gram_num].firstwordprob[100]*array[gram_num].secondwordprob[100]),-1);
    temp2= Math.log(temp1)/Math.log(2);
    array[gram_num-1].excpcode.length = array[gram_num-1].excpcode.length/temp2;
    System.out.println("exception code length for grammar number "+(gram_num+1)+" is "+array[gram_num-1].excpcode.length);

    double sum = array[gram_num-1].excpcodelength+array[gram_num+1].datacode.length;
    System.out.println("the code length for grammar number "+(gram_num+1)+" is "+sum);

}

System.out.println("this program contains "+(counter+1)+" exceptions");
if (gram_num == 5)
{
    try
    {
        hr.readLine();
    }
    catch (IOException e){}
}
System.out.println("");
return (count+1);

}

public static void main(String args[])
{
    for(int i=0;i<32;i++)

```

```

actual3_grammar.sec_word_prob[7][3]=0;
actual3_grammar.sec_word_prob[3][2]=0;
actual3_grammar.sec_word_prob[1][2]=0;
actual3_grammar.sec_word_prob[1][0]=0;
actual3_grammar.sec_word_prob[6][2]=0;
actual3_grammar.sec_word_prob[4][2]=0;
actual3_grammar.sec_word_prob[5][2]=0;
actual3_grammar.sec_word_prob[7][1]=0;
actual3_obj = new actual3();
int count=1;
int excpts=1;
int h=1;
bool is (true)
{
    b = obj.generate_grammar(count,excpts);
    excpts++;
    count++;
}
//doing the grammar and the exceptions now
}
public bool is_exe, exhausted, bool is an[][] is
{
    for(int i=0;i<8;i++)
    {
        for(int j=0;j<4;j++)
        {
            if ( b[i][j]==false)
            {
                return false;
            }
        }
    }
    return true;
}
}

```

Options

For the completely regular grammar code length = 256.03456695902585
 data code length for grammar no 1 is 55.73831780816085
 exception code length = 5.286322812333204
 This grammar contains 1 exceptions

data code length for grammar number 2 is 93.72568559241206
 exception code length for grammar number 2 is 11.4514722236228673
 The code length for grammar number 2 is 105.177157816034794
 This grammar contains 2 exceptions

data code length for grammar number 3 is 99.7057257794206
 exception code length for grammar number 3 is 10.214050055960777
 The code length for grammar number 3 is 110.92077205501738
 This grammar contains 3 exceptions

