

## **Atividade 1:** Pesquisa e apresentação do Texto Científico 1

# **A survey on classification techniques for opinion mining and sentiment analysis**

**Disciplina:** Prática de Laboratório de Pesquisa (TC Parte 1)

**Profª Ana Maria Martins Carvalho Msc – 1º Sem/2024**

**Nome do Aluno (a): Arthur Fernandes Miranda Borges de Moraes**

**Nome do texto científico: Artigo.**

**Nome dos autores: Fatemeh Hemmatian,  
Mohammad Karim Sohrabi.**

**Ano de Publicação: 2017.**

**Nome do Periódico: A survey on classification  
techniques for opinion mining and sentiment  
analysis.**

**Qualis: A1.**

# OBJETIVOS

## 1 - OBJETIVO GERAL

**Realizar uma revisão sistemática de mineração de opiniões e análise de sentimento para classificar os métodos disponíveis e comparar suas vantagens e desvantagens.**

## 2 - OBJETIVOS ESPECÍFICOS

**Realizar a abordagem geral da mineração de opinião, abordar cada método principal, sua base de funcionamento, pontuar vantagens, desvantagens e características.**

## **Qual é o problema (pergunta a ser respondida com essa pesquisa)?**

Como é o processo de mineração de opinião e análise de sentimento, quais são os métodos conhecidos até a data de publicação, como eles funcionam e quais suas vantagens e desvantagens.

**Qual a justificativa para fazer essa pesquisa?**

**Apesar de existirem vários artigos sobre métodos de mineração de opinião, a falta de artigos de revisão sistemática entre eles é um fato. Este artigo se apresenta para suprir esta demanda.**

## Metodologia

Realizar a revisão dos artigos selecionados, coletar as informações principais sobre eles, apresentar diagramas com o processo da mineração de opinião e montar uma tabela que compara os métodos dos artigos selecionados, pontuando suas características.

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