












# MBTI Type Finder

ASDML SS21

# Contents

- The Myers-Briggs Type Indicator
- The Data Set
- Text Preprocessing
- Project Process
  - Binary Tree
  - Data Encoding
  - Problem Transformation
  - Adapted Algorithms
- Conclusion
- Outlook

# The Myers-Briggs Type Indicator

 <p>ARAGORN</p> <p><b>THE GUARDIAN ISTJ</b></p> <p>PRACTICAL, DUTIFUL, LOGICAL, LOYAL, RESERVE, ORDERLY, REALISTIC, CALM, ORGANIZED, ANALYTICAL, CONCRETE, STEADFAST, RELIABLE, REASONABLE, SENSIBLE, FACTUAL, CONSISTENT, THOROUGH, TRADITIONAL, FOCUSED, DEPENDABLE, OBJECTIVE, CAREFUL, HONEST, FINISHER, OBSERVER</p>	 <p>SAMWISE</p> <p><b>THE PROTECTOR ISFJ</b></p> <p>DUTIFUL, SUPPORTIVE, GENTLE, PRACTICAL, KIND, MEDICULOUS, CAUTIOUS, FRIENDLY, THOUGHTFUL, PATIENT, REALISTIC, COMMITTED, CONSCIENTIOUS, CONCRETE, DEVOTED, RESPONSIBLE, DILIGENT, CONSIDERATE, DETAILED, SENSITIVE, DEPENDABLE, TRADITIONAL, ORGANIZED, COOPERATIVE, LOYAL</p>	 <p> GALADRIEL</p> <p><b>THE COUNSELOR INFJ</b></p> <p>DEVOTED, INNOVATIVE, INDIVIDUALISTIC, LOGICAL, COMPASSIONATE, DEEP, HARMONIOUS, CONCEPTUAL, RESERVE, WARM, VISIONARY, INTENSE, CREATIVE, INSPIRATIONAL, SENSITIVE, DETERMINED, COMMITTED, PRIVATE, MOTIVATOR, EMPATHETIC, HOLISTIC, IMAGINATIVE, ORIGINAL, DELIBERATE, INDEPENDENT</p>	 <p>ELROND</p> <p><b>THE STRATEGIST INTJ</b></p> <p>AUTONOMOUS, ALDOR, IMAGINATIVE, INNOVATIVE, INDEPENDENT, ORIGINAL, PRISM, CAUTIOUS, RESERVE, ANALYTICAL, LOGICAL, ORGANIZED, DEFINITIVE, DELIBERATE, PURPOSEFUL, RATIONAL, SYSTEMATIC, PLANNER, VISIONARY, CONCISE, CALM, CONSISTENT, PRODUCTIVE, CLEAR, COMPETENT, PRIVATE, DECISIVE</p>
 <p>EOWYN</p> <p><b>THE CRAFTY ISTP</b></p> <p>LOGICAL, PRAGMATIC, QUIET, AUTONOMOUS, REALISTIC, FLEXIBLE, RESOURCEFUL, OBJECTIVE, CURIOUS, ALONK, DETACHED, FACTUAL, ANALYTICAL, EFFICIENT, CAREFUL, PRACTICAL, ADAPTABLE, CONFIDENT, TROUBLESHOOTER, CAREFUL, APPLIED, SPONTANEOUS, INDEPENDENT, CALM, ADVENTUROUS</p>	 <p>LEGOLOS</p> <p><b>THE COMPOSER ISFP</b></p> <p>KIND, HUMBLE, EMPATHETIC, GENTLE, THOUGHTFUL, FAITHFUL, FRIENDLY, QUIET, PRACTICAL, MODEST, SPONTANEOUS, TREATING, PERSONAL, INCREASIBLE, COMMITTED, LOYAL, IMPASSIONATE, ADAPTABLE, RESPONSIVE, CURIOUS, SENSITIVE, REALISTIC, TOLERANT, RELAYED, LOVED NATURE, HARMONIOUS</p>	 <p>FRODO</p> <p><b>THE IDEALIST INFP</b></p> <p>RESERVE, KIND, QUIET, SENSITIVE, DEVOTED, DEEP, PASSIONATE, CURIOUS, CREATIVE, INTROSPECTIVE, FEEL POSSIBILITIES, ORIGINAL, VAGUE, IMAGINATIVE, FLEXIBLE, INSPIRATIONAL, GENTLE, INNOVATIVE, CAREFUL, INDIVIDUAL, ADAPTABLE, IDEALISTIC, COMPLEX, TOLERANT, RELAYED, LOVED NATURE, HARMONIOUS</p>	 <p>GANDALF</p> <p><b>THE PHILOSOPHER INTP</b></p> <p>PRIVATE, QUIET, INDEPENDENT, SKEPTICAL, CURIOUS, LOGICAL, FOCUSED, NON CONFORMING, ADAPTIVE, UNPREDICTABLE, QUESTIONING, PRECISE, OBJECTIVE, ABSTRACT, INFERIOUS, DETACHED, INSIGHTFUL, PROBLEM SOLVER, INTELLECTUAL, INTELLIGENT, CONTEMPLATIVE, SPECULATIVE, THEORETICAL</p>
 <p>GIMLI</p> <p><b>THE ADVENTURER ESTP</b></p> <p>ACTIVE, ADVENTUROUS, DIRECT, TALKATIVE, CURIOUS, IMPULSIVE, GOOD NATURED, ENERGETIC, ALERT, FRIENDLY, MATERIALISTIC, CONSERVANT, PRAGMATIC, RESOURCEFUL, PRACTICAL, LOGICAL, FUN LOVING, SPONTANEOUS, VERSATILE, ASSERTIVE, RATIONAL, STRAIGHTFORWARD, LITRAL, ENJOYING, INVENTIVE</p>	 <p>PIPPIN</p> <p><b>THE PERFORMER ESNF</b></p> <p>CURIOUS, SENSITIVE, ACTIVE, ENTHUSIASTIC, CARING, UNPREDICTABLE, WARM, GREGARIOUS, PLAYFUL, TALKATIVE, IMPASSIONATE, FUN LOVING, GOOD NATURED, OPEN, FRIENDLY, BANGING, ADAPTABLE, REALISTIC, COMMON SENSE, FLEXIBLE, SPONTANEOUS, TACTFUL, PRACTICAL, HARMONIOUS, FLEXIBLE, SUPPORTIVE</p>	 <p>ARWEN</p> <p><b>THE INSPIRER ENFP</b></p> <p>AUTHENTIC, CURIOUS, PLAYFUL, VERSATILE, RESTLESS, OUTGOING, INSPIRATIONAL, ENERGETIC, PERSUASIVE, INDEPENDENT, ENTHUSIASTIC, ORIGINAL, INSPIRATIONAL, INGENUOUS, MAKES CONNECTIONS, APPRECIATIVE, WARM, SENSITIVE, INNOVATIVE, CREATIVE, ADAPTABLE, RESOURCEFUL, LAYERS, COMPASSIONATE, SCALABLE</p>	 <p>MERRY</p> <p><b>THE VISIONARY ENTP</b></p> <p>ENTHUSIASTIC, FRIENDLY, OUTGOING, HUMOROUS, ENERGETIC, FLEXIBLE, UNPREDICTABLE, LAYERS, RATIONAL, STRATEGIC, IMAGINATIVE, LOGICAL, ANALYTICAL, CREATIVE, CONCEPTUAL, BIG, TAKING, INNOVATIVE, ADAPTABLE, CLEVER, INDEPENDENT, RESOURCEFUL, MOTIVATOR, ASSERTIVE, OUTGOING</p>
 <p>BOROMIR</p> <p><b>THE ENFORCER ESTJ</b></p> <p>RESPONSIBLE, ENERGETIC, OUTSPOKING, PRACTICAL, REALISTIC, MATTER OF FACT, STRUCTURAL, LEADER, DECISIVE, ACCOUNTABLE, ORGANIZED, LOGICAL, DIRECT, OUTGOING, PRACTICAL, PRODUCTIVE, IN DIRECT, ACTIVE, STRONG, STRUCTURED, SELF-CONSCIOUS, ORGANIZER, EFFICIENT, OPPORTUNIST, HONEST</p>	 <p>BILBO</p> <p><b>THE PROVIDER ESFJ</b></p> <p>ORGANIZED, DECISIVE, FRIENDLY, SENSITIVE, LITRAL, RESPONSIBLE, SOCIABLE, CONVENTIONAL, REALISTIC, PRACTICAL, LOYAL, OUTGOING, TALKATIVE, ORDERLY, SYMPATHETIC, ENERGETIC, IDEAL ORIENTED, OPEN, CONSCIENTIOUS, ACCURATE, CONSISTENT, HELPFUL, ACTIVE, WELCOMING, UNDERSTANDING, APPRECIATIVE</p>	 <p>FARAMIR</p> <p><b>THE GIVER ENFJ</b></p> <p>FRIENDLY, EMPATHETIC, OUTGOING, ENTHUSIASTIC, RELATIONAL, GOOD COMMUNICATOR, DECISIVE, OPPORTUNIST, PRODUCTIVE, ORGANIZED, LOYAL, RESPONSIBLE, INNOVATIVE, SUPPORTIVE, IDEALISTIC, GRACIOUS, TOLERANT, SOCIABLE, IMAGINATIVE, HELPFUL, PERSONABLE, CURIOUS, WARM, PERSUASIVE</p>	 <p>THEODEN</p> <p><b>THE COMMANDER ENTJ</b></p> <p>STRONG WILLED, OUTSPOKING, LOGICAL, COMPETENT, GLOBAL PERSPECTIVE, DEMANDING, PRISM, FRIENDLY, KNOWLEDGEABLE, PRODUCTIVE, NATURAL LEADER, ORGANIZED, DECISIVE, ASSERTIVE, FAIR, EFFICIENT, DETERMINED, INNOVATIVE, STRATEGIC, OUTGOING, STIMULATING, CRITIC, CONTROLLED, CLEAR, PLANNER</p>

