



Building ML Solutions using MLTK

Repeatable ML Workflows

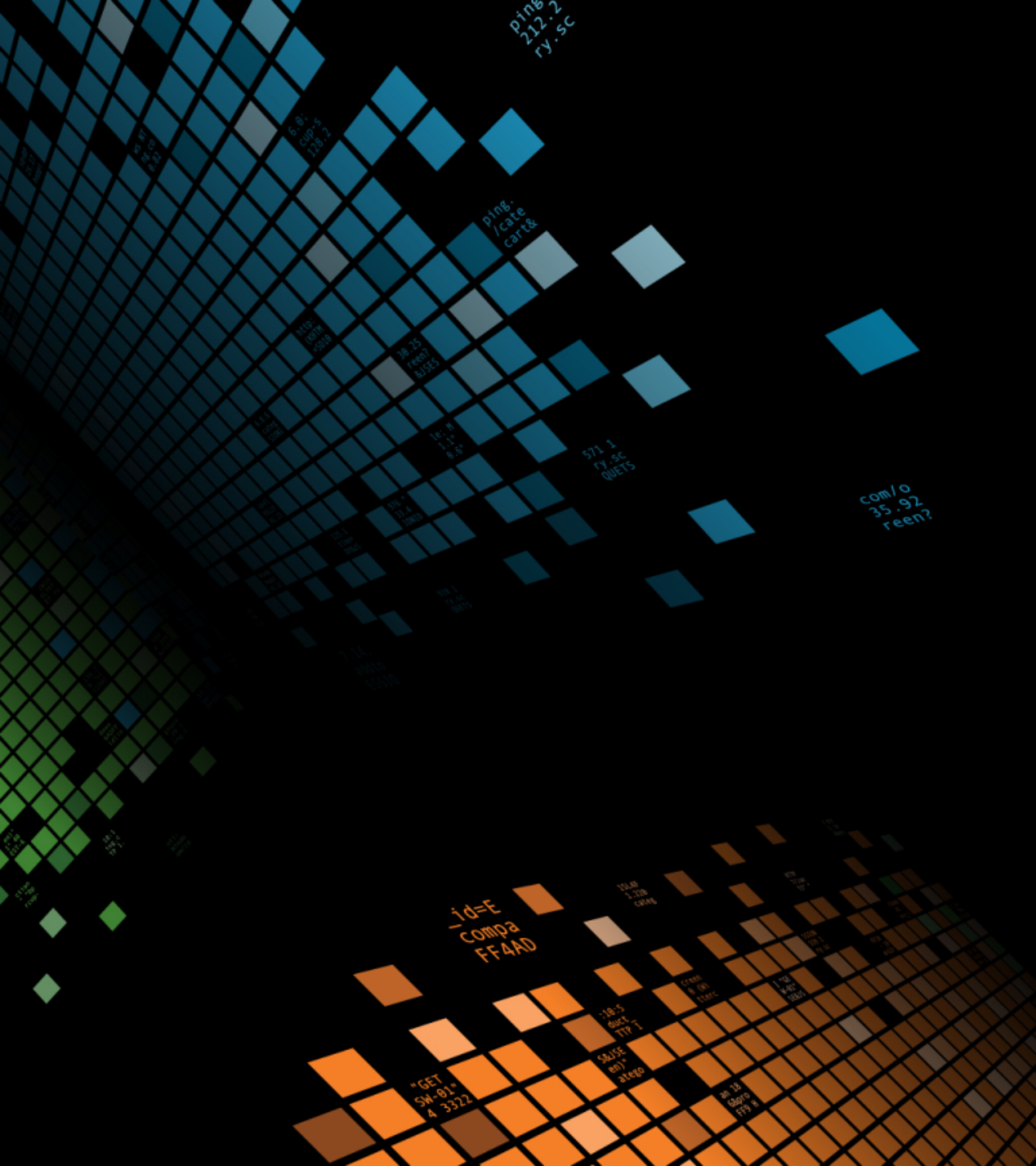
Andrew Stein | Analytical Architect
Iman Makaremi | Senior Data Scientist
September 2017 | Washington, DC

Forward-Looking Statements

During the course of this presentation, we may make forward-looking statements regarding future events or the expected performance of the company. We caution you that such statements reflect our current expectations and estimates based on factors currently known to us and that actual events or results could differ materially. For important factors that may cause actual results to differ from those contained in our forward-looking statements, please review our filings with the SEC.

