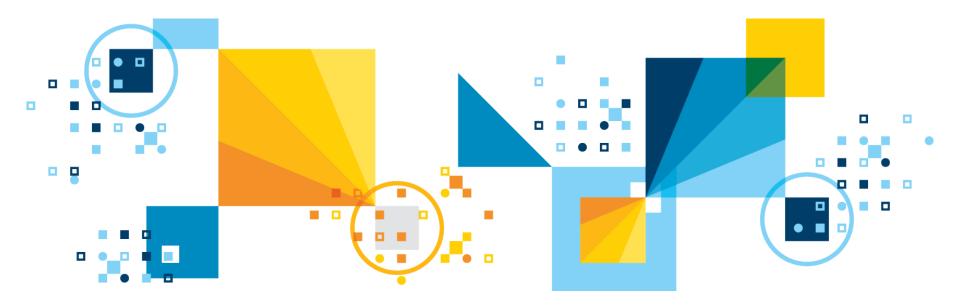
IBM IoT Analytics in the Cloud

Steve Geringer, Data Science Solutions Architect

Steve.Geringer@IBM.com









Background

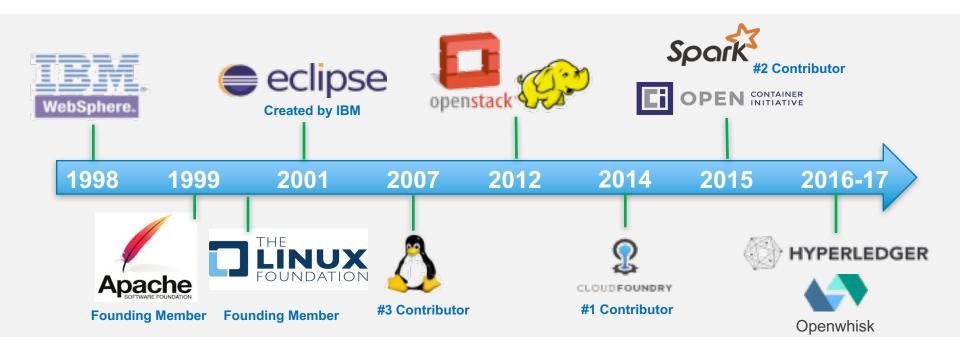
About Me:

- Data Science Solutions Architect
- IBM Analytics team covering
 - Healthcare, Life Sciences and State/Local Government.
- Achieved the "Kaggle Competitions Expert" Designation
 - Earned two Silver Medals in Kaggle Machine Learning Competitions.

- Steve.Geringer@ibm.com



IBM Has a Rich History with Open Source



IBM and Open Source: *Today companies have lots of options*

Open Source Only



Significant Assembly Enterprise Ready Innovation

Open Plus

Vendor Lock-in

Proprietary

BlueMix is a Platform as a Service (PaaS)

Traditional IT	laaS	PaaS	SaaS
Applications	Applications	Applications	Applications
Data	Data	Data	Data
Runtime	Runtime	Runtime	Runtime
Middleware	Middleware	Middleware	Middleware
O/S management	O/S management	O/S management	O/S management
O/S installation	O/S installation	O/S installation	O/S installation
Virtualization	Virtualization	Virtualization	Virtualization
Servers	Servers	Servers	Servers
Storage	Storage	Storage	Storage
Networking	Networking	Networking	Networking
Datatacenter	Datatacenter	Datatacenter	Datatacenter
Nanaged by you Nanaged by IBM	IBM Softlayer Amazon EC2 Azure Infrastructure	IBM BlueMix Google App Engine Amazon Elastic Beanstalk	



IBM Cloud . Guiding Principles

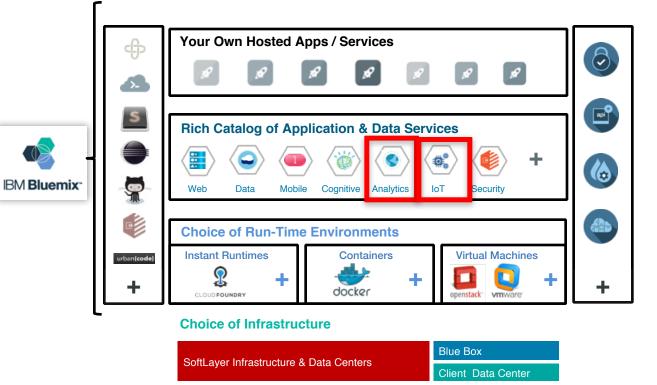
DevOps Productivity

Hybrid Integration

Powerful, Accessible Data and Analytics

Cognitive Solutions

Choice with Consistency



Comprehensive

Broadest selection of data and analytics services

- Seamless integrations
- Open-source leadership

Trusted

- Fully managed environment 24 x 7
- Secure infrastructure
- No installation, configuration, maintenance required

