

Independent Verification and Validation Report

General Information

| | | | | |
|-------------------------|------------------|-------------------|---------------------------|-----------------|
| State | Project Name | Program Name | Progress Report Date | POC Name |
| ----- | ----- | ----- | ----- | ----- |
| Virginia | TestProject | E&E | 12-15-15 | Bob |
| POC Email | Submitter Name | Submitter Role | Submitter Email | Submitter Phone |
| ----- | ----- | ----- | ----- | ----- |
| Bob@va.gov | Jim | Admin | Jim@va.gov | 7035721234 |
| Activity 1 Consult Date | RFP Release Date | IV&V Onboard Date | Next Progress Report Date | |
| ----- | ----- | ----- | ----- | |
| 04-12-12 | 12-15-12 | 12-15-12 | 12-15-12 | |

Executive Summary

Extensive research has been conducted into the modelling of professional tennis matches. Most current approaches take advantage of the hierarchical structure of the tennis scoring system to define stochastic models, based on Markov chains. These models use only the probability of each of the players winning a point on their serve to compute their respective probabilities of winning the match. Consequently, a variety of factors that contribute to the outcome of a match are ignored. We propose a supervised machine learning approach that uses historical player performance across a wide variety of statistics to predict match outcomes. We define a novel method of extracting 22 features from raw historical data, including abstract features, such as player fatigue and injury. Using the resulting dataset, we develop and optimise models based on two machine learning algorithms: logistic regression and artificial neural networks. When evaluated on a test set of 6315 ATP matches played in the years 2013-2014, our models outperform Knottenbelt's Common-Opponent model, the current state-of-the-art in stochastic modelling. Our neural network generates a return on investment of 4.35% when in competition with the betting market, an improvement of about 75%. We believe that the use of machine learning will lead to innovation in the field of tennis modelling.

Project Management Office Status

| | | | | |
|--------------|------------------|--------------------|----------------------|-------|
| Total Budget | Earned Value(EV) | Budget Variance(%) | Schedule Variance(%) | Other |
| ----- | ----- | ----- | ----- | ----- |
| 5% | 15% | 25% | 35% | 10% |

Life Cycle Status and Schedule

Care Management (Status: Pre-R1)

| Target App. Date | Target Dev. Start | Target R1 | Target R2 | Target Go Live | Target R3 |
|------------------|-------------------|-----------|-----------|----------------|-----------|
| ----- | ----- | ----- | ----- | ----- | ----- |
| 12-22-12 | 12-22-12 | 12-22-12 | 12-22-12 | 12-22-12 | 12-22-12 |

Contractor Management (Status: R1)

| Target App. Date | Target Dev. Start | Target R1 | Target R2 | Target Go Live | Target R3 |
|------------------|-------------------|-----------|-----------|----------------|-----------|
| ----- | ----- | ----- | ----- | ----- | ----- |
| 12-22-12 | 12-22-12 | 12-22-12 | 12-22-12 | 12-22-12 | 12-22-12 |

Third Party Liability (Status: R2)

| Target App. Date | Target Dev. Start | Target R1 | Target R2 | Target Go Live | Target R3 |
|------------------|-------------------|-----------|-----------|----------------|-----------|
| ----- | ----- | ----- | ----- | ----- | ----- |
| 12-22-12 | 12-22-12 | 12-22-12 | 12-22-12 | 12-22-12 | 12-22-12 |

FFS Claims and Adjudication (Status: R3)

| Target App. Date | Target Dev. Start | Target R1 | Target R2 | Target Go Live | Target R3 |
|------------------|-------------------|-----------|-----------|----------------|-----------|
| ----- | ----- | ----- | ----- | ----- | ----- |
| 12-22-12 | 12-22-12 | 12-22-12 | 12-22-12 | 12-22-12 | 12-22-12 |

Risks

Risk 5 (ID: 5)

Description: Extensive research has been conducted into the modelling of professional tennis matches. Most current approaches take advantage of the hierarchical structure of the tennis scoring system to define stochastic models, based on Markov chains. These models use only the probability of each of the players winning a point on their serve to compute their respective probabilities of winning the match. Consequently, a variety of factors that contribute to the outcome of a match are ignored. We propose a supervised machine learning approach that uses historical player performance across a wide variety of statistics to predict match outcomes. We define a novel method of extracting 22 features from raw historical data, including abstract features, such as player fatigue and injury. Using the resulting dataset, we develop and optimise models based on two machine learning algorithms: logistic regression and artificial neural networks. When evaluated on a test set of 6315 ATP matches played in the years 2013-2014, our models outperform Knottenbelt's Common-Opponent model, the current state-of-the-art in stochastic modelling. Our neural network generates a return on investment of 4.35% when in competition with the betting market, an improvement of about 75%. We believe that the use of machine learning will lead to innovation in the field of tennis modelling.

| Probability | Impact | Risk Score | Target Resolution Date | Status |
|-------------|--------|------------|------------------------|--------|
| ----- | ----- | ----- | ----- | ----- |
| 2 | 2 | 1 | 11-15-12 | Good |

Risk 2 (ID: 2)

Description: Hey everyone! I publish a few blog posts each week on JavaScript/Web Development, and I wanted to share my articles from June. They focus on JavaScript and Node.js, but there is also stuff on Express, React Native, CSS Flexbox, and Pug. I try to make tutorials that are interesting, and that result in you building something cool - so hopefully this is helpful.

| Probability | Impact | Risk Score | Target Resolution Date | Status |
|-------------|--------|------------|------------------------|--------|
| ----- | ----- | ----- | ----- | ----- |
| 2 | 12 | 1 | 11-12-12 | Bad |

Recommendations

Recommendation #: 4 (Date of Recommendation: 05-06-12, Resolved?: No)

Recommendation: Hey everyone! I publish a few blog posts each week on JavaScript/Web Development, and I wanted to share my articles from June. They focus on JavaScript and Node.js, but there is also stuff on Express, React Native, CSS Flexbox, and Pug. I try to make tutorials that are interesting, and that result in you building something cool - so hopefully this is helpful.

Comments: There are no comments right now

Recommendation #: 4 (Date of Recommendation: 10-04-01, Resolved?: Yes)

Recommendation: Extensive research has been conducted into the modelling of professional tennis matches. Most current approaches take advantage of the hierarchical structure of the tennis scoring system to define stochastic models, based on Markov chains. These models use only the probability of each of the players winning a point on their serve to compute their respective probabilities of winning the match. Consequently, a variety of factors that contribute to the outcome of a match are ignored. We propose a supervised machine learning approach that uses historical player performance across a wide variety of statistics to predict match outcomes. We define a novel method of extracting 22 features from raw historical data, including abstract features, such as player fatigue and injury. Using the resulting dataset, we develop and optimise models based on two machine learning algorithms: logistic regression and artificial neural networks. When evaluated on a test set of 6315 ATP matches played in the years 2013-2014, our models outperform Knottenbelt's Common-Opponent model, the current state-of-the-art in stochastic modelling. Our neural network generates a return on investment of 4.35% when in competition with the betting market, an improvement of about 75%. We believe that the use of machine learning will lead to innovation in the field of tennis modelling.

Comments: Comment Comment Commennt