Article

Order out of chaos: emergent patterns in soccer matches

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Abstract

A soccer match is a very complex, apparently chaotic, human event. However, order clearly emerges from such chaos if we have at hand the right tools to extract pattern configurations. In this work, a new algorithm called *Soccer-Decompiler* is presented, which is able to analyze soccer matches and extract emerging patterns from apparently chaotic sequences of events. Detecting and filtering the frequencies of events is used by *Soccer-Decompiler* to discover such patterns. The application of *Soccer-Decompiler* to a real soccer match shows that order out of chaos in complex human events can be effectively extracted by isolating highly frequent events. An applicative example is given.

Keywords chaotic patterns; complexity; emergent behaviors; frequencies filtering; order; pattern configurations; real life analysis; soccer analysis; Soccer-Decompiler.

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1 Introduction

"Soccer decoding" has been introduced by Ferrarini (Ferrarini, 2014) to indicate the use of scientific tools to: 1) reduce the complexity of a soccer match to its irreducible essence using a game theory algorithm, 2) simulate soccer matches by adding iteration and stochasticity to such structural essence. *Soccer-Decoder* (Ferrarini, 2012a; Ferrarini, 2015) is a math algorithm, implemented through the software *Soccer-Lab* (Ferrarini, 2012b), that simulates soccer matches by merging together 3 scientific methods: game theory, differential calculus and stochastic simulations. The rationale behind *Soccer-Decoder* is that even very complex real world events, when turned into their irreducible essence, can be understood and predicted.

In this work, a twin algorithm called *Soccer-Decompiler* (Ferrarini, 2011) is presented, which is able to analyze soccer matches and extract emerging patterns from apparently chaotic sequences of events. The application of *Soccer-Decompiler* to a real soccer match shows that order out of chaos in complex human events can be extract by detecting and filtering highly frequent events. An applicative example is given.

2 Soccer-Decompiler

Soccer-Decompiler (Ferrarini 2011) is both a statistical algorithm and a software to analyze soccer events. It receives data from both keyboard and vocal inputs. From a computation viewpoint, it:

a) turns input data into strings;

- b) analyzes frequencies of such strings;
- c) filters the most frequent events;
- d) tests frequencies versus null hypotheses.

So doing, *Soccer-Decompiler* detects the most frequent patterns and tests them to compute their statistical significance. Data are inputted using an *ad hoc* code called *Soccer-encipher* (Ferrarini, 2011).

3 An illustrative example

A real soccer match (90 minutes length) has been analyzed using the *Soccer-Decompiler* algorithm/software. Only one of the two teams has been studied, the amateur team "Montebello72" that allowed to record through a digital camera and then analyze the friendly match played in the Cittadella public park in Parma on August 18th 2015 versus the team "Montebello71". Data were inserted using vocal input.

First, *Soccer-Decompiler* detected the number of actions and the percentage of positive (shots on goal), negative (balls lost) and neutral (the action was interrupted but the ball remained to the studied team) actions (Table 1).

The analyzed team developed 110 actions during the match, of which 22 positive (shots on goal). It results clear that the first half was better for both total actions (60 vs. 50) and positive ones (13 vs. 9).

| Actions | total | % | 1st half | % | 2nd half | % |
|-------------------|-------|-------|----------|-------|----------|-------|
| number of actions | 110 | 100 | 60 | 54.55 | 50 | 45.45 |
| positive | 22 | 20.00 | 13 | 59.09 | 9 | 40.91 |
| negative | 70 | 63.64 | 37 | 52.86 | 33 | 47.14 |
| neutral | 18 | 16.36 | 10 | 55.56 | 8 | 44.44 |

 $\label{eq:table1} Table \ 1 \ \text{Number and outcome of the actions developed by the studied team}.$

Second, *Soccer-Decompiler* detected action lengths (Table 2). The analyzed team developed prevalently short actions with 2 passages (25 actions) or just 1 passage (19 actions). It should be noted that short actions were sometimes decided by the opponent team that stopped the action of the analyzed team.