Flexible

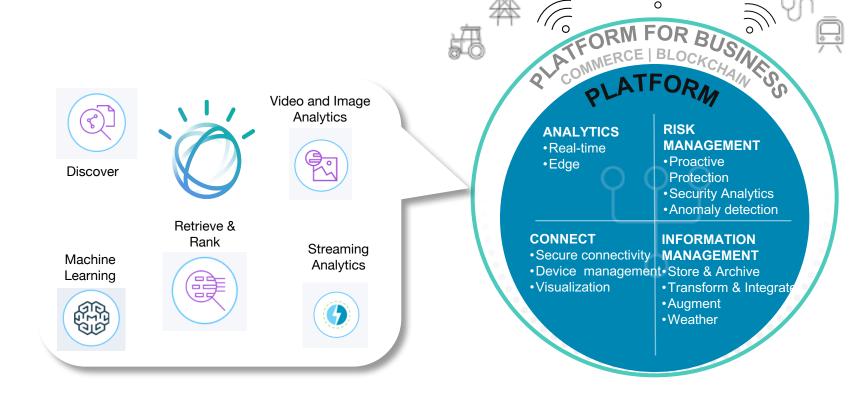
- Cloud, on-premises & hybrid support
- No vendor lock-in
- Subscription pricing



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IBM Watson IoT Platform

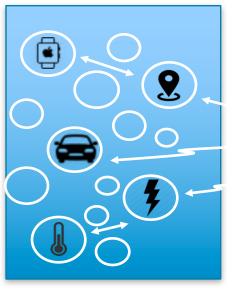
Make sense of data to optimize operations, manage assets, rethink products and services, and transform customer experience.

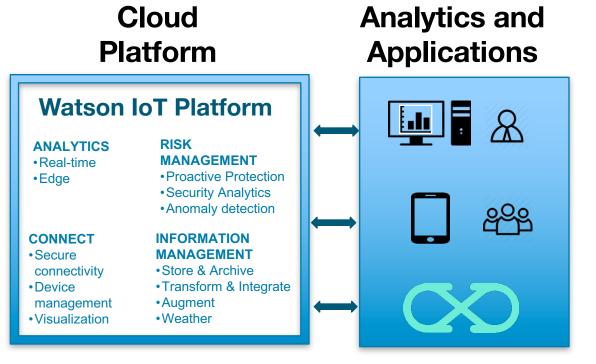




IBM Watson IoT Platform

Devices and Sensors





Other Data Sources



Weather



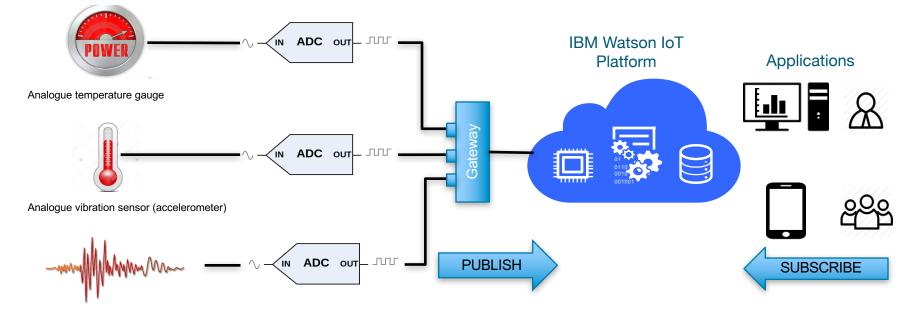
Map



MQTT – The Protocol for IoT Messaging OASIS [3]