data code length for grammar number 4 is 95.07407972092654
 exception code length for grammar number 4 is 24.641355181518023
 The code length for grammar number 4 is 120.01543901551457
 This grammar contains 4 exceptions

data code length for grammar number 5 is 75.63553003391694
 exception code length for grammar number 5 is 30.616762938224553
 The code length for grammar number 5 is 106.25229297244149
 This grammar contains 5 exceptions

data code length for grammar number 6 is 87.20427359502941
 exception code length for grammar number 6 is 28.52304727566122
 The code length for grammar number 6 is 115.72730077069063
 This grammar contains 5 exceptions

Options

data code length for grammar number 7 is 86.36245831764353
 exception code length for grammar number 7 is 35.8371324750857
 The code length for grammar number 7 is 122.19960769232964
 This grammar contains 6exceptions

data code length for grammar number 8 is 81.4132726087959
 exception code length for grammar number 8 is 30.440114274937566
 The code length for grammar number 8 is 111.85138682751555
 This grammar contains 6exceptions

data code length for grammar number 9 is 76.75207375700579
 exception code length for grammar number 9 is 45.41153117057637
 The code length for grammar number 9 is 121.7639949276235
 This grammar contains 7exceptions

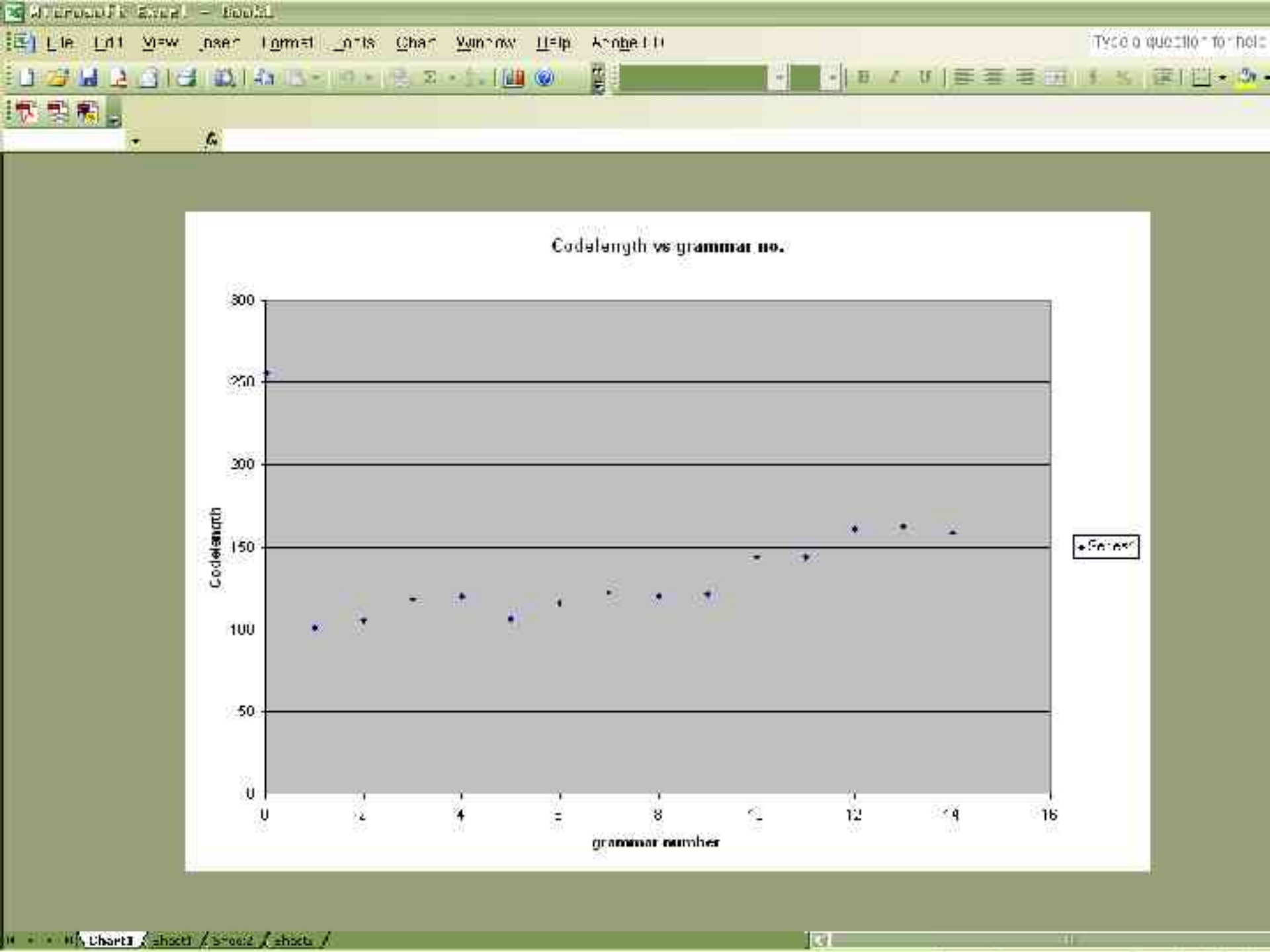
data code length for grammar number 10 is 92.57351864183541
 exception code length for grammar number 10 is 51.36354154345793
 The code length for grammar number 10 is 143.93735048529753
 This grammar contains 6exceptions

data code length for grammar number 11 is 85.93858943294727
 exception code length for grammar number 11 is 57.87597854255876
 The code length for grammar number 11 is 143.715079650673
 This grammar contains 9exceptions

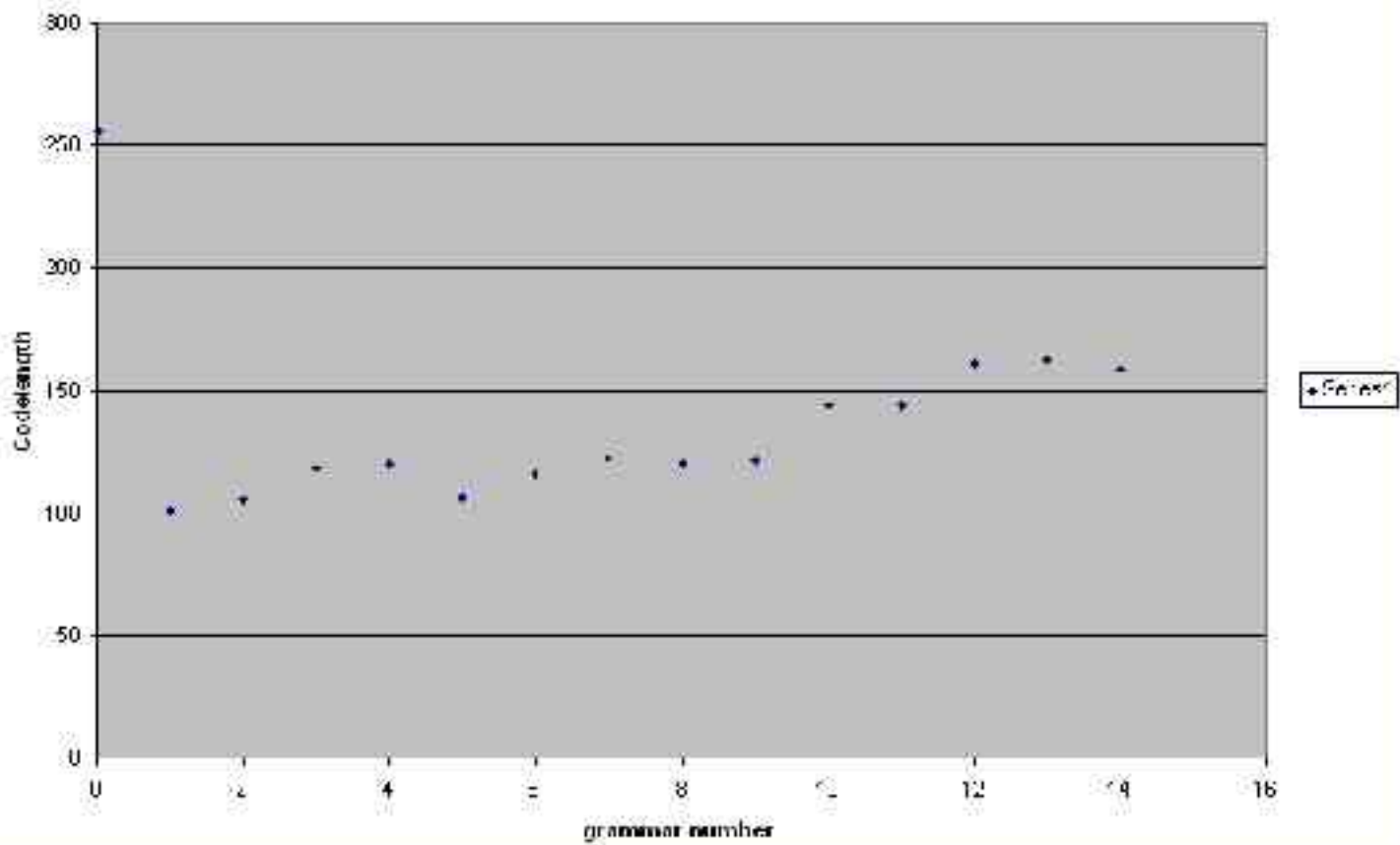
data code length for grammar number 12 is 97.37573635060514
 exception code length for grammar number 12 is 67.07445700573927
 The code length for grammar number 12 is 164.55015195114118
 This grammar contains 10exceptions

data code length for grammar number 13 is 92.9397535740671
 exception code length for grammar number 13 is 69.66769419495495