# MBTI - Origin

- Personality test developed in 1962
- Used for HR purposes

# Categorization

## **Extraversion (E):**

Focus on outer world

## **Sensing (S):**

Focus on basic information, on the presence

## **Thinking (T):**

Look at logic and consistency

## **Judging (J):**

Prefer to get things decided, plan in advance, organize

## **Introversion (I):**

Focus on inner world

## **Intuition (N):**

Prefer to interpret and add meaning, focus on the future

## **Feeling (F):**

Look at people and circumstances

## **Perceiving (P):**

stay flexible and open to new information, improvise

# The Data Set

The background of the slide is a solid blue color. On the right side, there is a decorative graphic consisting of several concentric, semi-circular lines in a slightly darker shade of blue. Scattered across these lines and the background are numerous small, light blue dots, creating a sense of data points or a network.

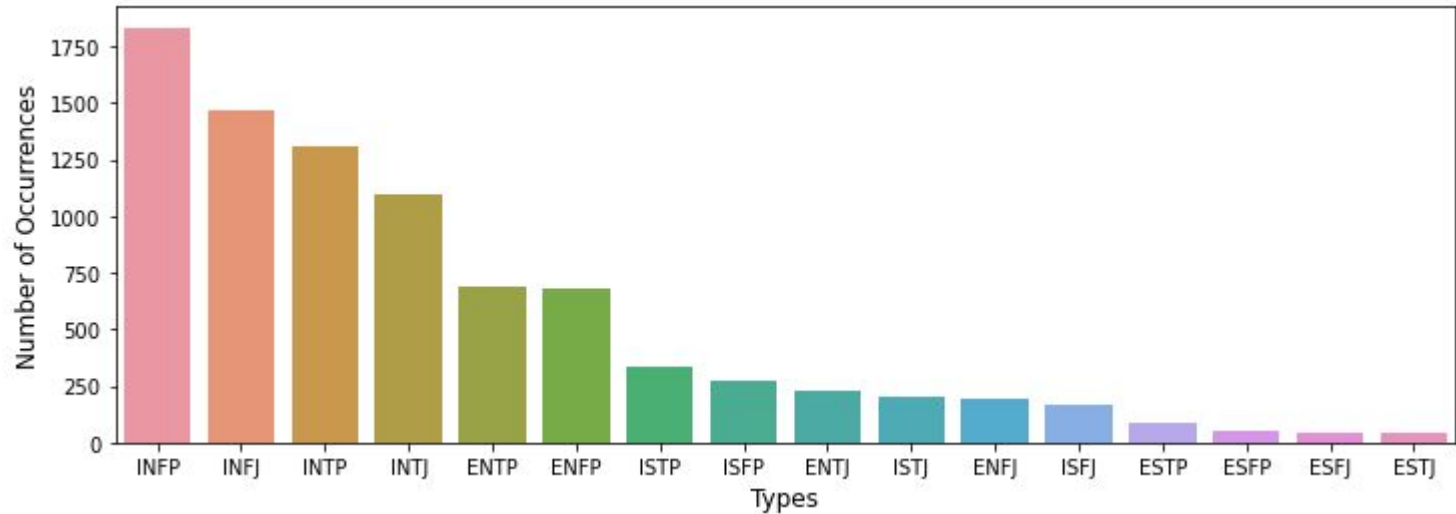
# The Dataset

- Myers-Briggs Personality Type Dataset (kaggle)
- Collected through *personalitycafe.com*
- 8675 rows of data
  - Person's MBTI type
  - Last 50 posts