The forward-looking statements made in this presentation are being made as of the time and date of its live presentation. If reviewed after its live presentation, this presentation may not contain current or accurate information. We do not assume any obligation to update any forward looking statements we may make. In addition, any information about our roadmap outlines our general product direction and is subject to change at any time without notice. It is for informational purposes only and shall not be incorporated into any contract or other commitment. Splunk undertakes no obligation either to develop the features or functionality described or to include any such feature or functionality in a future release.

Splunk, Splunk>, Listen to Your Data, The Engine for Machine Data, Splunk Cloud, Splunk Light and SPL are trademarks and registered trademarks of Splunk Inc. in the United States and other countries. All other brand names, product names, or trademarks belong to their respective owners. © 2017 Splunk Inc. All rights reserved.



What?

MLTK

What?

Splunk has a Machine Learning Toolkit App!

- ▶ What is Splunkbase
- ▶ What is the App
- ▶ Where can I go to learn more

splunkbase™

Splunk Machine Learning Toolkit

Overview

Welcome to the Machine Learning Toolkit and Showcase. Click on the showcases or examples below to explore the kinds of analytics this app enables. Each showcase includes both end-to-end examples with datasets we have provided, as well as the ability to apply the showcases to your own data. You can inspect the showcase panels and other code to see how each one works and then create custom dashboards to suit your needs. Everything you see was implemented on the Splunk platform using public interfaces, so you can bring similar functionality to your own organization's Splunk instance; there's nothing hidden up our sleeves.

Predict Numeric Fields
 Predict the value of a numeric field using a weighted combination of the values of other fields in that event. A common use of these predictions is to identify anomalies: predictions that differ significantly from the actual value may be considered anomalous. IT admins could predict the values of sensors that were malfunctioning; security analysts could predict how much data a user is likely to transfer; and business analysts could predict the likely spending habits of customers.
 Algorithm: Linear Regression
 Examples:
 • Predict Median House Value
 • Predict Baseball Runs
 • Predict App Usage from Other Apps

Predict Categorical Fields
 Predict the value of a categorical field using the values of other fields in that event. A common use of these predictions is to identify anomalies: high-confidence predictions that turn out to be incorrect may be considered anomalous. IT admins could predict the correct values of missing configuration variables; security analysts could predict what actions a user is likely to perform and raise an alert when the user behaves unexpectedly; and business analysts could predict customer churn based on other factors.
 Algorithm: Logistic Regression
 Examples:
 • Predict Telecom Customer Churn
 • Predict Species of Fish from Physical Measurements
 • Predict Incidence of Diabetes from Health Metrics

Detect Numeric Outliers
 Find values that are far from previous values. IT admins could look for machines with unusually high resource utilization; security analysts could look for employees transferring unusually large amounts of data; and business analysts could identify big spenders.
 Algorithm: Distribution statistics
 Examples:
 • Detect Outliers in Server Response Time
 • Detect Outliers in House Value (vs. Predicted Value)
 • Detect Outliers in Crime Rates
 • Detect Outliers in Predicted Run Score

Detect Categorical Outliers
 Find events that contain unusual combinations of values. IT admins could look for unusual machine configurations; security analysts could look for employees performing an atypical combination of activities; and business analysts could identify new purchasing habits.
 Algorithm: Probabilistic measures
 Examples:
 • Detect Outliers in Mortgage Contract Data
 • Detect Outliers in Congressional Voting Records
 • Detect Outliers in Diabetes Patient Records

Forecast Time Series
 Predict likely future values given past values of a metric (numeric time series). IT admins could perform capacity planning by forecasting when a resource will be exhausted; security analysts could identify subtle attack signatures by finding trends; and business analysts could forecast earnings and other business metrics.
 Algorithm: State space Method using Kalman Filter
 Examples:
 • Forecast Gas Milk Production
 • Forecast Chocolate Production
 • Forecast Beer Production

Cluster Events
 Divide events with multiple numeric fields into clusters. Some algorithms allow you to specify the desired number of clusters, while others decide for you. The showcase displays scatterplots of various datasets, with each point colored according to the cluster assigned to it.
 Algorithms: K-means, DBSCAN, Spectral Clustering, BM3C

Splunk Built

The Splunk Machine Learning Toolkit App delivers new SPL commands, custom visualizations, assistants, and examples to explore a variety of ml concepts. Each assistant includes end-to-end examples with datasets, plus the ability to apply the visualizations and SPL commands to your own data. You can inspect

What?

The Machine Learning Toolkit has Assistants!

