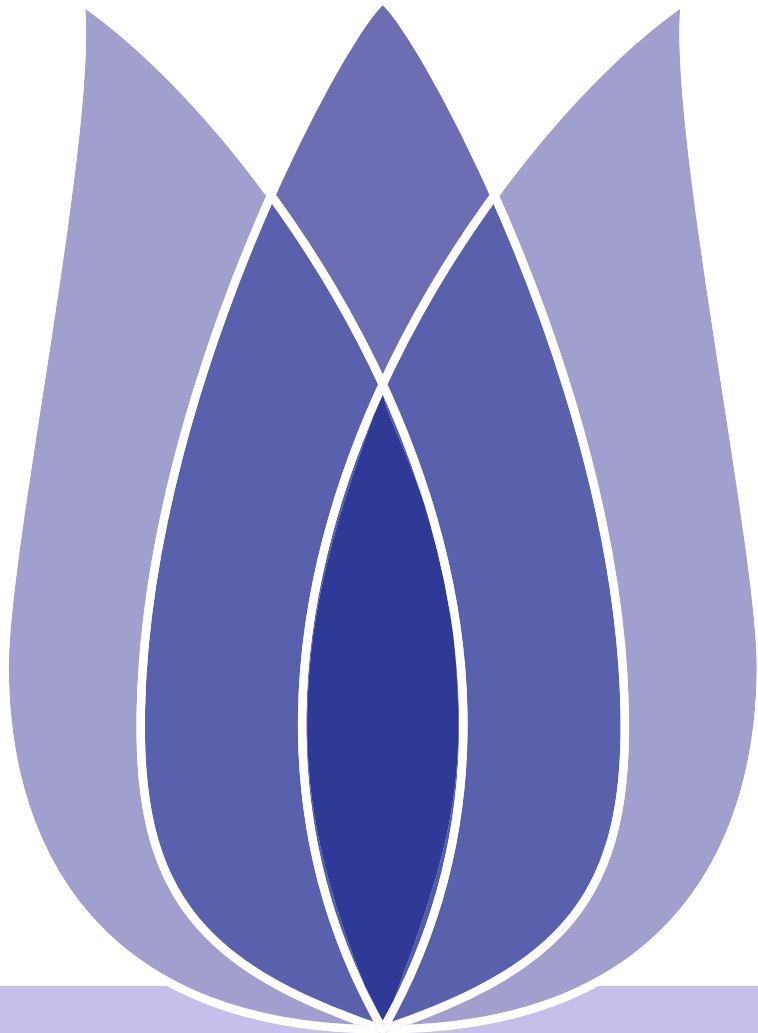




# FLIP00 Final Assessment

Cong Ma

2020-10-06





# Overview

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## Problem Definition

Kaggle Project Introduce

## Related Work and Challenges

Related Work - data collection

Challenges (1)

## GOAM Algorithm

Step One - Group Feature Extraction

Step Two - Outlying Degree Scoring

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# Problem Definition



# Kaggle Project Introduce

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Defn

Kobe Bryant marked his retirement from the NBA by scoring 60 points in his final game as a Los Angeles Laker on Wednesday, April 12, 2016. Drafted into the NBA at the age of 17, Kobe earned the sport’s highest accolades throughout his long career. Using 20 years of data on Kobe’s swishes and misses, can you predict which shots will find the bottom of the net? This competition is well suited for practicing classification basics, feature engineering, and time series analysis. Practice got Kobe an eight-figure contract and 5 championship rings. What will it get you?



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# Related Work and Challenges



# Related Work - data collection

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- Existing Methods - [Download from kaggle](#)
- Existing Methods - [Configure the running environment and load the required packages](#)



# Challenges (1)

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<a href="#">Related Work - data collection</a>
<a href="#">Challenges (1)</a>
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- How to **represent** the group features.
  - ◆ Can be affected by outlier values.
  - ◆ Can **Not** reflect the overall distribution of group features.