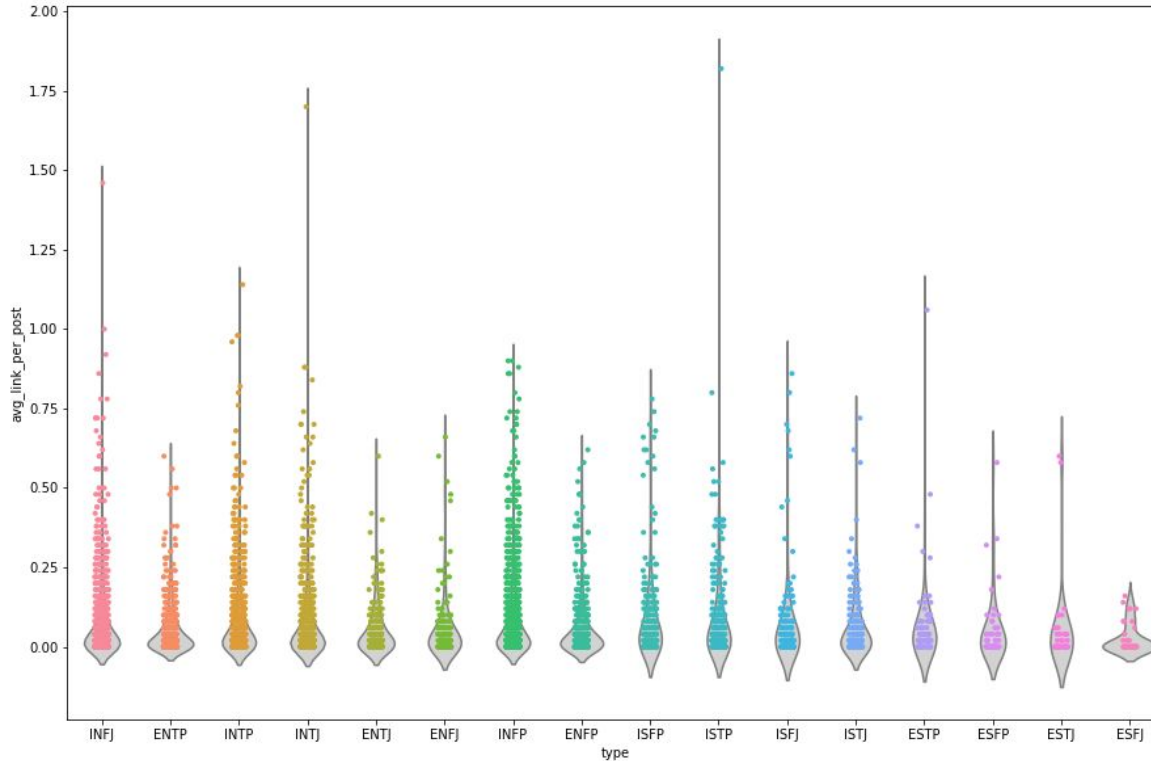


# Number of posts of all MBTI types

- Unbalance in Introvert/Extrovert and Intuition/Sensing pairs



# Average links per post

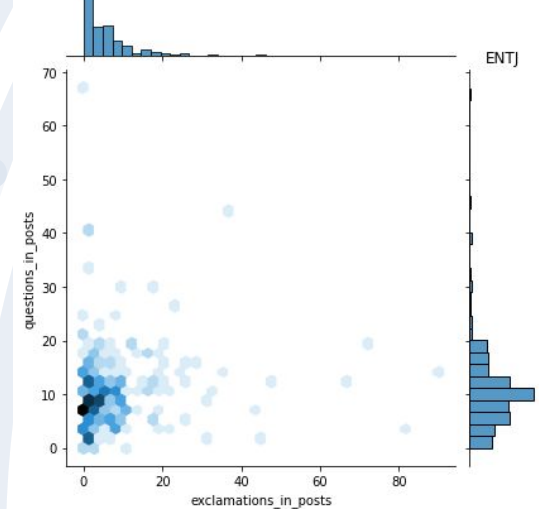
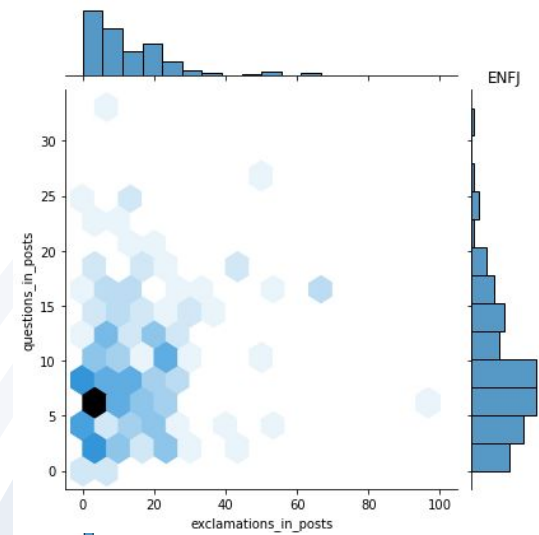
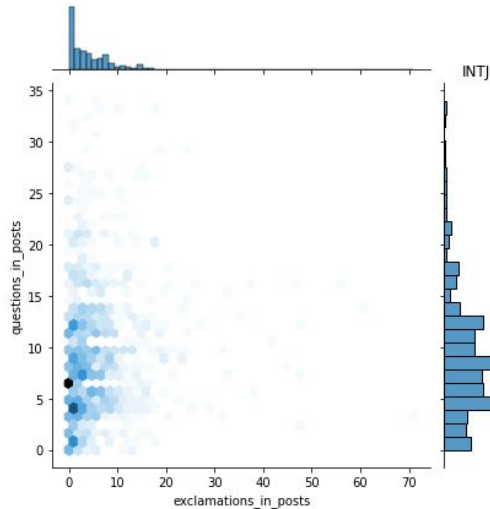
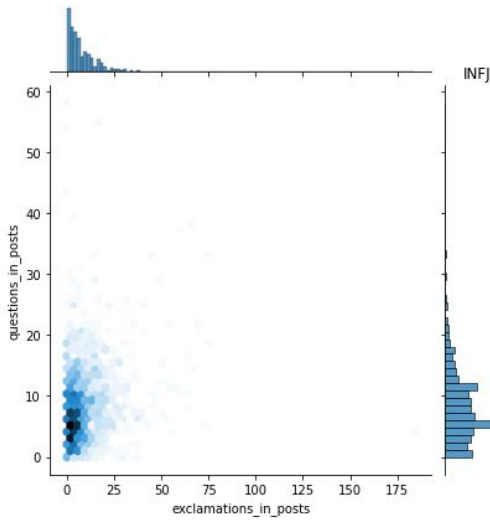


- More links posted by Introverts than Extroverts
- Other personality aspects relatively balanced

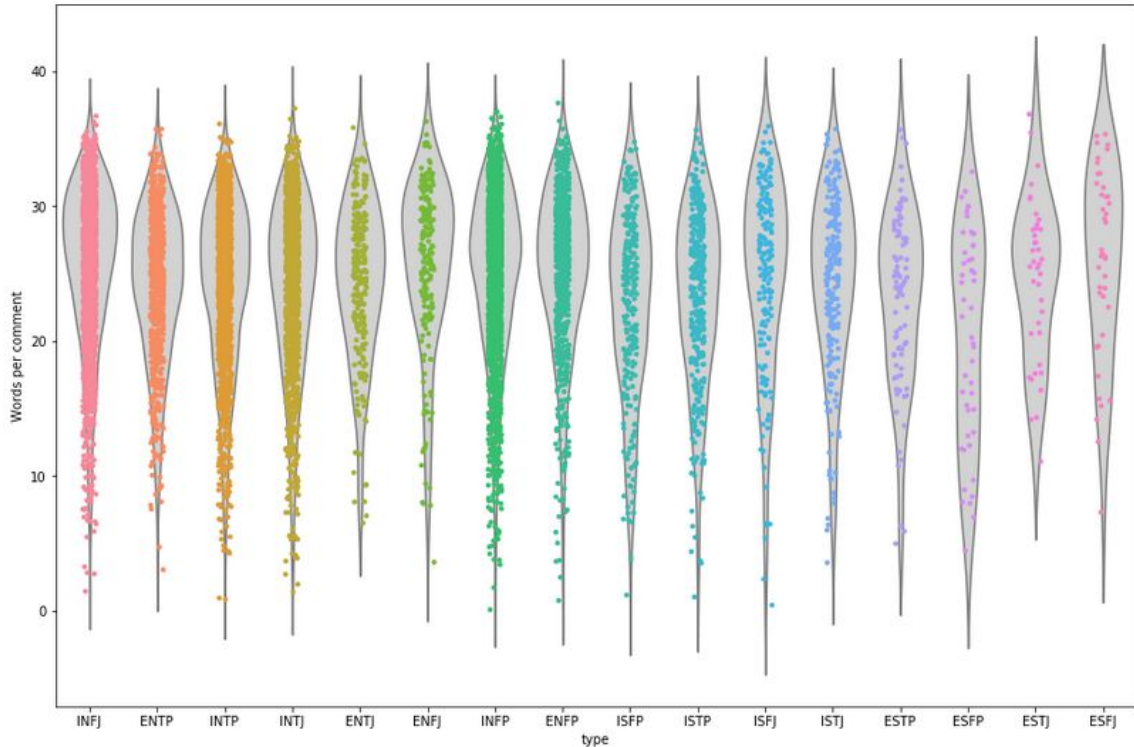
# Questions vs. Exclamations

## I vs. E

- Generally more question than exclamation marks
- Slightly more EMs for Extroverts



# Average number of words per post



- F types have broader range between few and many words compared to T
- Otherwise relatively balanced

-

# Text Processing

# Text Processing

- Counted and removed links
  - Improvement : replacing with <LINK>-keyword
- Expanded contractions (ain't" -> "are not, " s" -> " is )
- Counted and removed punctuations
  - Improvement : keeping them
- Removed numbers and words with numbers ("gr8", "100 moments")
- Removed MBTI strings
- Removed stopwords like "I" , "a", "the"

# Text Processing

## Before:

'https://www.youtube.com/watch?v=PLAaiKvHvZs|||51 :o|||I went through a break up some months ago. We were together for 4 years and I had planned my life around that relationship. I wasn't the one breaking the relationship as you might imagine and all our...|||ENFJ Puns so many puns.|||....

