## Chapter 1: Understanding Spark





Structured Streaming


## Tungsten Phase 2 speedups of 5-20x

## History of Spark APIs



Distribute collection of JVM objects

Functional Operators (map, filter, etc.)
\&databricks


Distribute collection of Row objects

Expression-based operations and UDFs

Logical plans and optimizer
Fast/efficient internal representations


Internally rows, externally JVM objects

Almost the "Best of both worlds": type safe + fast

But slower than DF Not as good for interactive analysis, especially Python

\&databricks


DataFrames, Datasets and SQL share the same optimization/execution pipeline

Spark 1.3 Static DataFrames

Spark 2.0 Infinite DataFrames |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- |
|  |  |  |  |  |
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|  |  |  |  |  |
|  |  |  |  |  |

Single API!

\&databricks

| $\mid$ |  |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :---: | :---: |
|  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |
|  |  |  |  |  |  |  |

Traditional streaming
Example Other processing types

Ad-hoc Queries


ML Model
*databricks

## Chapter 2: Resilient Distributed Datasets

Out[4]: [array(['1', ' ', '2', '1', '01', 'M', '1', '087', ' ', '43', '23', '1
Out[4]: [array(['1', ' ', '2', '1', '01', 'M', '1', '087', ' ', '43', '23', '1
1',
' ', '4', 'M', '4', '2014', 'U', '7', 'C', 'N', ' ', ' ' 'I64
'238', '070', ' ', '24', '01', '11164 ', ' ',
',
',
$\begin{array}{lr}\prime & ', ' \\ \prime & \prime \\ \text { 'I64 ', ', ' } \\ \text { ' ', ' } \\ & \text { ', ' }\end{array}$


dtype='<U40')]

Out[11]: [2014, 2014, 2014, 2014, 2014, 2014, 2014, 2014, 2014, -99]
Out[12]: [('2014', 2014),
('2014', 2014),
('2014', 2014),
('2014', 2014),
('2014', 2014),
('2014', 2014),
('2014', 2014),
('2014', 2014),
('2014', 2014),
('-99', -99)]

```
Out[14]: ['2014', 2015, '2014', 2015, '2014', 2015, '2014', 2015,
    '2014', 2015]
```

Out[22]: ['-99', 'M', 'F']
Original dataset: 2631171, sample: 263247

```
Out[52]: [('c', (10, None)), ('b', (4, '6')), ('a', (1, 4)), ('a', (1, 1))]
Out[48]: [('b', (4, '6')), ('a', (1, 4)), ('a', (1, 1))]
Out[88]: [('a', 1)]
Out[122]: [('b', 4), ('c', 2), ('a', 12), ('d', 5)]
Out[132]: dict_items([('a', 2), ('b', 2), ('d', 2), ('c', 1)])
Out[159]: [('a', 4), ('b', 3), ('c', 2), ('a', 8), ('d', 2), ('b', 1), ('d', 3)]
```


## Chapter 3: DataFrames






Details for Stage 93 (Attempt 0)
Total Time Across All Tasks: 1 s
Locality Level Summary: Process local: 8
-DAG Visualization


- (2) Spark Jobs
+---+--------+---+--------+
|age|eyeColor| id | name|
+---+-------+---+-------+
$|19| \quad$ brown $|123| \quad$ Katie|
$|22| \quad$ green $|234|$ Michael|
$|23| \quad$ blue|345| Simone|
+---+--------+---+-------+


## Command took 0.22 s

- (1) Spark Jobs


## Out[6]:

[Row(age=19, eyeColor=u'brown', id=u'123', name=u'Katie'),
Row(age=22, eyeColor=u'green', id=u'234', name=u'Michael'),
Row(age=23, eyeColor=u'blue', id=u'345', name=u'Simone')]

## Command took 0.17 s

| - LIll $V$ - |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| > \%sql |  |  |  |  |  |  |
| -- Query Data |  |  |  |  |  |  |
| - (3) Spark Jobs |  |  |  |  |  |  |
| age |  |  |  | eyeColor | id | name |
| 19 |  |  |  | brown | 123 | Katie |
| 22 |  |  |  | green | 234 | Michael |
| 23 |  |  |  | blue | 345 | Simone |
| 囲 | .all | - | $\pm$ |  |  |  |