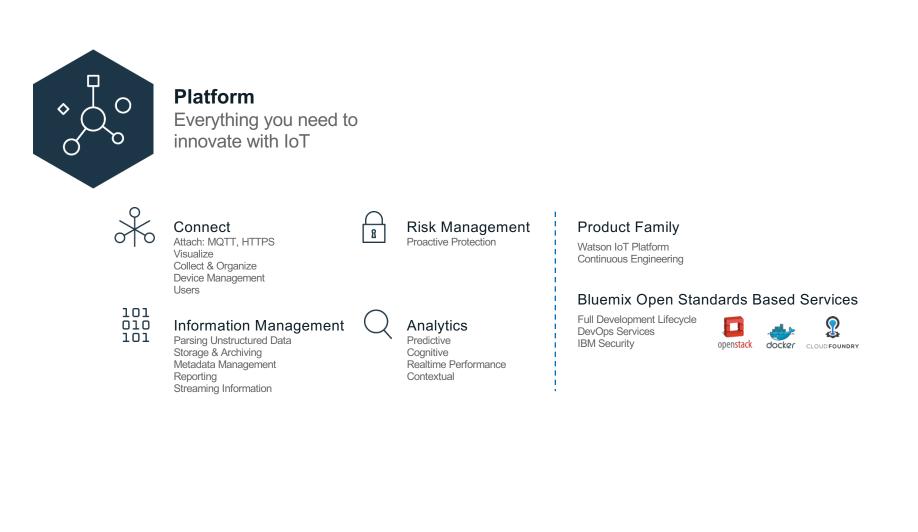


Analogue electrical power meter



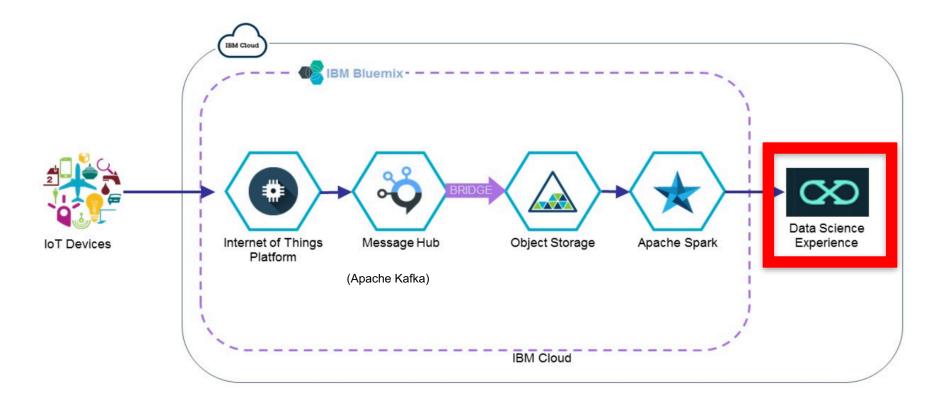
MQTT is a publish and subscribe, extremely simple and lightweight messaging protocol, designed for low-bandwidth, high-latency or unreliable networks.