► What is an Assistant

The screenshot displays the Splunk Machine Learning Toolkit interface. At the top, there is a navigation bar with options: Search, Showcase, Assistants, Scheduled Jobs, Docs, Video Tutorials, and Splunk Machine Learning Toolkit. A dropdown menu is open under 'Assistants', listing: Predict Numeric Fields, Predict Categorical Fields, Detect Numeric Outliers, Detect Categorical Outliers, Forecast Time Series, and Cluster Numeric Events.

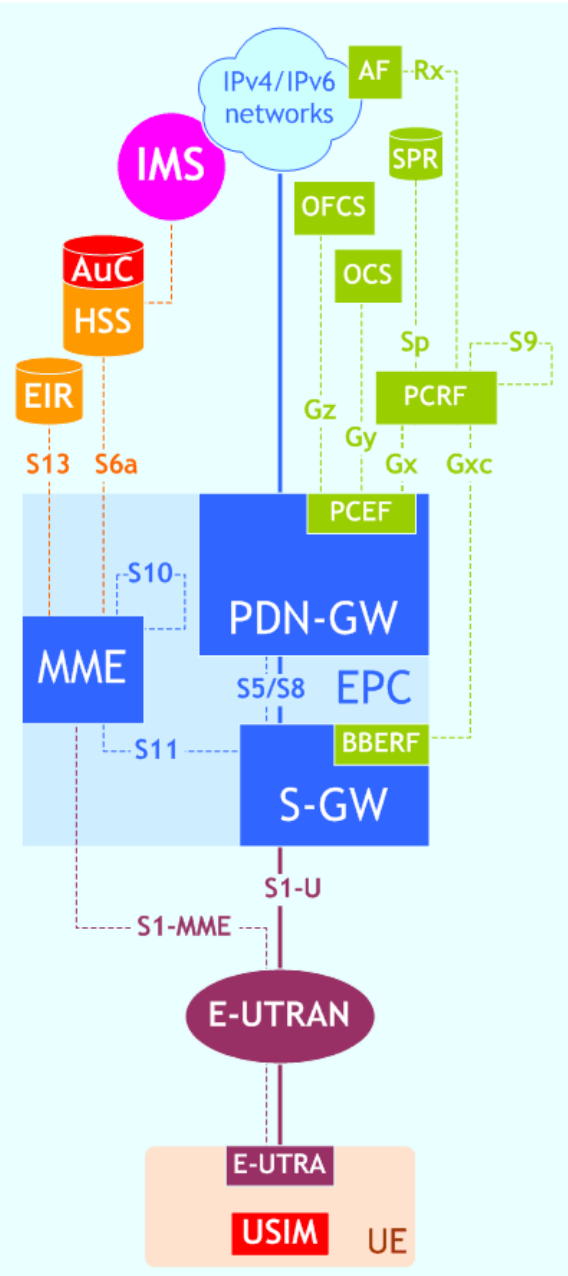
The main content area is divided into six sections, each representing an assistant:

- Predict Numeric Fields:** Predict the value of a numeric field using a weighted combination of the values of other fields in that event. A common use of these predictions is to identify anomalies: predictions that differ significantly from the actual value may be considered anomalous.
 - Predict Server Power Consumption
 - Predict VPN Usage
 - Predict Median House Value
 - Predict Power Plant Energy Output
- Predict Categorical Fields:** Predict the value of a categorical field using the values of other fields in that event. A common use of these predictions is to identify anomalies: predictions that differ significantly from the actual value may be considered anomalous.
 - Predict Hard Drive Failure
 - Predict the Presence of Malware
 - Predict Telecom Customer Churn
 - Predict the Presence of Diabetes
 - Predict Vehicle Make and Model
- Detect Numeric Outliers:** Find values that differ significantly from previous values.
 - Detect Outliers in Server Response Time
 - Detect Outliers in Number of Logins (vs. Predicted Value)
 - Detect Outliers in Supermarket Purchases
 - Detect Outliers in Power Plant Humidity
- Detect Categorical Outliers:** Find events that contain unusual combinations of values.
 - Detect Outliers in Disk Failures
 - Detect Outliers in Bitcoin Transactions
 - Detect Outliers in Supermarket Purchases
 - Detect Outliers in Mortgage Contracts
 - Detect Outliers in Diabetes Patient Records
 - Detect Outliers in Mobile Phone Activity
- Forecast Time Series:** Forecast future values given past values of a metric (numeric time series).
 - Forecast Internet Traffic
 - Forecast the Number of Employee Logins
 - Forecast Monthly Sales
 - Forecast the Number of Bluetooth Devices
 - Forecast Exchange Rate TWI using ARIMA
- Cluster Numeric Events:** Partition events with multiple numeric fields into clusters.
 - Cluster Hard Drives by SMART Metrics
 - Cluster Behavior by App Usage
 - Cluster Neighborhoods by Properties
 - Cluster Vehicles by Onboard Metrics
 - Cluster Power Plant Operating Regimes



Assistant: Numeric Outlier Detection

Mobility 3GPP Core KPI



Data

- The 3GPP Core receives transactions from each subscriber **to maintain connection.**
- The KPI captures the **behavior of TELUS's network.**

Goal

- Monitor this **dynamic KPI** and alert on **performance degradation.**

Action Taken

- Radio engineers informed about problems as soon as something occurred.