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# GOAM Algorithm



# Step One - Group Feature Extraction

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■ Suppose  $f_1, f_2, f_3$  are three features of  $G_q$ .

$$f_1: \{x_1, x_2, x_3, x_4, x_5, x_2, x_3, x_4, x_1, x_2\}$$

$$f_2: \{y_2, y_2, y_1, y_2, y_3, y_3, y_5, y_4, y_4, y_2\}$$

$$f_3: \{z_1, z_4, z_2, z_4, z_5, z_3, z_1, z_2, z_4, z_2\}$$

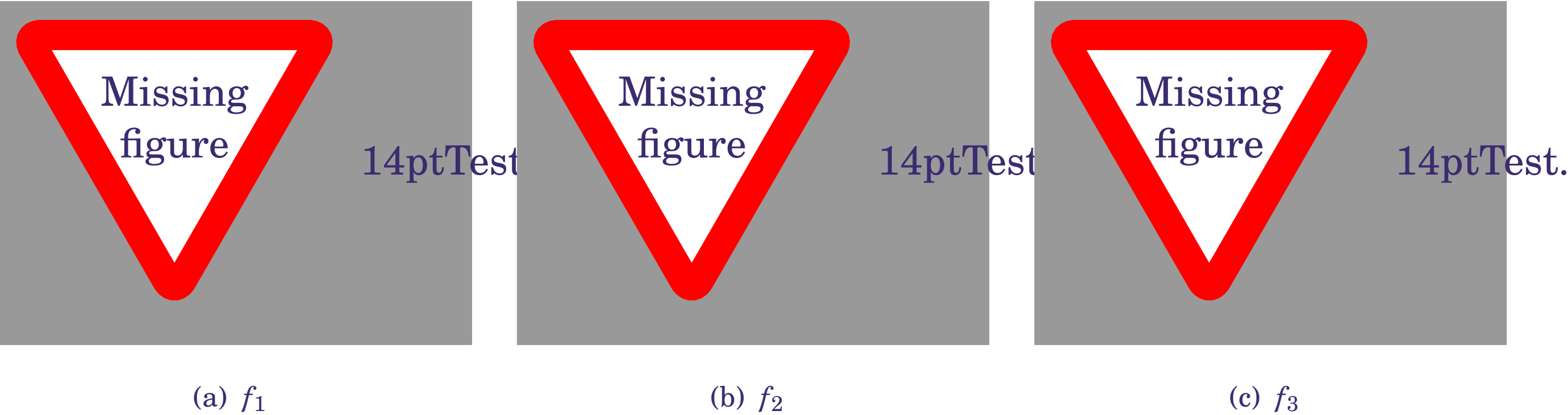


Figure 1: Histogram of  $G_q$  on three features



# Step Two - Outlying Degree Scoring

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- Calculate Earth Mover Distance
  - ◆ Represent one feature among different groups
  - ◆ Purpose: calculate the minimum mean distance