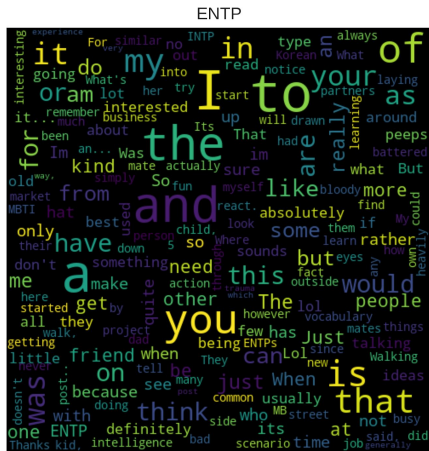
## After:

['went', 'break', 'months', 'ago', 'together', 'years', 'planned', 'life', 'around', 'relationship', 'one', 'breaking', 'relationship', 'might', 'imagine', 'puns', 'many', 'puns', ...]

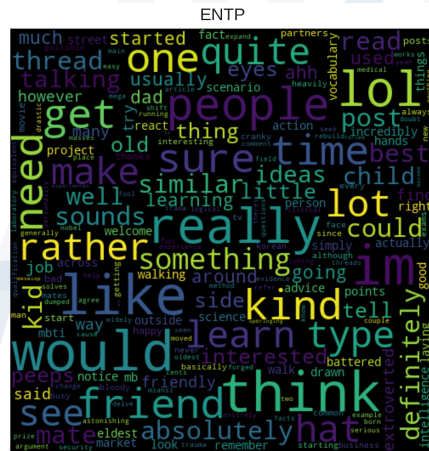


# Text Processing

## Before:



## After:



# Project Process

The background is a solid blue color. On the right side, there is a series of concentric, semi-circular arcs in a slightly darker shade of blue. Scattered across these arcs and the rest of the background are numerous small, light blue dots, creating a sense of motion or a network.

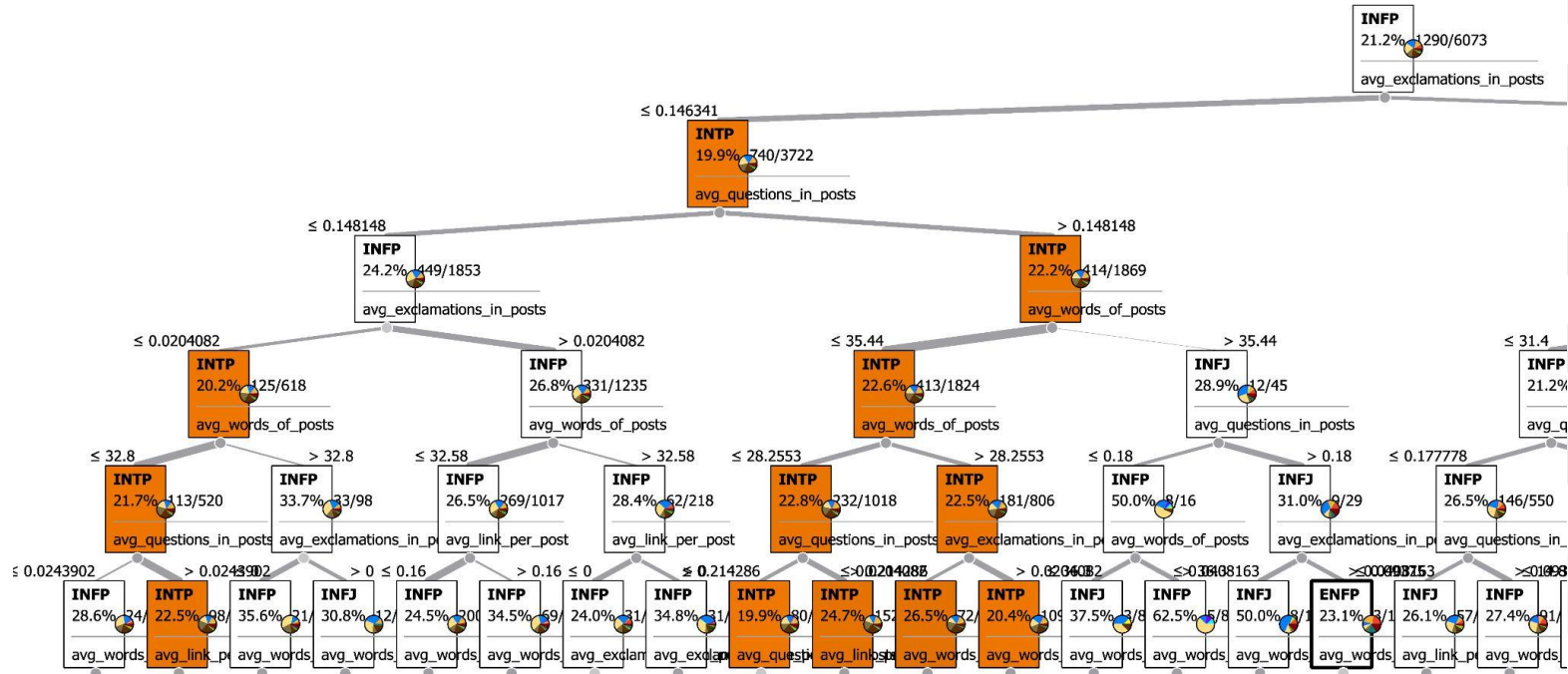
# Binary Tree

Data used for Binary Tree:

type	avg_link_per_post	avg_words_of_posts	avg_exclamations_in_posts	avg_questions_in_posts
INFJ	0,4800	16,1667	0,0833	0,0556
ENTP	0,2000	26,2128	0,0000	0,0851
INTP	0,1000	20,9286	0,0952	0,2143
INTJ	0,0400	22,6600	0,0600	0,1800
ENTJ	0,1200	22,5000	0,0217	0,1739
INTJ	0,0200	30,7800	0,0000	0,2000
INFJ	0,0400	28,4490	0,0612	0,2449
INTJ	0,0200	25,1200	0,0000	0,6800

