## **Visual Soccer Analytics:**

Understanding the Characteristics of Collective Team Movement Based on Feature-Driven Analysis and Abstraction

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ISPRS International Journal of Geo-Information, Special Issue Advances in Spatio-Temporal Data Analysis and Mining, 2015

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## **Single Soccer Game**

- · Mainly geometrical data
- · Data every 100 milliseconds
- Manually annotated events (fouls, goals ...)

Data (5)

The need of a software

- Increasing demand from clubs
- Now we can
- Video analyst: 3 working days per opponent team
- Current support from system is limited
- · Visualisation to not get overwhelmed by data

## Improve previous work

- · No (good) automatic identification of situations
- Need expert verifications
- Doesn't support domain knowledge
- (1): classification method but no explanation

What: Data

#### **Tasks**

- · Support experts in exploring characteristics of
- · Incorporation of meaningful features describing situation
- · Visualisation with interactive re-ranking of features and search for similar situations

Overview

1 4

#### Workflow

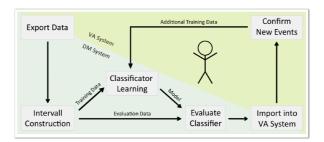
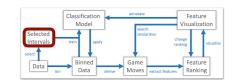


Figure 1. Previous workflow

· Intervals: General time interval Workflow · Event: Foul / goal / . Classification Feature Model Visualization Selected Intervals Binned Game Feature Data Ranking Data Moves

Figure 3. New workflow

Workflow

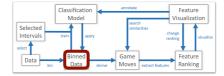


#### Interval selection:

- · Manual or automatic
- · Shows data of interest

Number of overcome players

· Main reason of use



#### Binning:

Workflow

- · Smooth out noise => better classification
- · Less Data
- 100 milliseconds -> 2 seconds time frame

Workflow

#### Classification model:

- · Compute features of binned data
- · 5 classification algorithms:
- · Logistic model trees, Logistic base, Functional trees, decision stump and Support vector machines
- · Training set: 33% of intervals
- · Returns classified set of 2s intervals

Workflow

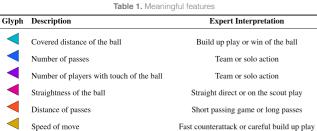
#### Game moves and Feature ranking:

- · Derive Game moves from interesting 2s intervals
- Extract interpretable features of each moves
- · Relevant if unusual values

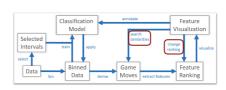
Workflow



Combination play or counterattack



# Workflow



#### Ranking change:

· User can reranking features

## Similarity search:

· Search similar moves based on events and ranking features

Visual design

## Time:

· Navigation and Show events

#### Move:

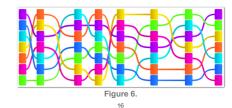
· Show moves duration and main feature



Visual design

#### Move characteristic:

- · Shows ranked features
- · Connector to see better
- · Drag and drop re-ranking



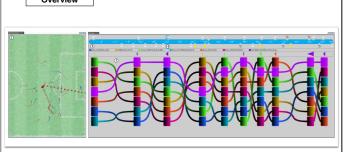


Figure 1.

Evaluation

#### Results

- Experts liked reducing complexity with meaningful features
- Agreed on features
- Proposed to add information on outcome
- Really liked similarity search (and re-ranking)
- Think that video analyst would use it

Thank you!

Evaluation

#### Data

- 66 professional soccer matches
- Manually annotated events (foul, pass, cross...)
- Temporal resolution: 100 milliseconds

## Discussion

## + strengths

- · Answer well their task
- · Method that you can tweak (reranking) but default => not overwhelming
- · Very detailed
- Features seem meaningful

#### Evaluation

## **Expert evaluation**

- 2 experts : involved in pre-study and expert study
- · Coach working at Bayern Munich
- Official referee
- "Ground truth" by additional expert: 35 situations

#### - weekness

Discussion

- No video for double check
- · Unnecessarily long
- Need to read 1st paper to understand some
- I would use air / ground and not straightness of ball

#### Evaluation

### Results

Table 2. Evaluations results

|   | Precision         | Recall            | F-Measure |
|---|-------------------|-------------------|-----------|
| First Classification                                    | 61.53% (8 of 13)  | 22.85% (8 of 35)  | 33%       |
| Second Classification<br>(First round of user feedback) | 58.82% (20 of 34) | 57.14% (20 of 35) | 57%       |
| Third Classification (Second round of user feedback)    | 55.76% (29 of 52) | 82.85% (29 of 35) | 66%       |

## Discussion

#### - weekness

- Validation by 2 "experts" but no video analyst
- 66 games dataset in validation but only use 1
- Very important to have a global view of a tactic not precise movement every 2 seconds
- · Only single game
- Do not critique their paper