Command took 0.23 seconds -- by denny.g.lee@gmail.com at 2/20/2017, 10:18:30 AM on pandas-2.1_2.11

```
root
    |-- age: long (nullable = true)
    |-- eyeColor: string (nullable = true)
    |-- id: string (nullable = true)
    |-- name: string (nullable = true)
```

Command took 0.07s

```
root
    |-- id: long (nullable = true)
|-- name: string (nullable = true)
|-- age: long (nullable = true)
|-- eyeColor: string (nullable = true)
```

+---+---
|234| 22|

- (2) Spark Jobs

- (2) Spark Jobs

| id|age|
$+---+---+$
|234| 22|
+---+--- +
- (2) Spark Jobs

| \| Katie| | brown\| |
| :---: | :---: |
| \|Simone| | blue\| |

Command took 0.27s

- (2) Spark Jobs

| City\|origin| |  | Delays\| |
| :---: | :---: | :---: |
| \|Seattle| | SEA\| | 159086.0\| |
| \|Spokane| | GEG\| | 12404.0\| |
| Pasco\| | PSC\| | 949.0\| |

Command took 3.93 s


比 all Plot Options... $\pm$



## Unified Apache Spark 2.0 API



## Chapter 4: Prepared Data for Modeling

```
Count of rows: 7
Count of distinct rows: 6
```



Count of ids: 6
Count of distinct ids: 5




Out [9]: $[(1,0),(2,1),(3,4),(4,1),(5,1),(6,2),(7,0)]$


\{'age': 40.399999999999999, 'height': 5.4714285714285706, 'id': 4.0, 'weight': 140.28333333333333\}

Out[17]: \{'age': [9.0, 51.0], 'height': [4.8999999999999995, 5.6],
'weight': [115.0, 146.84999999999997]\}

"custID", "gender", "state", "cardholder", "balance", "numTrans", "numIntlTrans", "creditLine", "fraudRisk"
$1,1,35,1,3000,4,14,2,0$
$2,2,2,1,0,9,0,18,0$
3,2,2,1,0,27,9,16,0
4, 1, 15, 1, 0, 12, 0,5,0
5,1,46,1,0,11,16,7,0

```
root
    |-- custID: integer (nullable = true)
    |-- gender: integer (nullable = true)
    -- state: integer (nullable = true)
    -- cardholder: integer (nullable = true)
    -- balance: integer (nullable = true)
    -- numTrans: integer (nullable = true)
    -- numIntlTrans: integer (nullable = true)
    -- creditLine: integer (nullable = true)
    |-- fraudRisk: integer (nullable = true)
```



Out [30]: [[1.0, 0.00044523140172659576, 0.00027139913398184604], [None, 1.0, -0.0002805712819816179], [None, None, 1.0]]



Bins




## Chapter 5: Introducing MLlib

```
Out[8]: [Row(INFANT_NICU_ADMISSION='Y', INFANT_NICU_ADMISSION_RECODE=1),
    Row(INFANT_NICU_ADMISSION='Y', INFANT_NICU_ADMISSION_RECODE=1),
    Row(INFANT_NICU_ADMISSION='U', INFANT_NICU_ADMISSION_RECODE=0),
    Row(INFANT_NICU_ADMISSION='N', INFANT_NICU_ADMISSION_RECODE=0),
    Row(INFANT_NICU_ADMISSION='U', INFANT_NICU_ADMISSION_RECODE=0)]
```

| \|DIABETES_PRE|DIABETES_GEST|HYP_TENS_PRE|HYP_TENS_GEST|PREV_BIRTH_PRETERM| |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
| 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 |
| 0 | 0 | 0 | 0 | 0 |
| $0 \mid$ | 0 | 0 | 0 | 1\| |
| 0 | 0 | 0 | 0 | 0 |