 The code length for grammar number 13 is 162.60874875583016
 This grammar contains 11exceptions

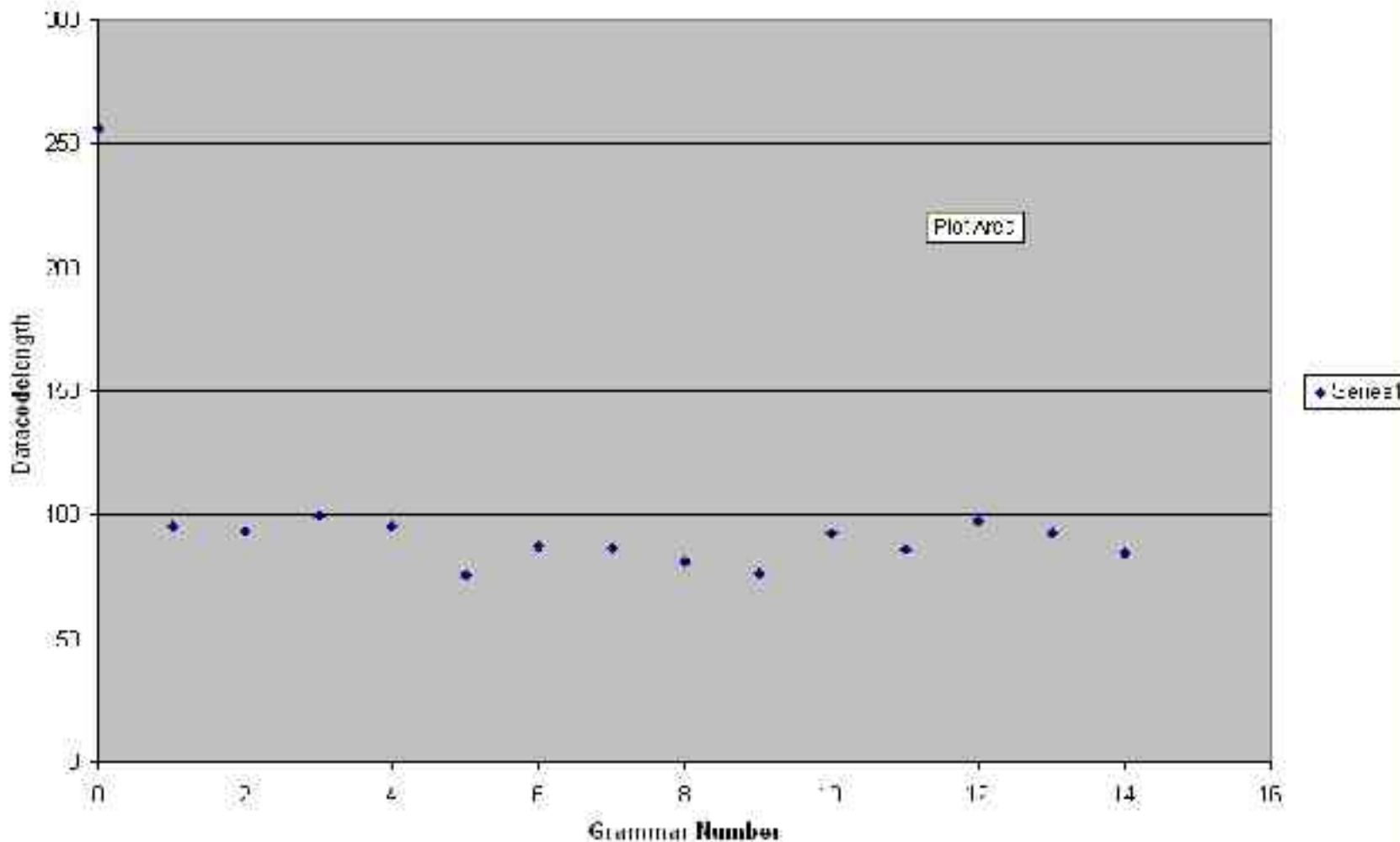
data code length for grammar number 14 is 83.39950175048208
 exception code length for grammar number 14 is 71.94538453216215
 The code length for grammar number 14 is 155.34488628264423
 This grammar contains 12exceptions



Codelength vs grammar no.



Datacode length vs Grammar Number



Options

For the completely regular grammar code length = 257.7184350645798
 data code length for grammar no 1 is 93.60852932947182
 except code length = 5.67128817059461
 This grammar contains 1 exceptions

data code length for grammar number 2 is 86.55131988534552
 exception code length for grammar number 2 is 12.15842651129108
 The code length for grammar number 2 is 98.70974639667902
 This grammar contains 2 exceptions

data code length for grammar number 3 is 103.66117855336505
 exception code length for grammar number 3 is 7.7025005101140
 The code length for grammar number 3 is 120.44493545649654
 This grammar contains 3 exceptions

data code length for grammar number 4 is 95.4070105040071
 exception code length for grammar number 4 is 24.600344321025714
 The code length for grammar number 4 is 120.007354825024605
 This grammar contains 4 exceptions

data code length for grammar number 5 is 82.41085617567458
 exception code length for grammar number 5 is 29.597523811965336
 The code length for grammar number 5 is 112.0083798154091
 This grammar contains 5 exceptions

data code length for grammar number 6 is 86.53875680495813

Option:

data code length for grammar number 7 is 92.29942065582151
exception code length for grammar number 7 is 42.90342523053384
The code length for grammar number 7 is 135.1438458874844
This grammar contains 7 exceptions

data code length for grammar number 8 is 78.16945049503652
exception code length for grammar number 8 is 49.14719423348696
The code length for grammar number 8 is 127.31664476151527
This grammar contains 8 exceptions

data code length for grammar number 9 is 85.23542601568758
exception code length for grammar number 9 is 55.706706447007006