Assistant : Detect Numeric Outliers

Step 2 : Acquire Data


Industrial Assets

Industrial Data
SCADA, AMI, Meter Reads


Consumer and Mobile Devices

Native Inputs
TCP, UDP, Logs, Scripts, Wire, Mobile


Modular Inputs
MQTT, AMQP, COAP, REST, JMS


OT

HTTP Event Collector
Token Authenticated Events


IT

Technology Partnerships
Kepware, AWS IoT, Cisco, Palo Alto

Engineers


Data Analysts


Security Analysts


Business Users



Search


Alert


Visualize


Predict



Develop


Real Time


splunk>enterprise


splunk>cloud


External Lookups/Enrichment





Asset Info 

Maintenance Info 

Data Stores 

Assistant : Detect Numeric Outliers

Step 3 : Generate Insights

- ▶ Place search in Detect Numeric Outliers Assistant
- ▶ Validate results using the visualizations
- ▶ Create alerts
- ▶ One unified workflow.
- ▶ Go customize to your hearts content



```

130.60.4 - - [07/Jan 18:10:57:153] "GET /category.screen?category_id=GIFTS&JSESSIONID=5D15L9FF1ADFF3 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product_id=FI-5W-03"
128.241.220.82 - - [07/Jan 18:10:57:123] "GET /product.screen?product_id=FL-DSH-01&JSESSIONID=5D35L7FF6ADFF9 HTTP 1.1" 404 3322 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-26&product_id=KQ-CW-01"
ows NT 5.1; SV1: .NET CLR 1.1.4322" 468 125.17 14 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-16&product_id=RP-LI-02"
: //buttercup-shopping.com/cart.do?action=purchase&itemId=EST-16&product_id=RP-LI-02" 468 125.17 14 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-16&product_id=RP-LI-02"
to?action=purchase&itemId=EST-16&product_id=RP-LI-02" 468 125.17 14 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-16&product_id=RP-LI-02"
opping.com/cart.do?action=purchase&itemId=EST-16&product_id=RP-LI-02" 468 125.17 14 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-16&product_id=RP-LI-02"
/buttercup-shopping.com/cart.do?action=purchase&itemId=EST-16&product_id=RP-LI-02" 468 125.17 14 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-16&product_id=RP-LI-02"

```


To the Toolkit Example!

Assistant: Predict Numeric Field

Assistant: Predict Numeric Field

One workflow, multiple use cases



- Site Reliability Engineer

- Senior Design Specialist

Reduce Sales Loss

Improved Cell Tower Performance

Reduced Troubleshooting Time

```

130.60.4 - - [07/Jan 18:10:57:153] "GET /category.screen?category_id=GIFTS&JSESSIONID=5D15L9FF1ADFF3 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product_id=FI-5W-03"
128.241.220.82 - - [07/Jan 18:10:57:123] "GET /product.screen?product_id=FL-DSH-01&JSESSIONID=5D35L7FF6ADFF9 HTTP 1.1" 404 3322 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-26&product_id=KQ-CU-01"
317.27.160.0 - - [07/Jan 18:10:56:156] "GET /oldlink?item_id=EST-26&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 1318 "http://buttercup-shopping.com/cart.do?action=changequantity&itemId=EST-18&product_id=AV-CB-01&JSESSIONID=5D55L9FF1ADFF3"
10.0.0.0 - - [07/Jan 18:10:55:187] "GET /category.screen?category_id=FLOWERS&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 3865 "http://buttercup-shopping.com/cart.do?action=remove&itemId=EST-14&product_id=KQ-CU-01"
10.0.0.0 - - [07/Jan 18:10:55:189] "GET /category.screen?category_id=FLOWERS&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 3865 "http://buttercup-shopping.com/cart.do?action=remove&itemId=EST-14&product_id=KQ-CU-01"