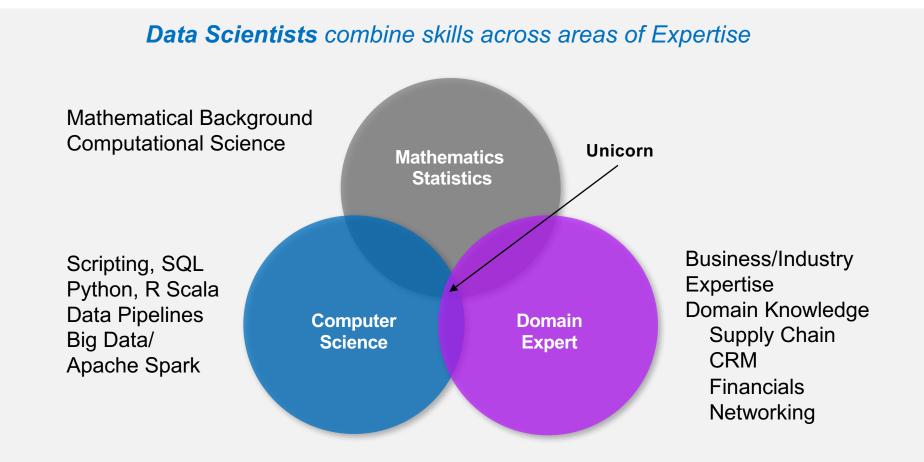


End-to-End IoT Data Pipeline



IBM. Ö

Data Science Professional





Data Science Is a Team Sport





Introducing IBM Watson Data Platform

An Integrated Data Science Environment in the Cloud



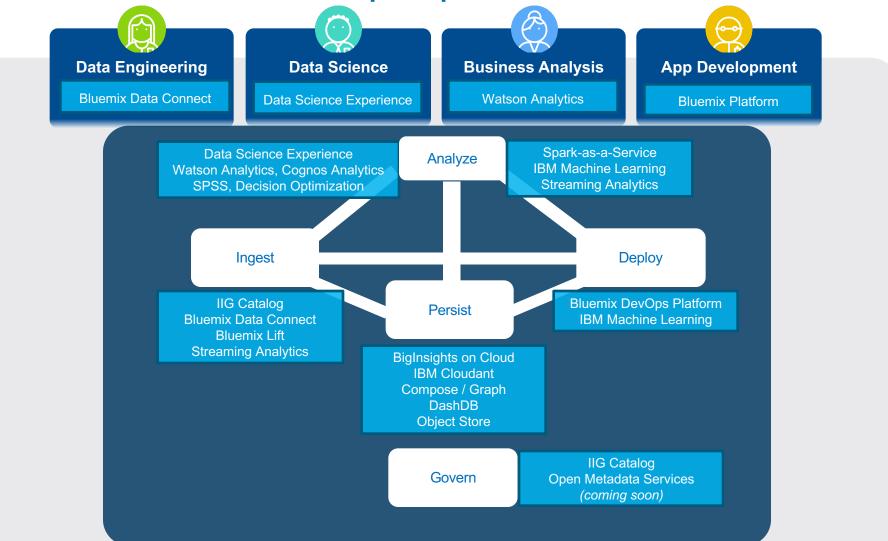


http://ibm.co/makedatasimple



IBM Watson Data Platform

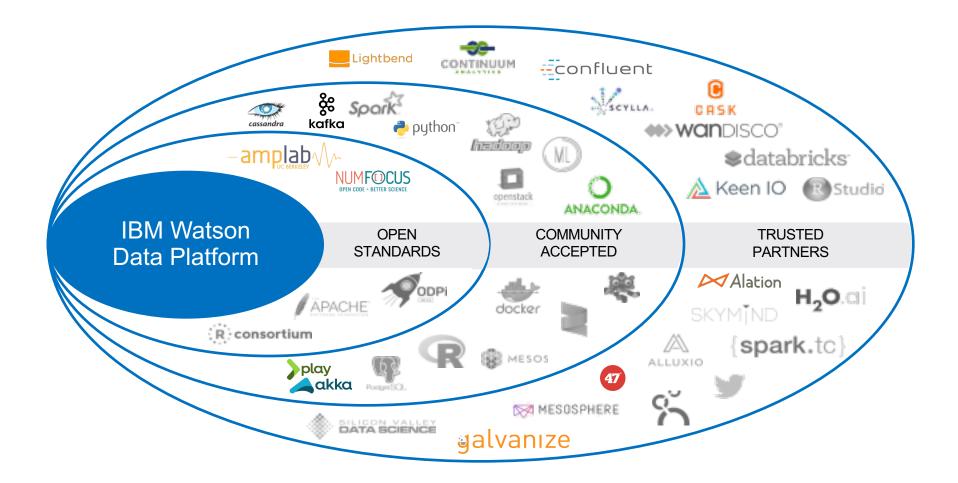
A closer look at what makes up the platform





IBM Watson Data Platform Partner Ecosystem

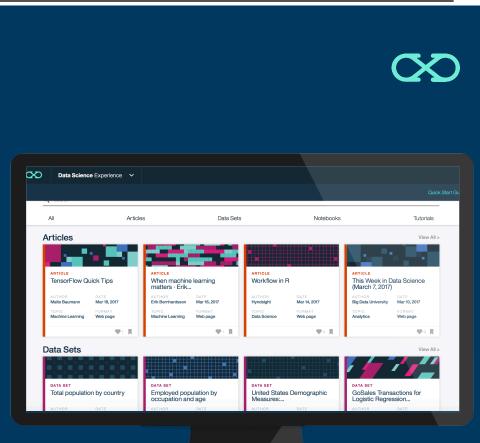
The Open Community To Innovate Faster With Data