| Table 2 Action lengths of the studied tea | ım. |
|---|-----|
|---|-----|

| Action lengths | total | % | 1st half | % | 2nd half | % |
|----------------|-------|-------|----------|-------|----------|-------|
| 0 passages | 14 | 12.73 | 11 | 18.33 | 3 | 6.00 |
| 1 passage | 19 | 17.27 | 9 | 15.00 | 10 | 20.00 |
| 2 passages | 25 | 22.73 | 12 | 20.00 | 13 | 26.00 |
| 3 passages | 12 | 10.91 | 6 | 10.00 | 6 | 12.00 |
| 4 passages | 10 | 9.09 | 6 | 10.00 | 4 | 8.00 |
| 5 passages | 4 | 3.64 | 3 | 5.00 | 1 | 2.00 |
| 6 passages | 9 | 8.18 | 3 | 5.00 | 6 | 12.00 |
| 7 passages | 3 | 2.73 | 1 | 1.67 | 2 | 4.00 |
| 8 passages | 8 | 7.27 | 5 | 8.33 | 3 | 6.00 |
| 9 passages | 3 | 2.73 | 2 | 3.33 | 1 | 2.00 |
| 10 passages | 1 | 0.91 | 1 | 1.67 | 0 | 0.00 |
| 11 passages | 1 | 0.91 | 0 | 0.00 | 1 | 2.00 |
| 12 passages | 0 | 0.00 | 0 | 0.00 | 0 | 0.00 |

| 13 passages | 0 | 0.00 | 0 | 0.00 | 0 | 0.00 |
|-------------|---|------|---|------|---|------|
| 14 passages | 0 | 0.00 | 0 | 0.00 | 0 | 0.00 |
| 15 passages | 1 | 0.91 | 1 | 1.67 | 0 | 0.00 |
| 16 passages | 0 | 0.00 | 0 | 0.00 | 0 | 0.00 |
| 17 passages | 0 | 0.00 | 0 | 0.00 | 0 | 0.00 |
| 18 passages | 0 | 0.00 | 0 | 0.00 | 0 | 0.00 |
| 19 passages | 0 | 0.00 | 0 | 0.00 | 0 | 0.00 |
| 20 passages | 0 | 0.00 | 0 | 0.00 | 0 | 0.00 |

Third, *Soccer-Decompiler* found the passages among the team divisions (Fig. 1). The analyzed team used an isotropic play where passage flows were common in all the directions. Passages from the four defenders to the three midfielders (45) and vice versa (48) were a bit more common than others. The three forwards tended to scarcely interact (only 27 passages among them), while they tended to prefer retro-passages to midfielders (39).



Fig. 1 Passage flows.

Fourth, *Soccer-Decompiler* found where ball was received by players (Table 3). For each player (on the row), numbers refer to the ball receipts in each zone of the field (see figure on the right). For instance, Def1 (right defender) received 21 balls in position 4 and 16 balls in position 7. Midf1, Midf3 and Forw2 were the only players without a clear position of ball receipt. Zones 5 and 8 were the dominant field zones for ball receipt.

Fifth, *Soccer-Decompiler* detected where ball was released by players (Table 4). For each player (on the row), numbers refer to the ball releases in each zone of the field. For instance, Def1 (right defender) released 20 balls in position 4 and 17 balls in position 7. Again, Midf1, Midf3 and Forw2 were the only players without a clear position of ball release. Zones 5 and 8 were the dominant field zones also for ball release.

| hall reasint | | | | Fiel | d zones | s (see i | mage (| on the r | ight) | | | | |
|--------------|---|-----|----|------|---------|----------|--------|----------|-------|----|----|----|-----|
| bail receipt | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | |
| def1 | 0 | -1- | 0 | 21 | 2 | 0 | 16 | 0 | 0 | 2 | 0 | 0 | Fam |
| def2 | 0 | 0 | 0 | 2 | 19 | 0 | 0 | 1 | 0 | 0 | 1 | .0 | |
| def3 | 0 | 0 | 0 | 0 | 12 | 1 | 0 | 2 | 0 | 0 | 0 | 0 | |
| def4 | 0 | 0 | 1 | 0 | 2 | 25 | 0 | 1 | 23 | 0 | 2 | 1 | |
| midf1 | 0 | 0 | 0 | 6 | 14 | 0 | 16 | 11 | 0 | 0 | 0 | 0 | KO |
| midf2 | 0 | 1 | Û. | 0 | 27 | 3 | Û. | 19 | 0 | 0 | Ũ. | Ū | |
| midf3 | 0 | 0 | 0 | 0 | 11 | 2 | 0 | 15 | 17 | 0 | 0 | 1 | |
| forw1 | 0 | 0 | 0 | 0 | 8 | 1 | 0 | 27 | 2 | 4 | 4 | 3 | |
| forw2 | 0 | 0 | 0 | 1 | 3 | 5 | 3 | 16 | 15 | 1 | 1 | 3 | |
| forw3 | 0 | 1 | Û | 0 | 3 | 0 | 1 | 10 | 0 | 2 | 2 | 0 | |
| subt | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 2 | 0 | 0 | 0 | 0 | |
| sub2 | Q | 1 | 0 | 0 | 8 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | |
| sub3 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 2 | 1 | 0 | 1 | 0 | |
| TOTAL | | 6 | 4 | 34 | 115 | 43 | 43 | 115 | 67 | 19 | 22 | 20 | |