```



Aggregated Order Behavior

Shop DEALS by Category



Computers & Accessories



Major Appliances



Cameras & Camcorders



Headphones & Speakers



Toys & Drones

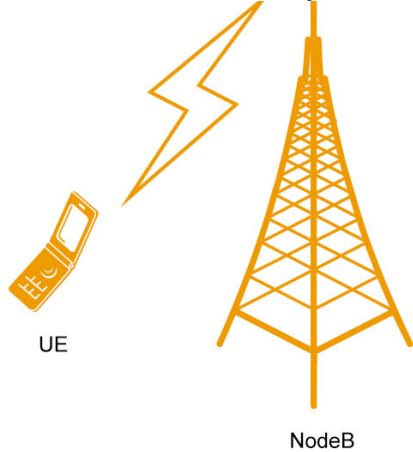


Watches & Jewelry

- Failed orders result in
 - Unhappy Customer
 - Loss of Revenue
- Data
 - Order Counts by HTTP Response Codes
- Goal
 - Detecting deviation in relationship with the response codes
- Action Taken
 - Inform the release team about the problems



the future is friendly®



Radio Access Network Interference

► Interference

- The level of noise within the frequency band in cell towers

► Uplink Interference Impacting Factors

- Number of Subscribers
- Connection Types
- Radio Conditions

► Data

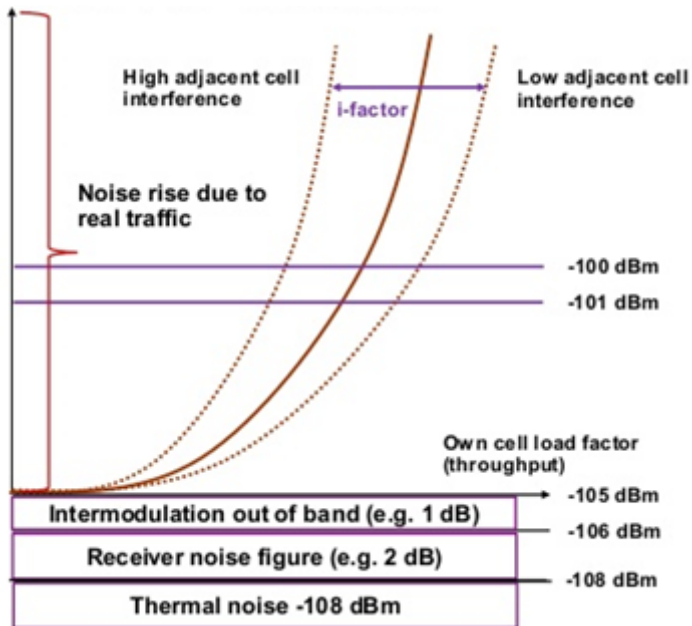
- Uplink Rate/min for Each Cell Tower
- Number of Subscribers

► Goal

- Find underperforming cells and the characteristics of their problem.

► Action Taken

- Reconfigure Underperforming Cells
- Identify non-standard devices on the Network



Assistant : Predict Numeric Field

Step 1 : Data Driven Decisions

► Define your Problem!

- I want to **predict a numeric field** given **multiple other fields**.
- I want to **predict the future**.