# Binary Tree

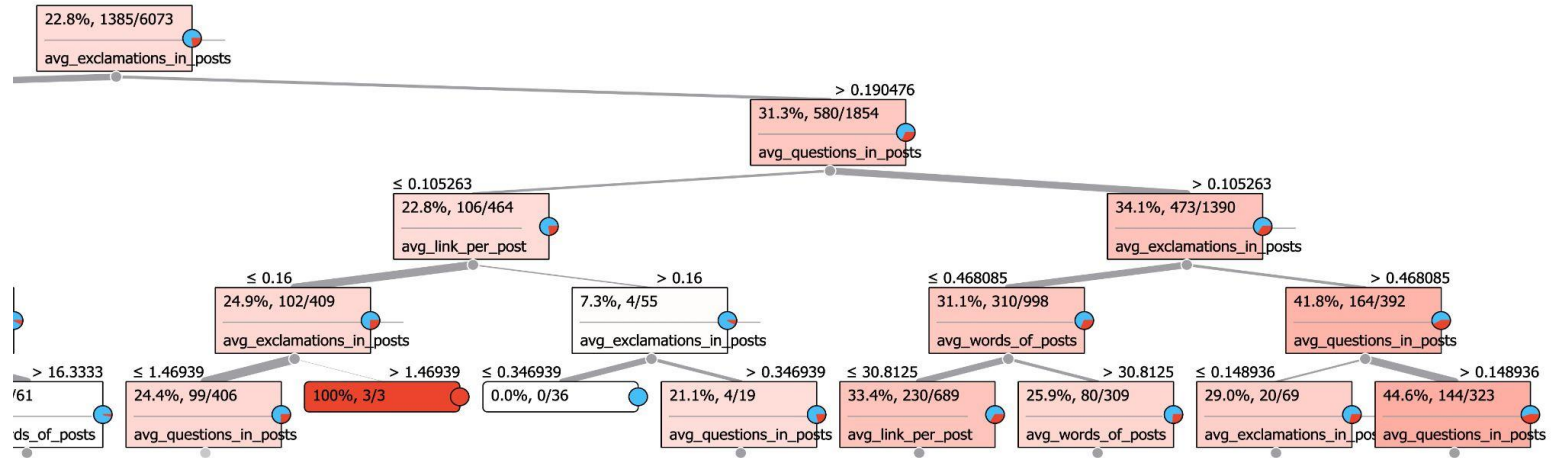
## exact prediction of the type



- Accuracy at 15,4%

# Binary Tree

## prediction Introvert or Extrovert



- Accuracy at 65%

# One Hot Encoding

Steps:

1. Tokenize variables
2. Vectorize post to binary representation
3. Processing by Neural Network

Problem:

- Context of sentence is lost

# TF-IDF : Definition

## **Weight:**

$$TF * IDF = \sim 0.15$$

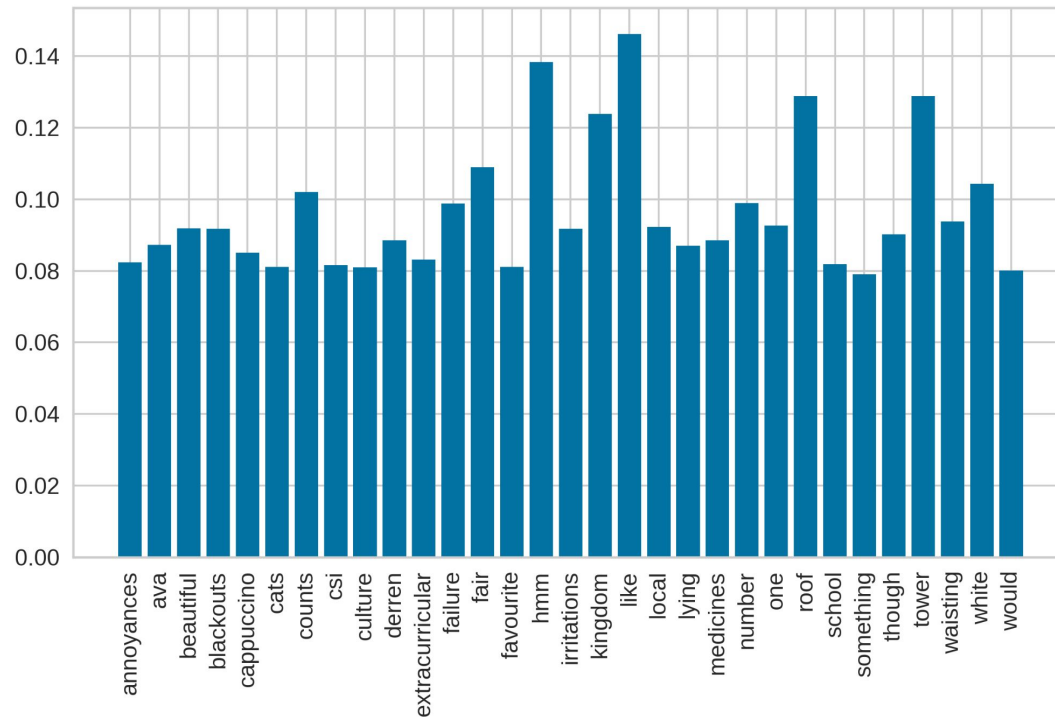
## **Term Frequency:** (Frequency / Term Count)

$$TF(\text{test}) = 2 / 10 = 0.5$$

## **Inverse Document Frequency:** (Document Count / Frequency)

$$IDF(\text{test}) = \log(2/1) = \sim 0.3$$

# TF-IDF : Transformation





# N-Gram

(1,1)

['aba', 'abandonment', 'abbey', ... 'zwanglos', 'zylinder', 'zynthaxx']

(2,2)

['aba daba', 'ability able', 'ability change', ... 'zombie apocalypse', 'zone like', 'zooey deschanel']

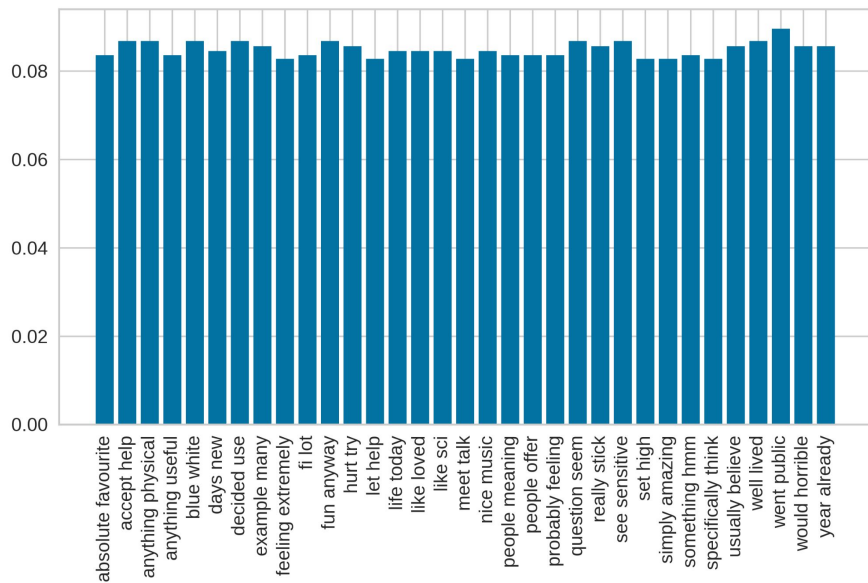
(3,3)

['aba daba aba', 'ability acquire apply', ... 'zero dark thirty', 'zero sum game']