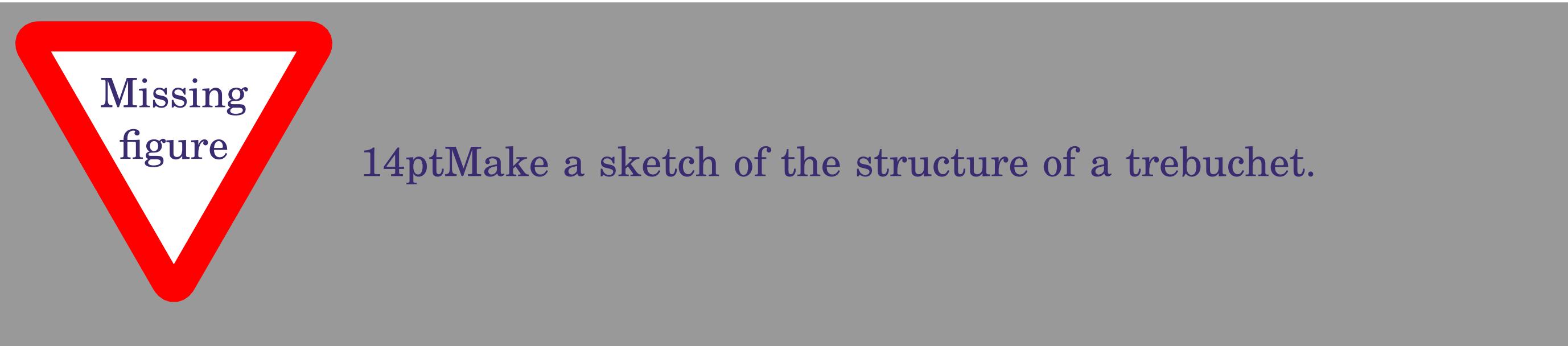


Figure 2: EMD of one feature



# Step Two - Outlying Degree Scoring

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## ■ Calculate the outlying degree

$$OD(G_q) = \sum_1^n EDM(h_{q_s}, h_{k_s})$$

- ◆  $n \Leftrightarrow$  the number of contrast groups.
- ◆  $h_{k_s} \Leftrightarrow$  the histogram representation of  $G_k$  in the subspace  $s$ .





# Step Three - Outlying Aspects Identification

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- Identify group outlying aspects mining based on the value of outlying degree.
- The greater the outlying degree is, the more likely it is group outlying aspect.



# Illustration

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Table 1: Original Dataset

$G_1$	$F_1$	$F_2$	$F_3$	$F_4$	$G_2$	$F_1$	$F_2$	$F_3$	$F_4$
	10	8	9	8		7	7	6	6
	9	9	7	9		8	9	9	8
	8	10	8	8		6	7	8	9
	8	8	6	7		7	7	7	8
	9	9	9	8		8	6	6	7
$G_3$	$F_1$	$F_2$	$F_3$	$F_4$	$G_4$	$F_1$	$F_2$	$F_3$	$F_4$
	8	10	8	8		9	8	8	8
	9	9	7	9		7	7	7	9
	10	9	10	7		8	6	6	8
	9	10	8	6		9	8	8	7
	9	9	7	9		8	7	9	8



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# Evaluation Results





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## ■ Synthetic Dataset and Ground Truth

Table 2: Synthetic Dataset and Ground Truth

Query group	$\mathbf{F}_1$	$\mathbf{F}_2$	$F_3$	$\mathbf{F}_4$	$F_5$	$F_6$	$F_7$	$F_8$
$i_1$	<b>10</b>	<b>8</b>	9	<b>7</b>	7	6	6	8
$i_2$	<b>9</b>	<b>9</b>	7	<b>8</b>	9	9	8	9
$i_3$	<b>8</b>	<b>10</b>	8	<b>9</b>	6	8	7	8
$i_4$	<b>8</b>	<b>8</b>	6	<b>7</b>	8	8	6	7
$i_5$	<b>9</b>	<b>9</b>	9	<b>7</b>	7	7	8	8
$i_6$	<b>8</b>	<b>10</b>	8	<b>8</b>	6	6	8	7
$i_7$	<b>9</b>	<b>9</b>	7	<b>9</b>	8	8	8	7
$i_8$	<b>10</b>	<b>9</b>	10	<b>7</b>	7	7	7	7
$i_9$	<b>9</b>	<b>10</b>	8	<b>8</b>	7	6	7	7
$i_{10}$	<b>9</b>	<b>9</b>	7	<b>7</b>	7	8	8	8





# Synthetic Dataset Results

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Table 3: The experiment result on synthetic dataset

Method	Truth Outlying Aspects	Identified Aspects	Accuracy
GOAM	$\{F_1\}, \{F_2F_4\}$	$\{F_1\}, \{F_2F_4\}$	100%
Arithmetic Mean based OAM	$\{F_1\}, \{F_2F_4\}$	$\{F_4\}, \{F_2\}$	0%
Median based OAM	$\{F_1\}, \{F_2F_4\}$	$\{F_2\}, \{F_4\}$	0%



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# Conclusion



# Conclusion

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- Formalize the problem of *Group Outlying Aspects Mining* by extending outlying aspects mining;
- Propose a novel method **GOAM algorithm** to solve the *Group Outlying Aspects Mining* problem;
- Utilize the pruning strategies to reduce time complexity.



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