Assistant : Predict Numeric Field

Step 2 : Acquire Data


Industrial Assets

Industrial Data
SCADA, AMI, Meter Reads



Consumer and Mobile Devices

Native Inputs
TCP, UDP, Logs, Scripts, Wire, Mobile


Modular Inputs
MQTT, AMQP, COAP, REST, JMS


OT

HTTP Event Collector
Token Authenticated Events


IT

Technology Partnerships
Kepware, AWS IoT, Cisco, Palo Alto

Engineers


Data Analysts


Security Analysts


Business Users



Search


Alert


Visualize


Predict


Develop




Real Time

splunk > enterprise

splunk > cloud

External Lookups/Enrichment

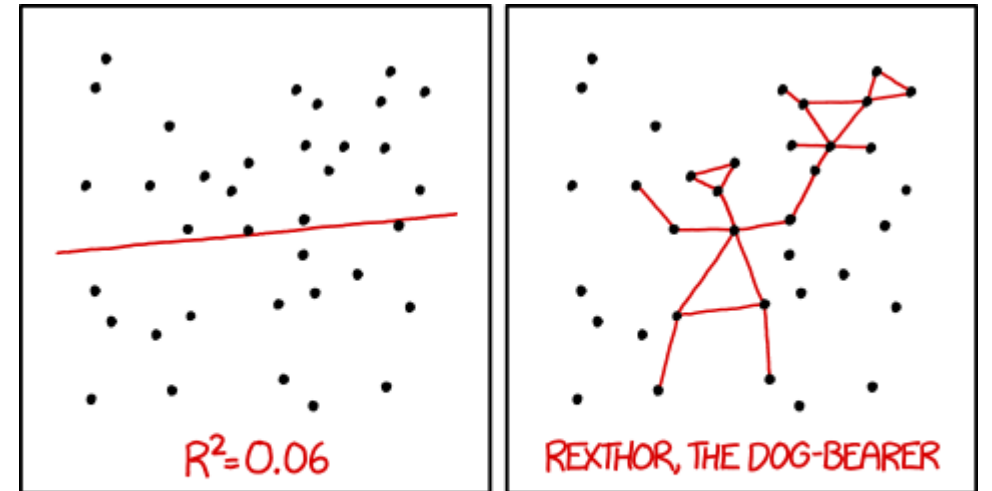
 

Asset Info 	Maintenance Info 	Data Stores 
--	--	---

Assistant : Predict Numeric Field

Step 3 : Generate Insights

- ▶ Preprocessing Step
- ▶ 7 Algorithms
- ▶ Model Analysis
- ▶ Customized Visualizations
- ▶ Create Alerts

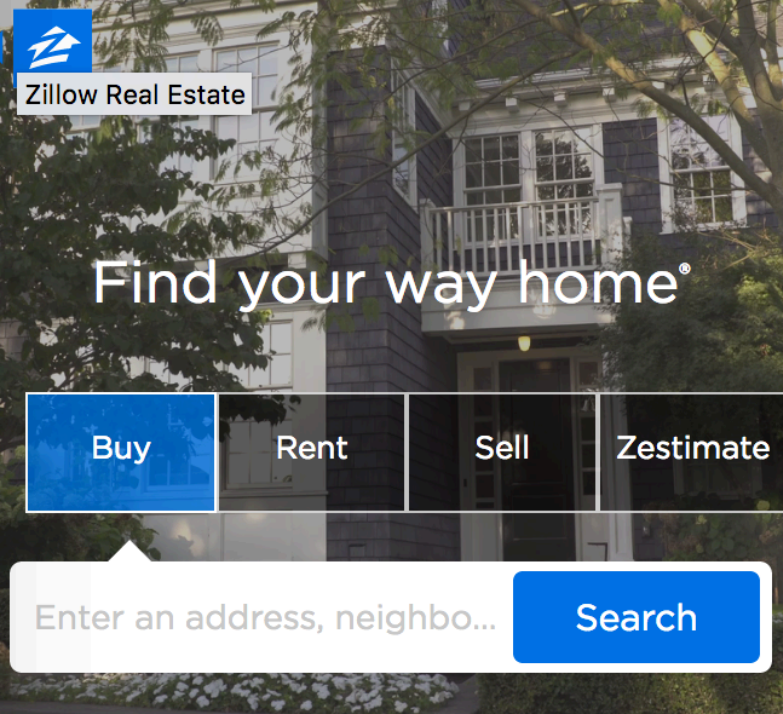


I DON'T TRUST LINEAR REGRESSIONS WHEN IT'S HARDER TO GUESS THE DIRECTION OF THE CORRELATION FROM THE SCATTER PLOT THAN TO FIND NEW CONSTELLATIONS ON IT.

<https://xkcd.com/1725/>

To the Toolkit Example!

Assistant: Predict Categorical Field



Bot Detection

- ▶ Good and bad bots scrapping
- ▶ Bad bots go unnoticed
- ▶ A Liability Issue
- ▶ Data
 - Browsing Log
- ▶ Goal
 - Detect Bad Bots
- ▶ Action Taken
 - Ban or reduce access for malicious scrapping

REAL ESTATE

Browse all homes

Albuquerque real estate

Atlanta real estate

Austin real estate

Baltimore real estate

[More](#)