IBM. Ö

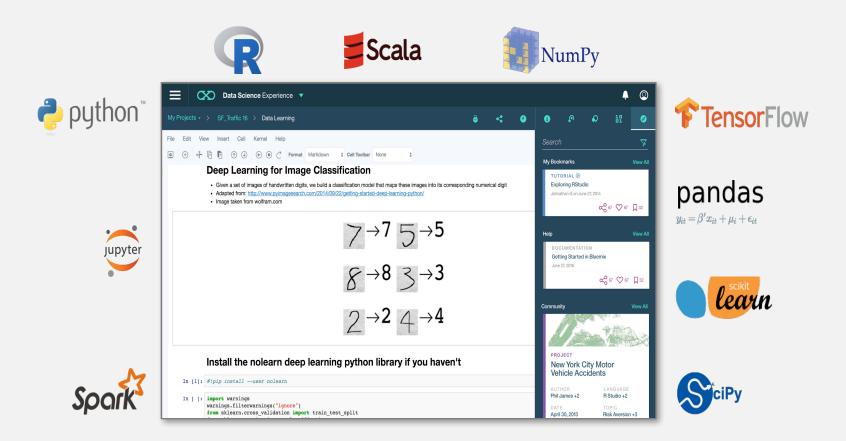
Data Science Experience

IBM Data Science Experience is an environment that brings together everything that a Data Scientist needs. It includes the most popular **Open Source tools** such as Code in Scala/Python/R/SQL, Jupyter Notebooks, RStudio IDE and Shiny apps, Apache Spark and IBM unique value-add functionalities with community and social features, integrated as a first class citizen to make Data Scientists more successful.



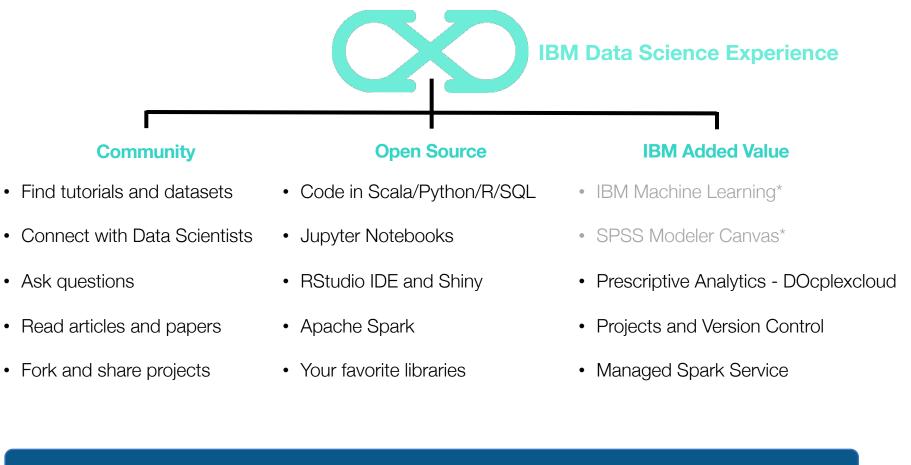


Data Science Experience: Centralizes Open Source





Core Attributes of the Data Science Experience



Powered by IBM Watson Data Platform

* Closed beta

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IBM Data Science Experience Brings Together Visual and Programmatic Worlds

Collaborate Using Projects

Notebooks view all (2)			
NAME	SHARED	STATUS	LANGUA
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Machine Learning using R	<		R 3.3.0
Data Assets www.stl (20) NME		TYPE	
Great Outdoors Orders for BBBT Ritka		Catalog File	
Great Cutdoors Orders for BBBT Ritika		Catalog File	
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Sales Data (dashDB)		Connection	
Bookmarks word (2)			

Model Deployment (batch, streaming and real-time)

Data Science Expe	rience 🔻					٠	
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Code Algorithms in Python, R and Scala: Automatic Model Visualization

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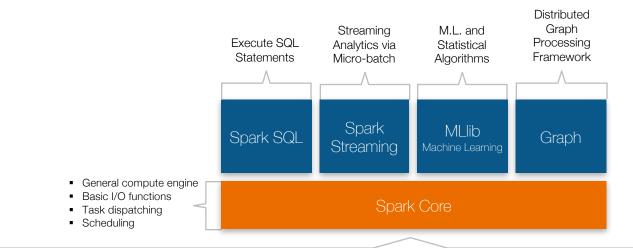
IBM. 🕅

Integrated Jupyter Notebooks for interactive and collaborative development - seamless execution on Spark