Table 3 Positions of ball receipt. Numbers in bold refer to dominant values for each player.

Table 4 Positions of ball release. Numbers in bold refer to dominant values for each player.

| hall ralazes | | | | Fiel | d zones | s (see i | mage o | n the r | ight) – | | | |
|--------------|----|---|----|------|---------|----------|--------|---------|---------|----|----|----|
| Dall Telease | 1 | 2 | .3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 |
| def1 | 0 | 0 | 0 | 20 | 1 | 0 | 17 | 1 | 0 | 2 | 0. | 0 |
| def2 | 0 | 0 | 0 | 2 | 19 | 0 | 0 | 1 | 0 | 0 | 1 | 0 |
| def3 | 0 | 0 | Û. | 0 | 12 | 1 | Û. | 2 | 0 | 0 | 0. | 0 |
| def4 | 0 | 0 | 1 | 0 | 2 | 24 | 0 | 1 | 24 | 0 | 2 | 1 |
| midf1 | 0 | 0 | 0 | 5 | 11 | 0 | 15 | 16 | 0 | 0 | 0 | 0 |
| midf2 | 0 | 1 | 0 | 0 | 27 | 3 | 0 | 19 | 0 | 0 | 0 | 0 |
| midf3 | 0 | 0 | 0 | 0 | 11 | 2 | 0 | 16 | 16 | 0 | 1 | Û |
| forw1 | 0 | 0 | 0 | 1 | 6 | 1 | - 1 | 24 | 6 | 4 | 4 | 3 |
| for w2 | 0 | 0 | 0 | 0 | 4 | 3 | 3 | 17 | 15 | 1 | 1 | 3 |
| forw3 | 0 | 1 | 0 | 0 | 3 | 0 | 0 | 10 | 0 | 2 | 2 | 0 |
| sub1 | 0. | 0 | 0 | 0. | 0 | 0 | 0 | 2 | 0 | 0 | 0 | 0 |
| sub2 | 0 | 1 | 0 | 0 | 8 | 0 | 0 | 1 | 0 | 0 | 0 | 0 |
| sub3 | 0 | 0 | 0 | 0 | 0 | 0 | - 0 - | 3 | 1 | 0 | 1 | 0 |
| TOTAL | 1 | 5 | 4 | 32 | 109 | 40 | 43 | 121 | 71 | 19 | 23 | 19 |



Table 5 Passage flows (full match).

| | | | | F | RO | M (t | rans | smit | ters | ;) | | | | | | |
|----------|--------------|------|------|------|------|-------|-------|-------|-------|-------|-------|------|------|------|----------------|--------------|
| | | def1 | def2 | def3 | def4 | midf1 | midf2 | midf3 | forw1 | forw2 | forw3 | sub1 | sub2 | sub3 | balls received | transmitters |
| | def1 | 0 | 4 | 2 | 1 | 9 | 7 | 1 | 5 | 1 | 1 | 0 | 2 | 1 | 34 | 11 |
| 6 | def2 | 6 | 0 | 2 | 2 | 1 | 1 | 1 | 0 | 0 | 1 | 0 | 2 | 0 | 16 | 8 |
| <u> </u> | def3 | 0 | 4 | 0 | 2 | 0 | 4 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 11 | 4 |
| Ð | def4 | 0 | 4 | 4 | 0 | 2 | 9 | 10 | 6 | 5 | 0 | 0 | 0 | 1 | 41 | 8 |
| <u> </u> | midf1 | 12 | 2 | 2 | 0 | 0 | 9 | 5 | 8 | 3 | 3 | 0 | 1 | 0 | 45 | 9 |
| Û | midf2 | 4 | 1 | 2 | 6 | 8 | 0 | 5 | 4 | 7 | 1 | 0 | 1 | 0 | 39 | 10 |
| U | midf3 | 1 | 1 | 3 | 8 | 5 | 7 | 0 | 4 | 7 | 1 | 0 | 1 | 1 | 39 | 11 |
| Ψ. | forw1 | 6 | 0 | 0 | 7 | 8 | 8 | 4 | 0 | 9 | 4 | 0 | 0 | 1 | 47 | 8 |
| - | forw2 | 1 | 0 | 0 | 15 | 3 | 2 | 5 | 5 | 0 | 1 | 1 | 0 | 0 | 33 | 8 |
| \cap | forw3 | 3 | 0 | 0 | 2 | 5 | 0 | 1 | 5 | 0 | 0 | 0 | 0 | 0 | 16 | 5 |
| Ľ | sub1 | 0 | 0 | 0 | 1 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 2 | 2 |
| | sub2 | 0 | 1 | 0 | 1 | 0 | 2 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 5 | 4 |
| | sub3 | Ő | Ō | Ō | 1 | 1 | Ō | 2 | Ó | 1 | Ó | Ő | Ó | Ő | 5 | 4 |
| | balls passed | 33 | 17 | 15 | 46 | 42 | 50 | - 35 | - 38 | - 33 | 12 | 1 | 7 | 4 | | |
| | receivers | 7 | 7 | 6 | 11 | 9 | 10 | 10 | 8 | 7 | 7 | 1 | - 5 | 4 | | |