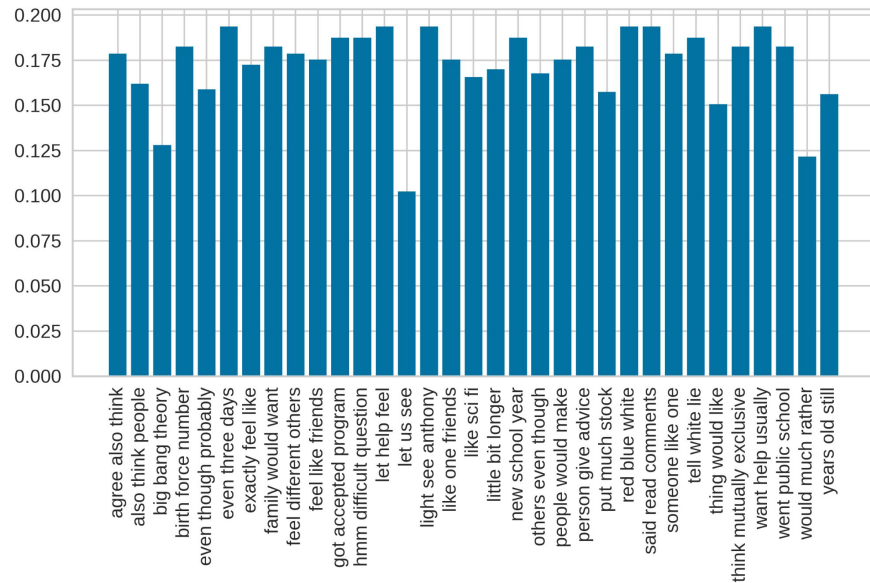
(1,2)

['ability', 'ability make', ... 'zodiac sign', 'zoe']

# TF-IDF : N-Gram



2,2



3,3

# MultiClass VS MultiLabel

I S T P

0 1 1 0 = 6

I S T P

[0 1 1 0]

# Problem Transformation

## Multi-Label $\Rightarrow$ Multi-Class

Naive-Bayes Classifier (NB)  
Support Vector Machine (SVM)

Binary Relevance (BR)  
Label Power Set (LPS)

# Label Power Set : Transformation

4 Labels

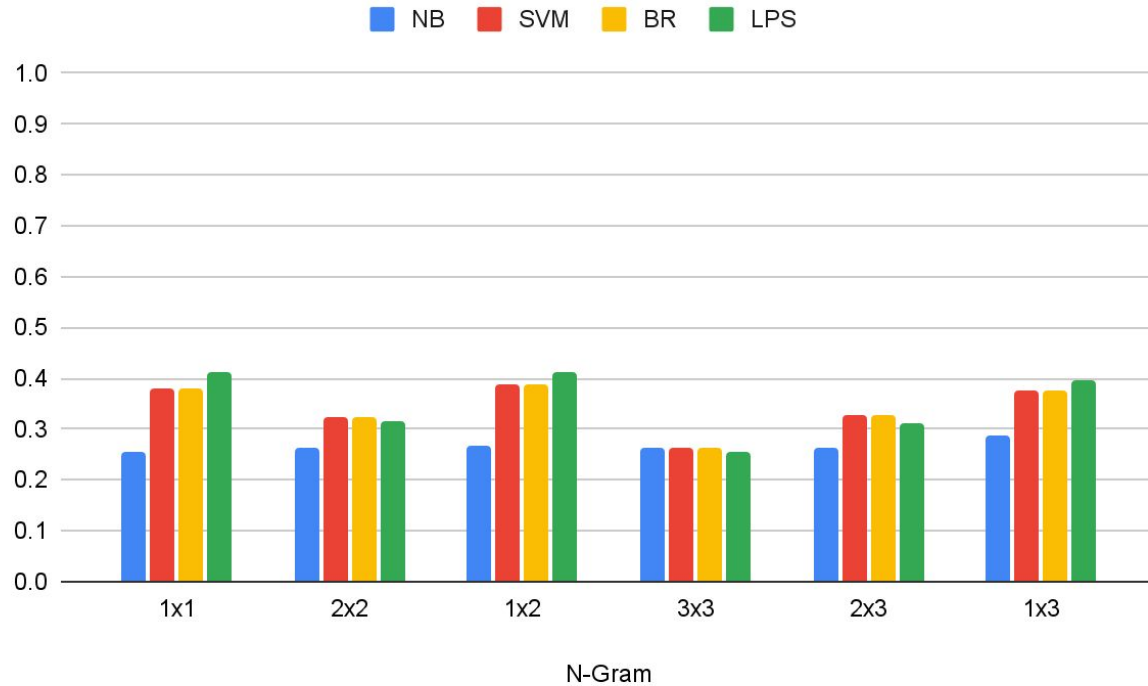
I S T P = [0 1 1 0]