The code length for grammar number 9 is 141.0122714585937
This grammar contains 9 exceptions

data code length for grammar number 10 is 90.06917027071506
exception code length for grammar number 10 is 61.674970291658904
The code length for grammar number 10 is 155.54414903537756
This grammar contains 10 exceptions

data code length for grammar number 11 is 102.81559278447402
exception code length for grammar number 11 is 63.95557516033135
The code length for grammar number 11 is 171.76915724473529
This grammar contains 11 exceptions

These are all the grammars that can be generated



The Second Approach:-

For 20 sentences: number of exceptions are very large

Terminal Window - Evolution

Options

This grammar contains 5exceptions

data code length for grammar number 10 is 62.52007700767649
exception code length for grammar number 10 is 49.61843301549337
The code length for grammar number 10 is 111.8385210961698
This grammar contains 10exceptions

data code length for grammar number 11 is 62.54201367588274
exception code length for grammar number 11 is 54.43410602594757
The code length for grammar number 11 is 116.9761070438032
This grammar contains 11exceptions

data code length for grammar number 12 is 56.51531278100918
exception code length for grammar number 12 is 59.78258227644349
The code length for grammar number 12 is 116.6570940554557
This grammar contains 12exceptions

data code length for grammar number 13 is 61.73542683540328
exception code length for grammar number 13 is 65.90253907701127
The code length for grammar number 13 is 117.63798572050475
This grammar contains 13exceptions

data code length for grammar number 14 is 49.5002702570137
exception code length for grammar number 14 is 72.19428972893563
The code length for grammar number 14 is 121.7745779797495
This grammar contains 14exceptions

data code length for grammar number 15 is 44.77545979506655
exception code length for grammar number 15 is 75.76718587920563
The code length for grammar number 15 is 119.5429556726726
This grammar contains 15exceptions

data code length for grammar number 16 is 49.42905879477352

For 30 sentences: number of exceptions have decreased

Terminal Window - Evolution

Option:

```
data code length for grammar number 4 is 26.7135958715035  
exception code length for grammar number 4 is 20.79227772275796  
The code length for grammar number 4 is 115.00583054512575  
This grammar contains 1 exceptions
```

```
data code length for grammar number 5 is 17.07903500252094  
exception code length for grammar number 5 is 29.249319214837583  
The code length for grammar number 5 is 115.33237629772161  
This grammar contains 1 exceptions
```

```
data code length for grammar number 6 is 32.25458117438075  
exception code length for grammar number 6 is 34.18302986578952  
The code length for grammar number 6 is 115.4476214417067  
This grammar contains 1 exceptions
```

```
data code length for grammar number 7 is 26.67329119756807  
exception code length for grammar number 7 is 41.4037074740016  
The code length for grammar number 7 is 121.15506224007623  
This grammar contains 7 exceptions
```

```
data code length for grammar number 8 is 55.07074715629477  
exception code length for grammar number 8 is 48.58267821030951  
The code length for grammar number 8 is 123.94502626661333  
This grammar contains 8 exceptions
```

```
data code length for grammar number 9 is 51.75925340278803  
exception code length for grammar number 9 is 54.13355976453455  
The code length for grammar number 9 is 135.8228431673229  
This grammar contains 8 exceptions
```

```
data code length for grammar number 10 is 86.76174945191523  
exception code length for grammar number 10 is 59.2812159217547  
The code length for grammar number 10 is 140.04296739116994  
This grammar contains 10 exceptions
```

For 40 sentences : very few grammars are generated

Terminal Window - Evolution

Option:

This grammar contains 13exceptions

data code length for grammar number 14 is 49.7002702570777
exception code length for grammar number 14 is 72.19428972393563
The code length for grammar number 14 is 121.7745779797495
This grammar contains 14exceptions

data code length for grammar number 15 is 44.175489793066885
exception code length for grammar number 15 is 75.36728587920563
The code length for grammar number 15 is 119.5427756722726
This grammar contains 15exceptions

data code length for grammar number 16 is 49.12905379177352
exception code length for grammar number 16 is 80.99819875469163
The code length for grammar number 16 is 130.12725253146515
This grammar contains 16exceptions

Here are all the grammars that can be generated
data code length for grammar no 1 is 19.7007044709677
except code length = 5.671288317054361
This grammar contains 1exceptions

data code length for grammar number 2 is 116.60768351759214
exception code length for grammar number 2 is 10.144059730828591
The code length for grammar number 2 is 126.75174324842073
This grammar contains 2exceptions

data code length for grammar number 3 is 119.8038581282568
exception code length for grammar number 3 is 15.55031911793554
The code length for grammar number 3 is 135.3541772461923
This grammar contains 3exceptions

data code length for grammar number 4 is 108.16905940143422
exception code length for grammar number 4 is 19.507174663061392
The code length for grammar number 4 is 127.67623011449561
This grammar contains 4exceptions

With a larger corpus of data: approach 1

Terminal Window - Evolution

Options