Sixth, *Soccer-Decompiler* uncovered the from-to nature of passages (Table 5). For each player (on the column; transmitter) numbers refer to the passages to player on the row (receiver). For instance, Def4 prevalently passed to Forw2, while Def1 to Midf1. Midf2 was the best transmitter (50 passages), while Forw1 was the best receiver (47 balls received).

If we consider separately the two halves of the match, passage flows are described in Tables 6 and 7. *Soccer-Decompiler* can produce chi squared tests to test if:

- matrix A (first half) is significantly different from matrix B (second half);

- there are significant (higher than by chance) lines of passage within each matrix.

Table 6 Passage flows (first half).

| | | | | F | RO | M (t | rans | smit | ters |) | | | | | | |
|-------------|--------------|------|------|------|------|-------|-------|-------|-------|-------|-------|------|------|------|----------------|--------------|
| | | def1 | def2 | def3 | def4 | midf1 | midf2 | midf3 | forw1 | forw2 | forw3 | sub1 | sub2 | sub3 | balls received | transmitters |
| | def1 | 0 | 3 | 2 | 1 | 6 | 5 | 1 | 3 | 0 | 1 | 0 | 0 | 0 | 22 | 8 |
| | def2 | 6 | 0 | 2 | 0 | 0 | 1 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 10 | 4 |
| S | def3 | 0 | 4 | 0 | 2 | 0 | 4 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 11 | 4 |
| Ø | def4 | 0 | 1 | 4 | 0 | 0 | 5 | 5 | 4 | 4 | 0 | 0 | 0 | 0 | 23 | 6 |
| <u>></u> | midf1 | 6 | 2 | 2 | 0 | 0 | 6 | 3 | 2 | 2 | 3 | 0 | 1 | 0 | 27 | 9 |
| Ð | midf2 | 2 | 1 | 2 | 3 | 4 | 0 | 3 | 2 | 5 | 1 | 0 | 0 | 0 | 23 | 9 |
| S S | midf3 | 1 | 0 | 3 | 4 | 4 | 4 | 0 | 3 | 2 | 0 | 0 | 0 | 0 | 21 | 7 |
| ۳. | forw1 | 1 | 0 | 0 | 5 | 6 | 4 | 3 | 0 | 5 | 3 | 0 | 0 | 0 | 27 | 7 |
| \sim | forw2 | 1 | 0 | 0 | 8 | 3 | 1 | 1 | 4 | 0 | 0 | 1 | 0 | 0 | 19 | 7 |
| 0 | forw3 | 3 | 0 | 0 | 1 | 3 | 0 | 1 | 3 | 0 | 0 | 0 | 0 | 0 | 11 | 5 |
| F | sub1 | 0 | 0 | 0 | 1 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 2 | 2 |
| | sub2 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| | sub3 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| | balls passed | 20 | 11 | 15 | 25 | 26 | 31 | 19 | 21 | 18 | 8 | 1 | 1 | Û | | |
| | receivers | -7 | 5 | 6 | 8 | 6 | 9 | 9 | 7 | - 6 | 4 | 1 | 1 | 0 | | |