RENTALS

Rental Buildings

Atlanta apartments for rent

Austin apartments for rent

Baltimore apartments for rent

```

130.60.4 - - [07/Jan 18:10:57:123] "GET /category.screen?category_id=GIFTS&JSESSIONID=5D55L9FFIADFF3 HTTP 1.1" 200 1318 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product_id=FI-SW-03"
128.241.220.82 - - [07/Jan 18:10:57:123] "GET /product.screen?product_id=FL-DSH-01&JSESSIONID=5D55L9FFIADFF3 HTTP 1.1" 200 1318 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-26&JSESSIONID=5D55L9FFIADFF3 HTTP 1.1" 200 385 "http://buttercup-shopping.com/cart.do?action=remove&itemId=EST-1"
317.27.160.0 - - [07/Jan 18:10:57:153] "GET /category.screen?category_id=FL-DSH-01&JSESSIONID=5D55L9FFIADFF3 HTTP 1.1" 200 1318 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-26&JSESSIONID=5D55L9FFIADFF3 HTTP 1.1" 200 385 "http://buttercup-shopping.com/cart.do?action=remove&itemId=EST-1"
ows NT 5.1; SV: .NET CLR 1.1.4322" 468 125.17 14 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-26&JSESSIONID=5D55L9FFIADFF3 HTTP 1.1" 200 385 "http://buttercup-shopping.com/cart.do?action=remove&itemId=EST-1"
kitemid=EST-16&product_id=RP-LI-02" 468 125.17 14 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-26&JSESSIONID=5D55L9FFIADFF3 HTTP 1.1" 200 385 "http://buttercup-shopping.com/cart.do?action=remove&itemId=EST-1"
ofaction=purchase&itemId=EST-26&JSESSIONID=5D55L9FFIADFF3 HTTP 1.1" 200 385 "http://buttercup-shopping.com/cart.do?action=remove&itemId=EST-1"
opping.com/purchase&itemId=EST-26&JSESSIONID=5D55L9FFIADFF3 HTTP 1.1" 200 385 "http://buttercup-shopping.com/cart.do?action=remove&itemId=EST-1"