```
code length for grammar num 61 is 30.364763264649
```

```
This grammar contains 15% of excerpts
```

```
code length for grammar num 61 is 392.01381507878
```

```
This grammar contains 15% of excerpts
```

```
code length for grammar num 62 is 347.1502156205142
```

```
This grammar contains 14% of excerpts
```

```
code length for grammar num 62 is 361.3367396287172
```

```
This grammar contains 14% of excerpts
```

```
code length for grammar num 64 is 390.3292070493173
```

```
This grammar contains 15% of excerpts
```

```
code length for grammar num 65 is 375.782233793416
```

```
This grammar contains 15% of excerpts
```

```
code length for grammar num 65 is 395.1612723112601
```

```
This grammar contains 15% of excerpts
```

```
code length for grammar num 67 is 353.3602868231011
```

```
This grammar contains 14% of excerpts
```

```
code length for grammar num 68 is 372.7717781297618
```

```
This grammar contains 14% of excerpts
```


Larger corpora : approach 2

Terminal Window - Evolution

Options

```
code length for grammar num 3: is 761.01055836458
```

```
This grammar contains 30% of excerpts
```

```
code length for grammar num 3: is 767.0674641477032
```

```
This grammar contains 39% of excerpts
```

```
code length for grammar num 4: is 787.363906595456
```

```
This grammar contains 40% of excerpts
```

```
code length for grammar num 4: is 795.021974518759
```

```
This grammar contains 41% of excerpts
```

```
code length for grammar num 4: is 731.535367573554
```

```
This grammar contains 42% of excerpts
```

```
code length for grammar num 4: is 795.79733901902
```

```
This grammar contains 43% of excerpts
```

```
code length for grammar num 4: is 823.601184319603
```

```
This grammar contains 44% of excerpts
```

```
code length for grammar num 4: is 839.240380860143
```

```
This grammar contains 45% of excerpts
```

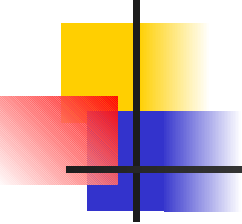
```
code length for grammar num 4: is 839.445523253857
```

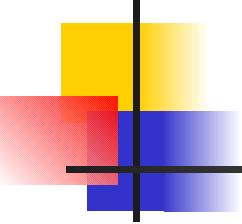
```
This grammar contains 46% of excerpts
```

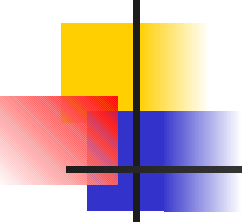
Conclusion:

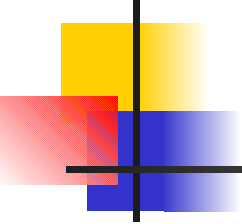


- When a small corpus of data was chosen, the simplicity principle yielded the exact number of 11 exceptions in most cases.
- The exceptions obtained were the same as those found in the actual language.
- So, for a small corpus of data, given the “super speaker approach”, the simplicity principle works quite efficiently.

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- However, if we look at the second approach. When we were using 50 sentences approximately 6 exceptions were found.
 - If the number of sentences uttered are decreased, the exceptions possible increase.
 - It is true that the datacodelegth decreases as we increase the number of exceptions. Since coding these exceptions requires some bits as well, whether that investment can be reobtained remains questionable.

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- When the number of sentences heard were approximately equal to the number of sample sentences, nearly perfect results were obtained.
 - With the increased sample size however, this fails badly.
 - The codelengths show a monotonic increase

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- Even grammars with 11 exceptions never had the same exceptions as were present in the grammar.
 - This happens primarily because data is chosen probabilistically. Since the exceptions themselves are randomly decided, investment in coding them may be quite large itself.

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- Since this language has no semantics and no communicative function, it doesn't model the relation between meaning-signal-referents.
 - Though it is true for small corpora of sentences, it cannot be established as a general learning mechanism.



Thank you!