| Table 7 Passage | flows | (second | half). |
|-----------------|-------|---------|--------|
|-----------------|-------|---------|--------|

| | | | | F | RO | M (t | rans | smit | ters |) | | | | | | |
|----------|--------------|------|------|------|------|-------|-------|-------|-------|-------|-------|------|------|------|----------------|--------------|
| | | def1 | def2 | def3 | def4 | midf1 | midf2 | midf3 | forw1 | forw2 | forw3 | sub1 | sub2 | sub3 | balls received | transmitters |
| | def1 | 0 | 1 | 0 | 0 | 3 | 2 | 0 | 2 | 1 | 0 | 0 | 2 | 1 | 12 | 7 |
| 6 | def2 | 0 | 0 | 0 | 2 | 1 | 0 | 0 | 0 | 0 | 1 | 0 | 2 | 0 | 6 | 4 |
| Ľ | def3 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| Ø | def4 | 0 | 3 | 0 | 0 | 2 | 4 | 6 | 2 | 3 | 0 | 0 | 0 | 1 | 21 | 7 |
| 2 | midf1 | 6 | 1 | 0 | 0 | 0 | 3 | 2 | 6 | 2 | 0 | 0 | 1 | 0 | 21 | 7 |
| ¢ | midf2 | 2 | 0 | 0 | 3 | 4 | 0 | 3 | 2 | 2 | 0 | 0 | 1 | 0 | 17 | 7 |
| C | midf3 | 0 | 1 | 0 | 5 | 1 | 4 | 0 | 1 | 6 | 1 | 0 | 1 | 1 | 21 | 9 |
| Ψ. | forw1 | 5 | 0 | 0 | 2 | 2 | 4 | 2 | 0 | 4 | 1 | 0 | 0 | 1 | 21 | 8 |
| | forw2 | 0 | 0 | 0 | 7 | 1 | 1 | 4 | 1 | 0 | 1 | 1 | 0 | 0 | 16 | 7 |
| \frown | forw3 | 0 | 0 | 0 | 1 | 2 | 0 | 0 | 2 | 0 | 0 | 0 | 0 | 0 | 5 | 3 |
| Ľ | sub1 | 0 | 0 | 0 | 1 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 2 | 2 |
| | sub2 | 0 | 1 | 0 | 1 | 0 | 2 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 5 | 4 |
| | sub3 | 0 | 0 | 0 | 1 | 1 | 0 | 2 | 0 | 1 | 0 | 0 | 0 | 0 | 5 | 4 |
| | balls passed | 13 | 7 | 0 | - 23 | 17 | 21 | 19 | 17 | 19 | 4 | 1 | 7 | 4 | | |
| | receivers | 3 | 5 | 0 | 9 | 9 | 8 | 6 | 8 | - 7 | 4 | 1 | 5 | - 4 | | |

In addition, *Soccer-Decompiler* can export its results to the free software Netdraw (Borgatti 2002) in order to produce the network graphs of the gameplay (Fig. 2). Many properties of the team's tactic become evident if only the most frequent events are isolated. For instance, Def2, Def3 and Forw3 scarcely took part to the play. Def4 to Forw2 was a very common play (15 times). Midf2 preferred the right side of the field, Midf3 preferred an easy backward play towards Def4, Forw2 prevalently sought Forw1 etc.



Fig. 2 Passage flow during the full match. Only links with 8 or more passages are showed.



Fig. 3 Passage flow in the first half of the match. Only links with 5 or more passages are showed.



Fig. 4 Passage flow in the second half of the match. Only links with 5 or more passages are showed.

If we separately consider the two halves of the match, differences are evident. During the first half, the studied team used a complex web of passages (Fig. 3). Instead, during the second half the analyzed team applied a very simple and neat web of passages involving separately the left and right sides of the field (Fig. 4). The change in tactic was due to the fact that the studied team scored at the end of the first half, and defended its advantage in the second half.

4 Conclusions

A soccer match is a very complex, apparently chaotic human event. However, order clearly emerges from such chaos if we have at hand the right tools to extract pattern configurations.

Detecting and filtering the frequencies of events has been used here by the algorithm *Soccer-Decompiler* to discover such patterns. Results presented in this work show that this algorithm is on top of discovering emergent behaviors at both player and team level. *Soccer-Decompiler* is also a scientific software with both keyboard and vocal inputs that can be applied to any soccer event, both amateur and professional.

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