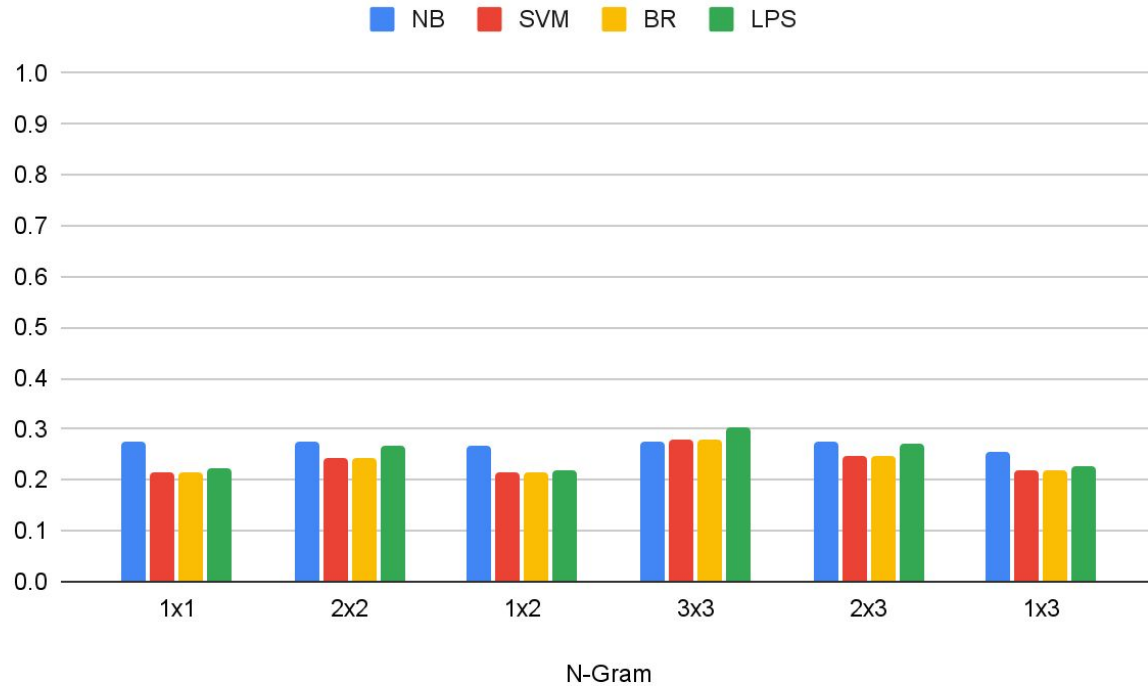
$2^4 = 16$  Classes

"I S T P" = 0110 = 6

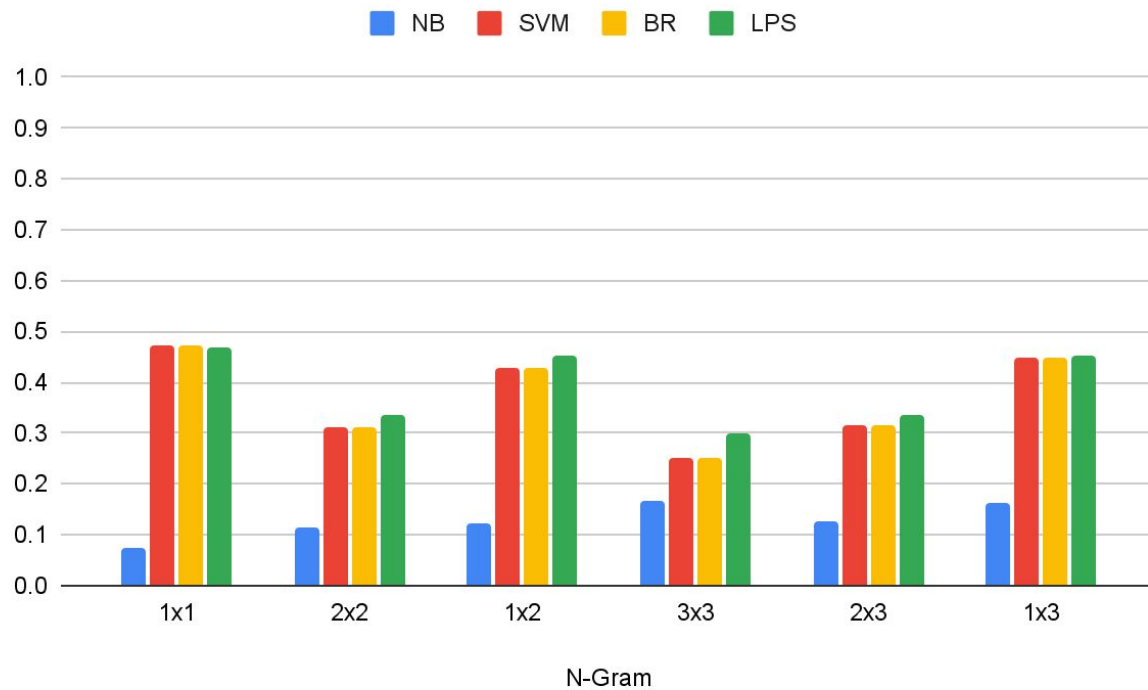
# N-Gram : Accuracy Score



# N-Gram : Hamming Loss

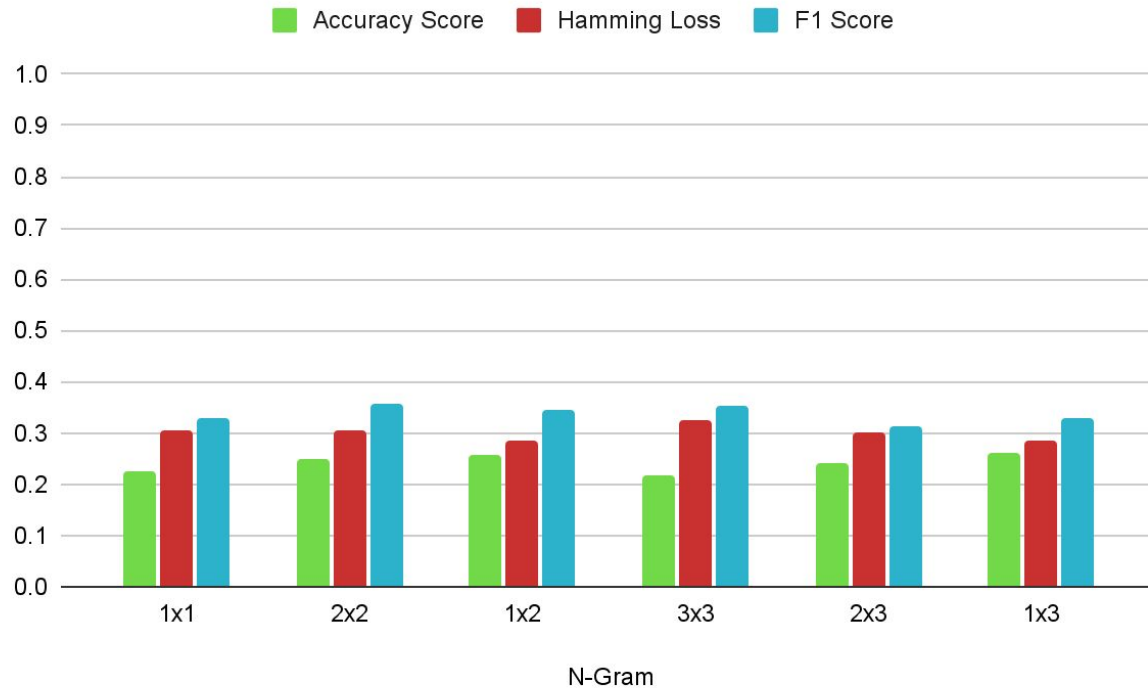


# N-Gram : F1 Score

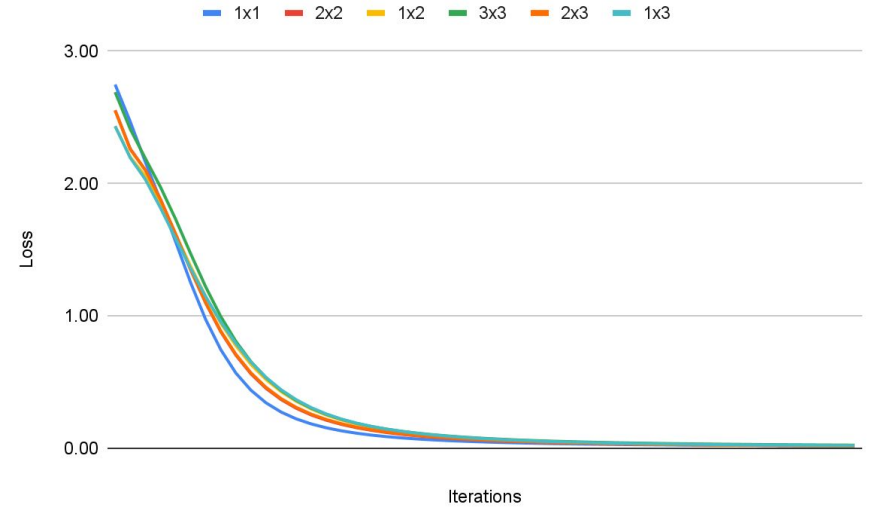
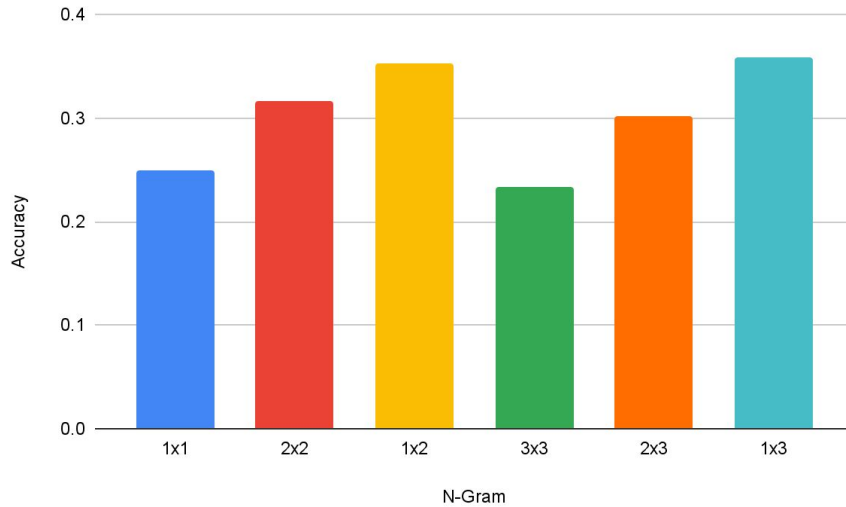




# Adapted Algorithm : ML-kNN



# Adapted Algorithm : ML-Perceptron



# Conclusion

The background of the slide is a solid blue color. On the right side, there is a decorative graphic consisting of several concentric, semi-circular arcs that curve from the bottom right towards the top right. Scattered along these arcs and in the surrounding blue space are numerous small, light-blue dots, creating a sense of depth and movement.