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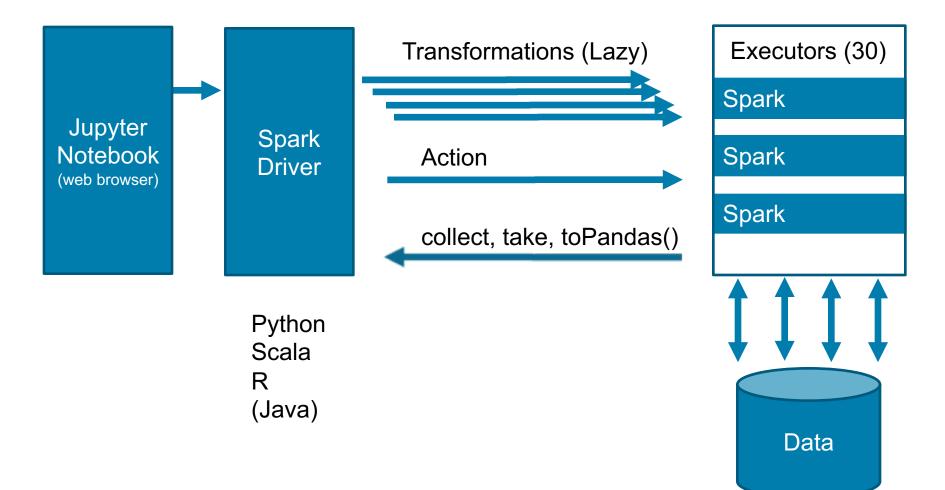
IBM's Managed Apache Spark Service in DSX



	Data Sources												
IBM Cloud	Public Cloud	Cloud Apps	On-Premises										
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DSX - Spark Architecture





Collaborate Using Projects

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	Sale	es Data (dashDB)		Connection	

Bookmarks view all (3)

 ARTICLE
 NOTEBOOK
 TUTORIAL

 From Machine Learning to Learning M...
 Use deep learning for image classifica...
 Analyze open data sets using pandas...

 Nov 10, 2016
 Oct 4, 2016
 Oct 19, 2016

GitHub Integration

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Settings page.



Community Cards provide in-context learning for users

ARTICLE : How can data scientists collaborate to build	ARTICLE : What is machine learning?	NOTEBOOK Insights from Twitter data about car makers
SOURCE	SOURCE	SOURCE
IBM	IBM	IBM
DATE	DATE	DATE
Jun 24, 2016	Jun 24, 2016	Jun 22, 2016
NOTEBOOK Insights from New York car accident reports	Country Surface Area (sq. km)	NOTEBOOK Improved Flight delay prediction
SOURCE	SOURCE	SOURCE
IBM	IBM	IBM
DATE	DATE	DATE
Jun 16, 2016	Jun 16, 2016	Jun 06, 2016
NOTEBOOK Load data from different sources	NOTEBOOK Learn basics about notebooks and Apache Spark	NOTEBOOK Analyze precipitation data
SOURCE	SOURCE	SOURCE
IBM	IBM	IBM
DATE	DATE	DATE
Jun 02, 2016	Jun 02, 2016	Jun 02, 2016



Supported Data Sources for DSX via onpremises and cloud Connections



Cloud Sources	On-Premises Sources	Cloud Targets	On-Premises Targets
Amazon Redshift	Apache Hive	Amazon S3	IBM DB2® LUW
Amazon S3	Cloudera Impala	Bluemix Object Storage	IBM Pure Data for Analytics®
Apache Hive	IBM DB2® LUW	IBM Cloudant™	Teradata
Bluemix Object Storage	IBM Informix®	IBM dashDB	
IBM BigInsights™ on Cloud	IBM Pure Data for Analytics®	IBM BigInsights™ on Cloud	
IBM Cloudant™	Microsoft SQL Server	IBM DB2® on Cloud	
IBM dashDB	MySQL Enterprise Edition	IBM SQL Database	
IBM DB2® on Cloud	Oracle	IBM Watson™ Analytics	
IBM SQL Database	Pivotal Greenplum	PostgreSQL on Compose	
Microsoft Azure	PostgreSQL	SoftLayer Object Storage	
PostgreSQL on Compose	Sybase		
Salesforce	Sybase IQ		
SoftLayer Object Storage	Teradata		