```


Assistant: Predict Categorical Field

Step 2 : Acquire Data



Industrial Assets

Industrial Data
SCADA, AMI, Meter Reads



Consumer and Mobile Devices


Native Inputs
TCP, UDP, Logs, Scripts, Wire, Mobile

Modular Inputs
MQTT, AMQP, COAP, REST, JMS



OT


HTTP Event Collector
Token Authenticated Events



IT

Technology Partnerships
Kepware, AWS IoT, Cisco, Palo Alto

Engineers



Data Analysts



Security Analysts



Business Users




Search



Alert



Visualize



Predict



Develop




Real Time

splunk > enterprise

splunk > cloud

External Lookups/Enrichment



Asset Info 	Maintenance Info 	Data Stores 
--	--	---

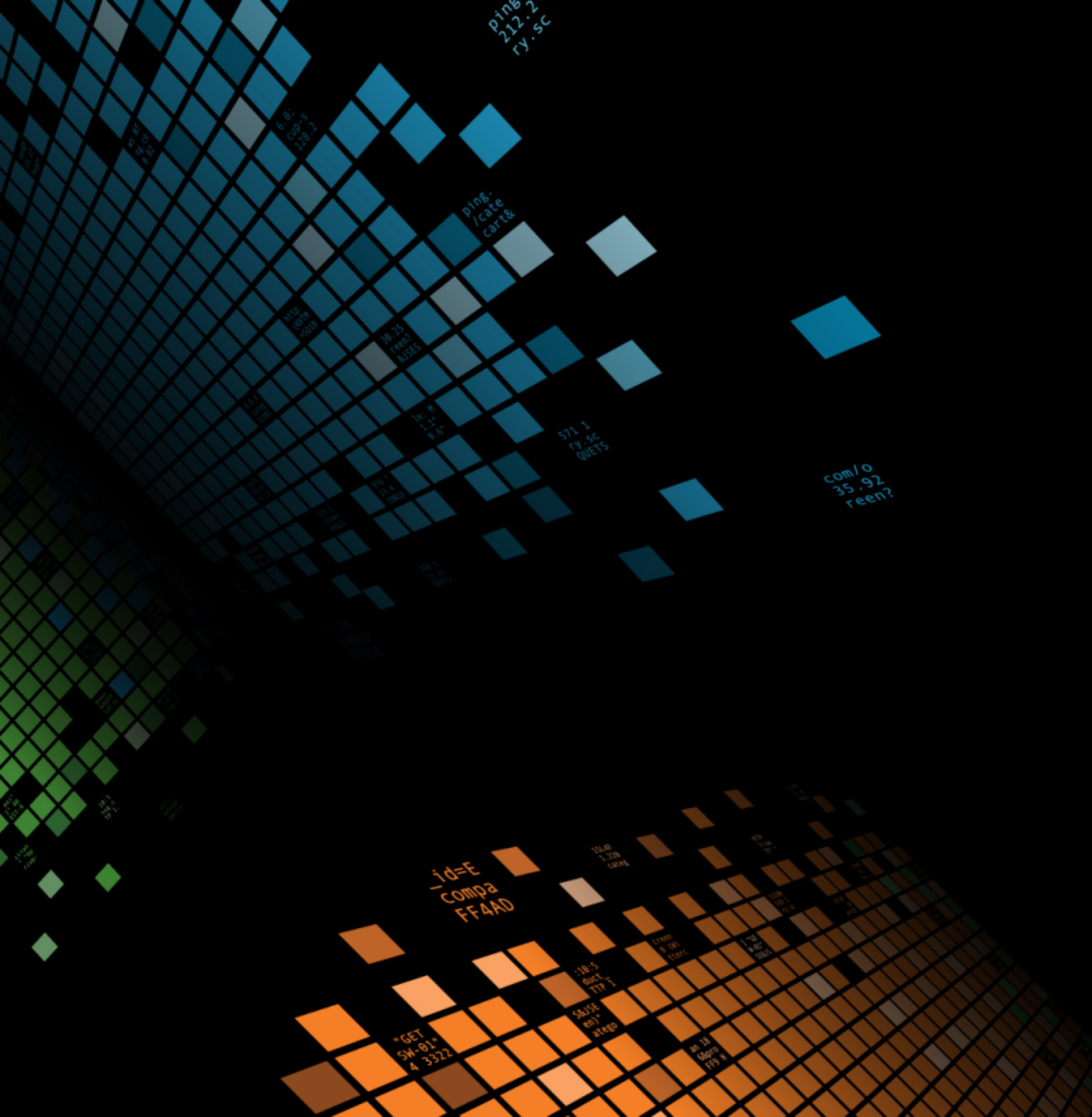
Assistant : Predict Categorical Field

Step 3 : Generate Insights

- ▶ Preprocessing Step
- ▶ 6 Algorithms
- ▶ Model Analysis
- ▶ Custom Visualizations
- ▶ Create Alerts

```
130.60.4 - - [07/Jan 18:10:57:153] "GET /category.screen?category_id=GIFTS&JSESSIONID=5D15L9FF10ADFF10 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product_id=FI-5W-03" "Mozilla/5.0 (Macintosh; Intel Mac OS X 10_11_6) AppleWebKit/537.36 (KHTML, like Gecko) Chrome/44.0.2403.157 Safari/537.36"
128.241.220.82 - - [07/Jan 18:10:57:123] "GET /product.screen?product_id=FL-DSH-01&JSESSIONID=5D35L7FF6ADFF0 HTTP 1.1" 404 3322 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-26&product_id=KQ-CW-01" "Mozilla/5.0 (Macintosh; Intel Mac OS X 10_11_6) AppleWebKit/537.36 (KHTML, like Gecko) Chrome/44.0.2403.157 Safari/537.36"
317.27.160.0.0 - - [07/Jan 18:10:56:156] "GET /oldlink?item_id=EST-26&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 1318 "http://buttercup-shopping.com/cart.do?action=changequantity&itemId=EST-18&product_id=AV-CB-01&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 3865 "http://buttercup-shopping.com/cart.do?action=purchase&itemId=EST-16&product_id=RP-LI-02" "0"
125.17.14 - - [07/Jan 18:10:55:187] "GET /category.screen?category_id=FLOWERS&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 3865 "http://buttercup-shopping.com/cart.do?action=remove&itemId=EST-14" "Mozilla/5.0 (Macintosh; Intel Mac OS X 10_11_6) AppleWebKit/537.36 (KHTML, like Gecko) Chrome/44.0.2403.157 Safari/537.36"
128.241.220.82 - - [07/Jan 18:10:55:189] "GET /category.screen?category_id=SURPRISE&JSESSIONID=5D55L9FF1ADFF3 HTTP 1.1" 200 3865 "http://buttercup-shopping.com/cart.do?action=remove&itemId=EST-14" "Mozilla/5.0 (Macintosh; Intel Mac OS X 10_11_6) AppleWebKit/537.36 (KHTML, like Gecko) Chrome/44.0.2403.157 Safari/537.36"
```


To the Toolkit Example!



Q&A

Go See These Talks

- ▶ Advanced Machine Learning Using the Extensible ML API
 - *Alexander Johnson & Zidong Yang*
- ▶ Automation of Event Correlation and Clustering With Built-In Machine Learning Algorithms in Splunk IT Service Intelligence (ITSI)
 - *Vineetha Bettaiah & Ross Lazerowitz*
- ▶ Prioritizing Anomalies Using the Machine Learning Toolkit
 - *Harsh Keswani*
- ▶ Splunk Machine Learning Capabilities and Condition-Based Maintenance: Train Doors on the German Public Rail Transport System
 - *Henning Brandt & Daniel Pal*