# Results

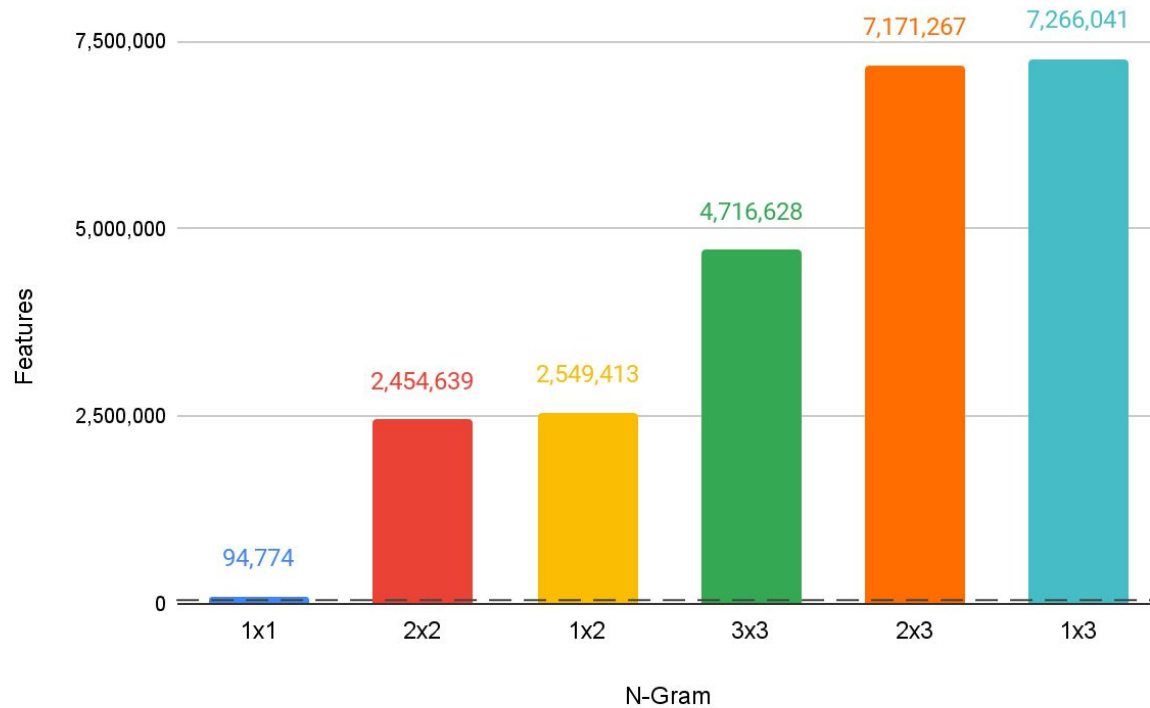
- Random guessing :  $50\%^4 = 6,25\%$
- Best guess 41,03%
  - LPS
  - (1,2)N-Gram
  - 50.000 features

→ Better than guessing, but not reliable enough

# Outlook

The background of the slide is a solid blue color. On the right side, there is a decorative graphic consisting of several concentric, semi-circular arcs that curve from the bottom right towards the top right. Scattered across these arcs and the surrounding blue space are numerous small, light blue dots, creating a sense of depth and movement, similar to a stylized fingerprint or a digital signal pattern.

# Feature Selection

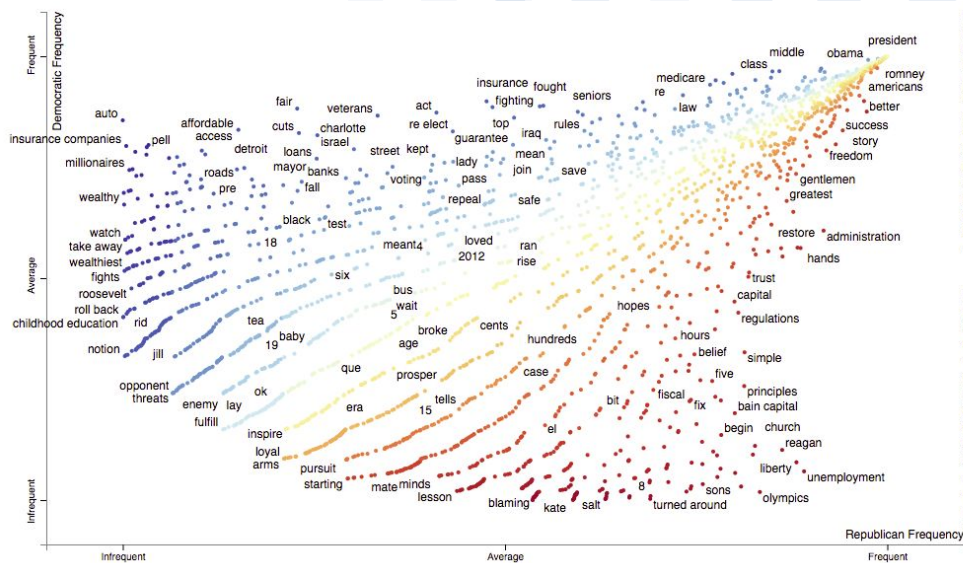


# Vectorizer

## Word2Vec:

Relationship	Example 1	Example 2	Example 3
France - Paris	Italy: Rome	Japan: Tokyo	Florida: Tallahassee
big - bigger	small: larger	cold: colder	quick: quicker
Miami - Florida	Baltimore: Maryland	Dallas: Texas	Kona: Hawaii
Einstein - scientist	Messi: midfielder	Mozart: violinist	Picasso: painter
Sarkozy - France	Berlusconi: Italy	Merkel: Germany	Koizumi: Japan
copper - Cu	zinc: Zn	gold: Au	uranium: plutonium
Berlusconi - Silvio	Sarkozy: Nicolas	Putin: Medvedev	Obama: Barack
Microsoft - Windows	Google: Android	IBM: Linux	Apple: iPhone
Microsoft - Ballmer	Google: Yahoo	IBM: McNealy	Apple: Jobs
Japan - sushi	Germany: bratwurst	France: tapas	USA: pizza

## Bag-of-words:



# Model Parameters

<b><u>NB</u></b>	<b><u>LSVM</u></b>	<b><u>MLkNN</u></b>	<b><u>MLP</u></b>
Smoothing	Penalty Norm	Amount of Neighbours	Size of Hidden Layers
Prior Class Probabilities	Loss Function	Smoothing	Activation Function
	Tolerance		Solver
	Regularization		Regularization
	Amount of Iterations		Batch Size
			Learning Rate



# Sources

- <https://www.myersbriggs.org/my-mbti-personality-type/mbti-basics/>
- <https://www.16personalities.com/articles/our-theory>
- <https://i.pinimg.com/736x/63/72/e4/6372e45c2749cf0f2863b7fd6f1759ba.jpg>
- <https://www.kaggle.com/aryansakhala/determining-personality-type-using-ml>
- <https://www.kaggle.com/prajwalkaushal/personality-prediction-mbti>
- <http://tfidf.com/>
- [https://www.researchgate.net/figure/3D-word-embeddings-visualization\\_fig2\\_338405739](https://www.researchgate.net/figure/3D-word-embeddings-visualization_fig2_338405739)
- <https://github.com/JasonKessler/scattertext>
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- Efficient Estimation of Word Representations in Vector Space - Mikolov, Chen, Corrado, Dean
- Binary relevance for multi-label learning: an overview - Zhang, Li, Liu, Geng