IBM Analytics

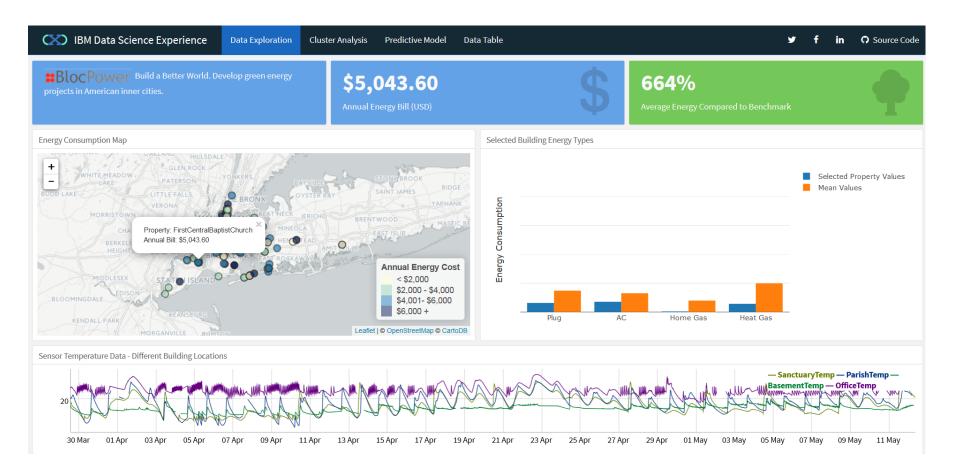


DSX has RStudio built into the experience thanks to our strategic partnership

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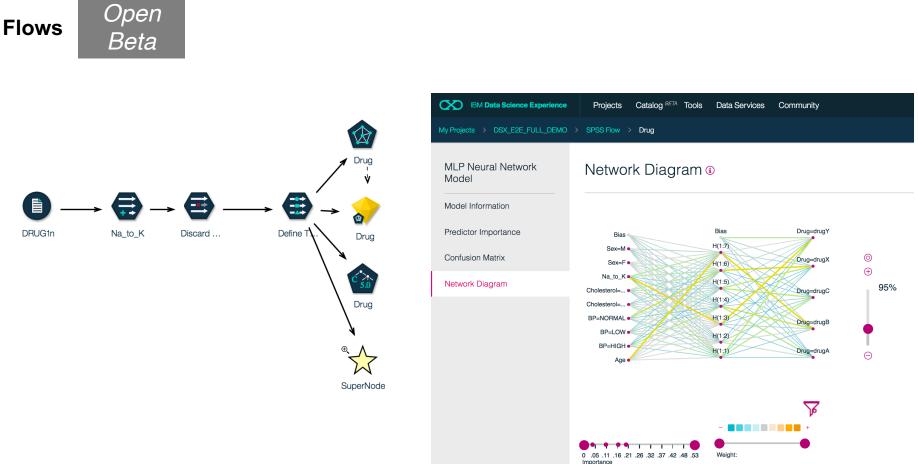


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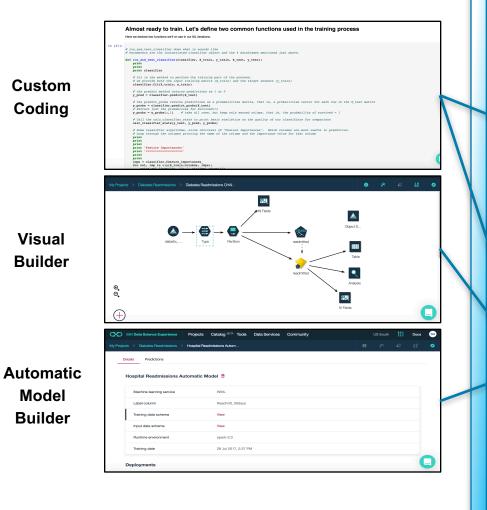
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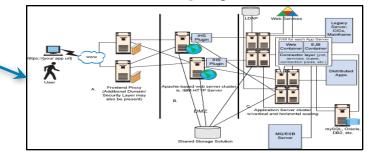
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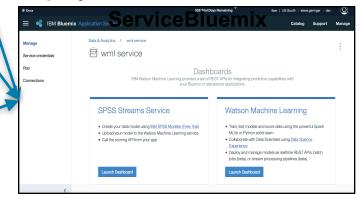


