

CMPE 561:Natural Language Processing

RESEARCH PROJECT

SENTIMENT ANALYSIS

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Agenda



01 Introduction

02 Sentiment Classification

03 The state-of-the-art

04 Tools&Corpora

05 Challenges

06 Conclusions

01

Introduction



Sentiment

Sentiment := <Holder, Target, **Polarity**, Auxiliary>

- 📌 **Holder:** who expresses the sentiment
- 📌 **Target:** what/whom the sentiment is expressed to
- 📌 **Polarity:** the nature of the sentiment (positive, negative, or neutral)
- 📌 **Auxiliary:** strength, summary, confidence, time

The games in iPhone 4s are pretty funny!

↑
Feature/Aspect

↑
Target

↓
Positive
↑
Polarity





Thumb up or down



Positive or negative

Love 市 Hate
愛 恨

Love or hate

01

Introduction



Sentiment Analysis

Computational study of opinions, sentiments, appraisal, and emotions expressed in text

Ex: Reviews, blogs, discussions, microblogs, social networks

Basic tasks:

- 📌 Holder detection
- 📌 Target recognition
- 📌 **Sentiment (Polarity) classification**
- 📌 Opinion summarization
- 📌 Opinion spam detection



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Introduction



Application Domains


- 📌 **Politics/political science:** to find public opinions about political candidates and issues
 - 📌 **Law/policy making:** to examine public opinions about law candidates and issues
 - 📌 **Sociology:** to understand Idea propagation through groups
 - 📌 **Psychology:** to investigate dream sentiment analysis
- 

02

Sentiment Classification



Types of Sentiment Classification

- 📌 Lexicon Based Sentiment Classification
 - 📌 Dictionary-based Approach
 - 📌 Corpora-based Approach
 - 📌 Statistical and Semantic
 - 📌 Machine Learning Based Sentiment Classification
 - 📌 Unsupervised Learning
 - 📌 Supervised Learning
 - 📌 Decision Tree, Linear, Rule-based, Probabilistic
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02

Sentiment Classification



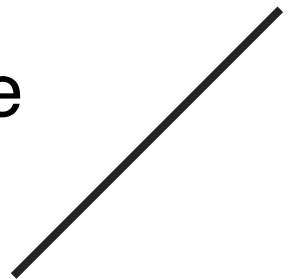
Lexicon-based Sentiment Classification

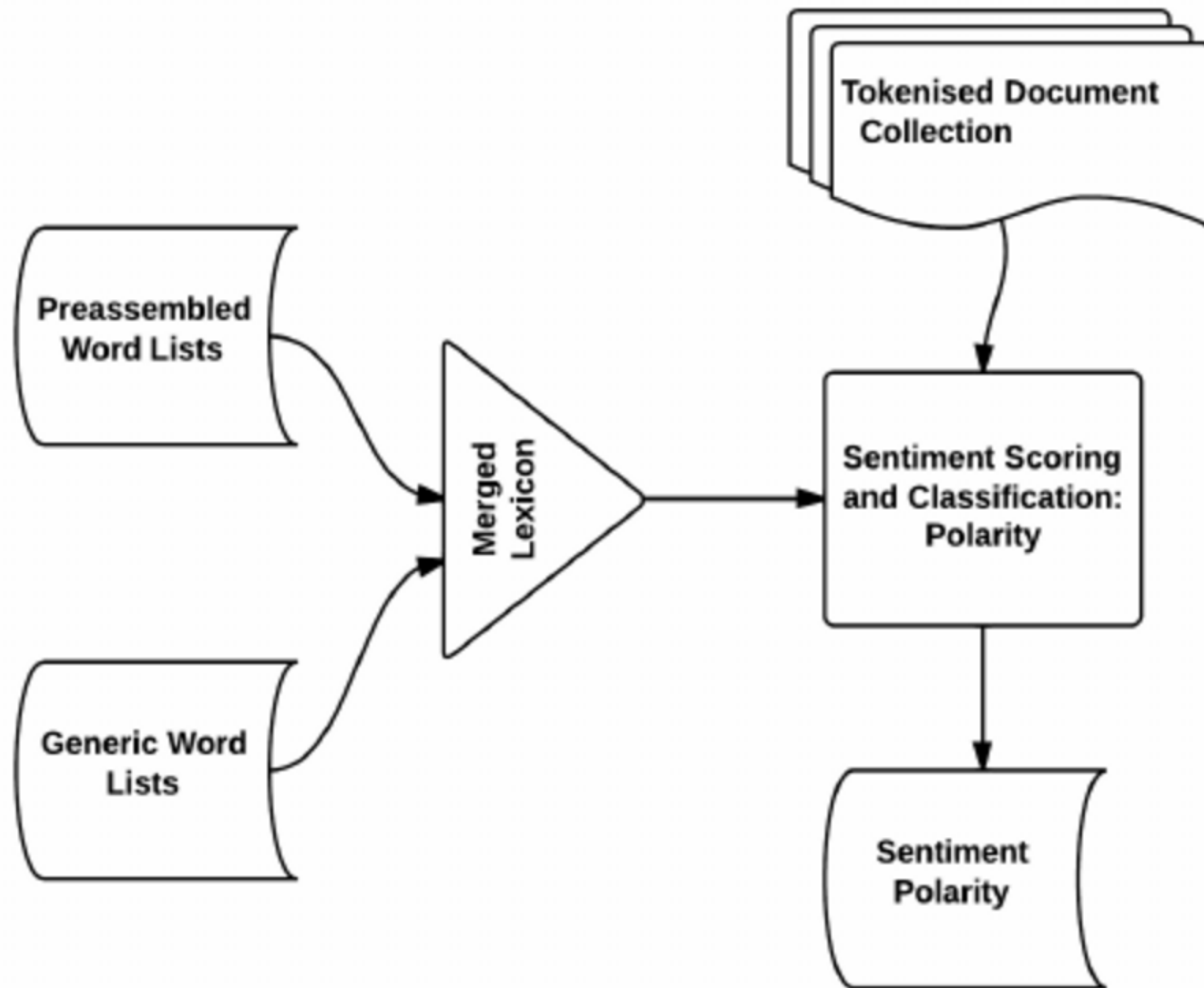
- Use the dominant polarity of the opinion words (ADJ, ADV and VERB) in the sentence to determine its polarity
- If positive/negative opinion prevails, the opinion sentence is regarded as positive/negative