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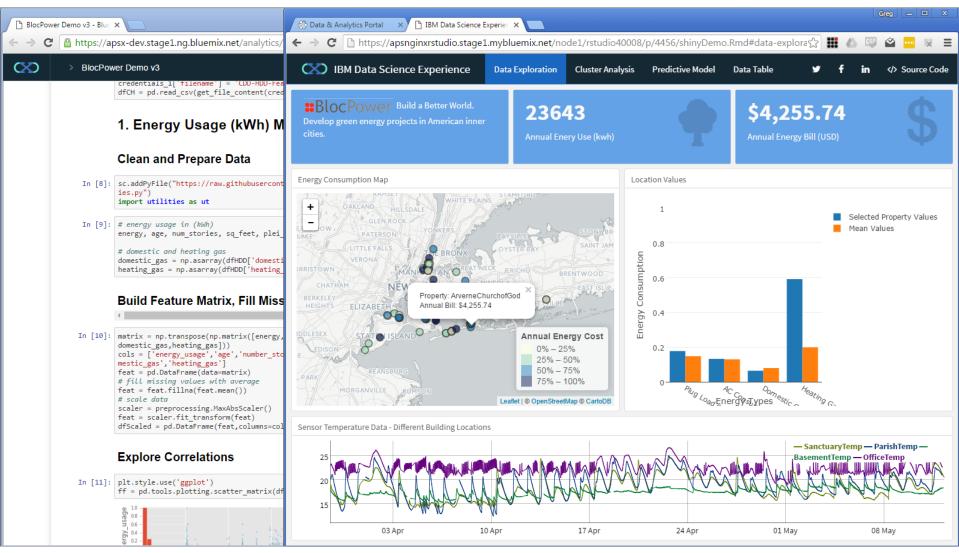
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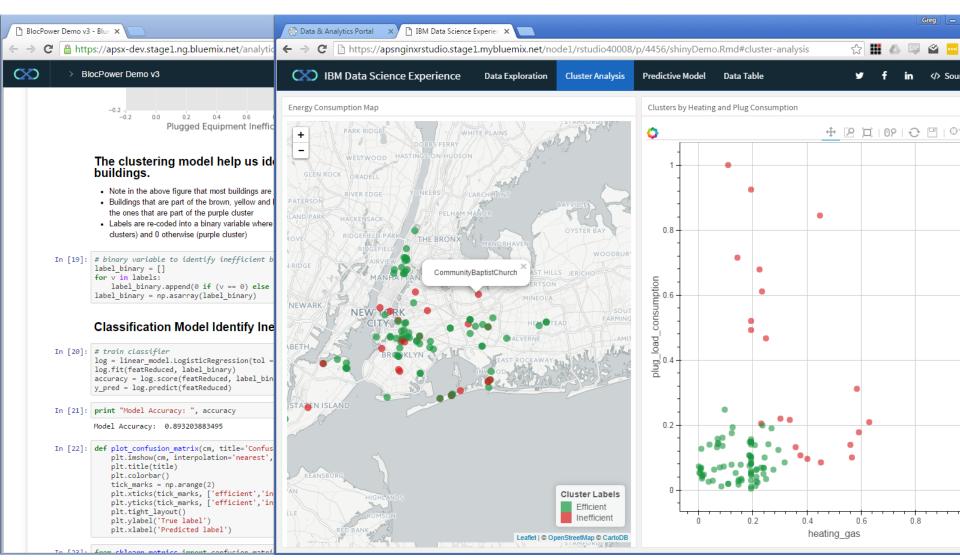
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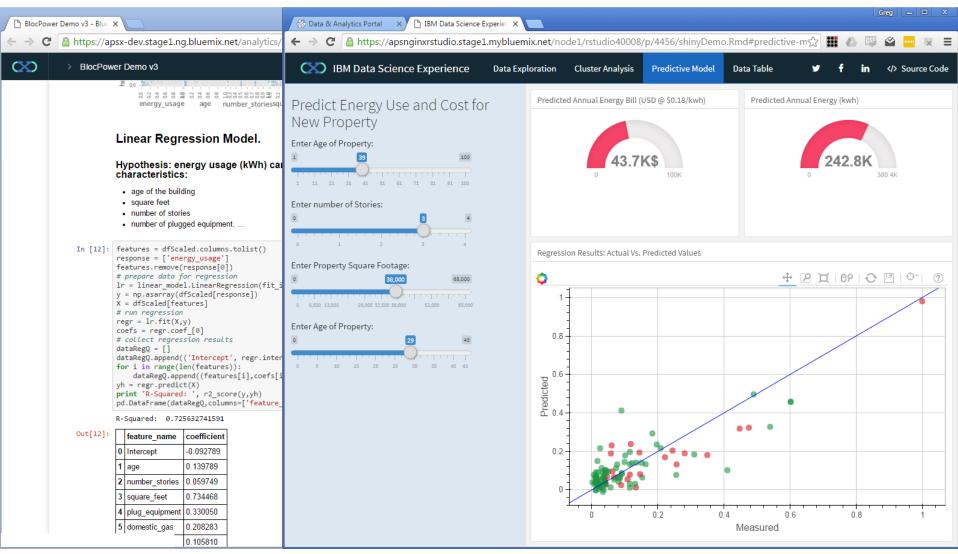
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