Optimization Methods:

Lexicon + Grammar Rule + Inference

Lexicon + Counting





General Work-Flow Diagram of Lexicon-based Classification

02

Sentiment Classification

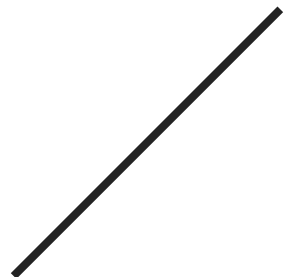
Machine Learning-based Sentiment Classification

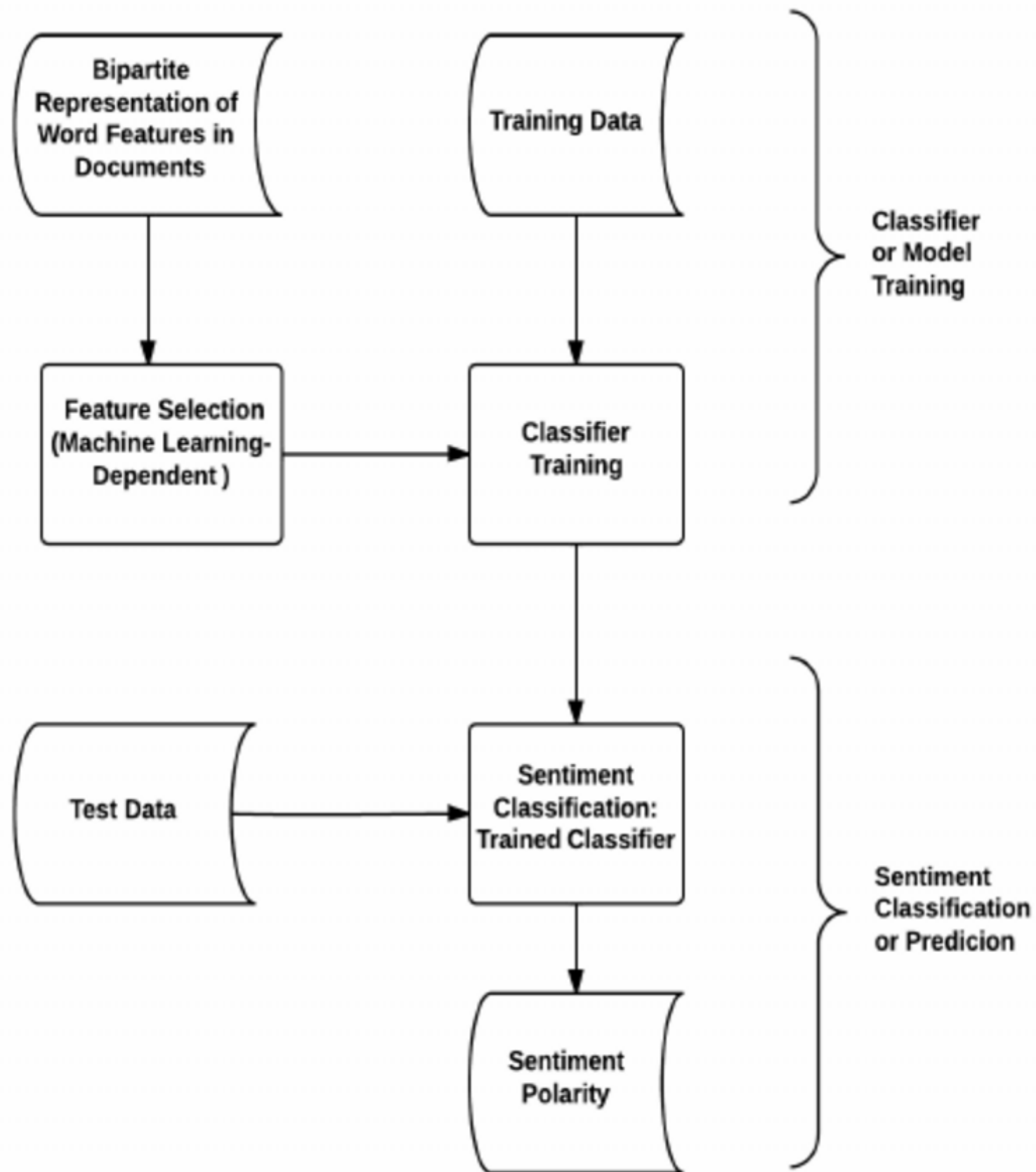
📌 Treat sentiment classification simply as a special case of topic-based categorization

Ex : With the two “topics” being positive sentiment and negative sentiment

Common Method

Data + Feature + Model





General Work-Flow Diagram of Machine Learning-based Classification

02

Sentiment Classification

Machine Learning-based vs Lexicon-based Classification

- No explicit result
 - The success depends on details, data, domains, scenarios
- Observation
 - Lexicon-based: simple, intuitive, and understandable
 - ML-based: data-driven, uninterruptible, and large-scaled
- Briefly,
 - Sentence: Lexicon-based is better
 - Document: ML-based is better

03

The state-of-the-art

Current Studies

- *Turney(2002)*
an unsupervised learning algorithm for classifying reviews as recommended or not recommended
- Starts with tagging phrases, then calculates PMI(Point-wise Mutual Information)



03

The state-of-the-art

Current Studies

- *Pang and Lee(2008)*
classify documents not by
topic, by overall sentiment



03

The state-of-the-art

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Current Studies

- *Socher et al.(2013)* uses Deep Learning
- Introduce a sentiment treebank
- Recursive Neural Tensor Network(RNTN)
- Very good results



Tools

General Inquirer :

A computer-assisted approach for content analysis of textual data.

- Classifies as positive and negative



Tools&Corpora

Tools

LIWC(Linguistic Inquiry and Word Count)

- The program includes the primary text analysis module along with a group of built-in dictionaries.
- Reads computer-readable form.
- Contains 6400 words, word stems, and selected emoticons
- Affective(negative, positive) and cognitive(tentative, inhibition)



Tools&Corpora

Tools

WordNet is a lexical database.

- Include sets of synonyms called senses, short definitions, use cases, and various relations among the words.



Tools&Corpora



Tools

SentiWordNet is a strategy for examination of definition related to synnets of the WordNet data set.

- The synnet has three numerical score including objective, negative, and positive polarity.



Tools&Corpora

Tools

SentiTurkNet is the first Turkish polarity resource.

- Three scores: positivity, negativity and objectivity
- Results for Turkish better than SentiWordNet

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Tools&Corpora

Corpora

- **Pang & Lee Data Sets**
Polarity(positive or negative)
Subjective Rate(from 1 to 5)
Subjective or Objective
- **Blitzer et al. Multi-domain sentiment analysis**
Amazon data
Classify as Pos or Neg
- **MPQA**
Private states(beliefs, emotions, sentiments, speculations)

04

Tools&Corpora

Current Challenges

- Sentiments words and phrases(lexicon) is necessary but not sufficient for high performance sentiment analysis

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Challenges

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Current Challenges

- A positive or negative opinion word may have inverse introductions in diverse application areas.
- “This camera sucks”
- “This vacuum cleaner really sucks”

05

Challenges

Current Challenges

- Sarcastic sentences with or without sentiments words are hard to handle
- “What a great car! It stopped working in two days.”

05

Challenges

< 24 >

Current Challenges

- A sentence containing opinion words may not express any sentiment.
- e.g “Can you tell me which Sony camera is good?”
- “Does anyone know how to repair this terrible printer?”

05

Challenges

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Current Challenges

- Many sentences without sentiment words can likewise suggest opinions.
- “This washer uses a lot of water”

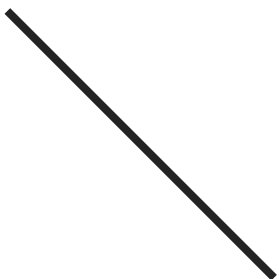
05

Challenges

06

Conclusions

- 📌 Sentiment analysis is a difficult task
- 📌 The difficulty increases with the nuance and complexity of opinions expressed
- 📌 There are many different methods for sentiment analysis
 - Lexicon-based
 - Machine Learning-based



THANKS FOR
LISTENING