| MOTHER_AGE_YEARS: | 28.30 | 6.08 |  |  |
| :--- | :---: | :---: | :---: | :--- |
| FATHER_COMBINED_AGE: | 44.55 | 27.55 |  |  |
| CIG_BEFORE: | 1.43 | 5.18 |  |  |
| CIG_1_TRI: | 0.91 | 3.83 |  |  |
| CIG_2_TRI: | 0.70 | 3.31 |  |  |
| CIG_3_TRI: | 0.58 | 3.11 |  |  |
| MOTHER_HEIGHT_IN: | 65.12 | 6.45 |  |  |
| MOTHER_PRE_WEIGHT: | 214.50 | 210.21 |  |  |
| MOTHER_DELIVERY_WEIGHT: |  | 223.63 | 180.01 |  |
| MOTHER_WEIGHT_GAIN: | 30.74 | 26.23 |  |  |

```
INFANT_ALIVE_AT_REPORT [(1, 23349), (0, 22080)]
BIRTH_PLACE [('1', 44558), ('4', 327), ('3', 224), ('2', 136), ('7', 91), ('5', 74), ('6', 11), ('9', 8)]
DIABETES_PRE [(0, 44881), (1, 548)]
DIABETES_GEST [(0, 43451), (1, 1978)]
HYP_TENS_PRE [(0, 44348), (1, 1081)]
HYP_TENS_GEST [(0, 43302), (1, 2127)]
PREV_BIRTH_PRETERM [(0, 43088), (1, 2341)]
```

```
CIG_BEFORE-to-CIG_1_TRI: 0.83
CIG_BEFORE-to-CIG_2_TRI: 0.72
CIG_BEFORE-to-CIG_3_TRI: 0.62
CIG_1_TRI-to-CIG_BEFORE: 0.83
CIG_1_TRI-to-CIG_2_TRI: 0.87
CIG_1_TRI-to-CIG_3_TRI: 0.76
CIG_2_TRI-to-CIG_BEFORE: 0.72
CIG_2_TRI-to-CIG_1_TRI: 0.87
CIG_2_TRI-to-CIG_3_TRI: 0.89
CIG_3_TRI-to-CIG_BEFORE: 0.62
CIG_3_TRI-to-CIG_1_TRI: 0.76
CIG_3_TRI-to-CIG_2_TRI: 0.89
MOTHER_PRE_WEIGHT-to-MOTHER_DELIVERY_WEIGHT: 0.54
```



```
MOTHER_DELIVERY_WEIGHT-tO-MOTHER_PRE_WEIGHT: 0.54
MOTHER_DELIVERY_WEIGHT-to-MOTHER_WEIGHT_GAIN: 0.60
MOTHER_WEIGHT_GAIN-to-MOTHER_PRE_WEIGHT: 0.65
MOTHER_WEIGHT_GAIN-to-MOTHER_DELIVERY_WEIGHT: 0.60
```

| DenseMatrix([ | 1 | 4.], |
| :---: | :---: | :---: |
| [ |  | 5.], |
| [ |  | 6.]]) |

BIRTH_PLACE 0.0
DIABETES_PRE 0.0
DIABETES_GEST 0.0
HYP_TENS_PRE 0.0
HYP_TENS_GEST 0.0
PREV_BIRTH_PRETERM 0.0

Area under PR: 0.85 Area under PR: 0.86 Area under PR: 0.85
Area under ROC: 0.63 Area under ROC: 0.63 Area under ROC: 0.63

## Chapter 6: Introducing the ML Package

\author{

| encoder $\rightarrow$ featuresCreator $\rightarrow$ logistic. |
| :---: | <br> Out [12]: [ROw(INFANT_ALIVE_AT_REPORT=0, BIRTH_PLACE='1', MOTHER_AGE_YEARS=1 3, FATHER_COMBINED_AGE=99, CIG_BEFORE=0, CIG_1_TRI=0, CIG_2_TRI=0, CIG_3_TRI=0, MOTHER_HEIGHT_IN=66, MOTHER_PRE_WEIGHT=133, MOTHER_DE LIVERY_WEIGHT=135, MOTHER_WEIGHT_GAIN=2, DIABETES_PRE=0, DIABETES_ GEST=0, HYP_TENS_PRE=0, HYP_TENS_GEST=0, PREV_BIRTH_PRETERM=0, BIR TH_PLACE_INT=1, BIRTH_PLACE_VEC=SparseVector(9, \{1: 1.0\}), feature $\mathrm{s}=\overline{\mathrm{S}}$ parseV $\operatorname{Coctor}(24,\{0: 13.0,1: 99.0,6: 66.0,7: 133.0,8: 135.0$, 9: 2.0, 16: 1.0\}), rawPrediction=DenseVector([1.0573, -1.0573]), p robability=DenseVector([0.7422, 0.2578]), prediction=0.0)]

}

> 0.7401301847095617
> 0.7139354342365674

Out [17]: [Row(INFANT_ALIVE_AT_REPORT=0, BIRTH_PLACE='1', MOTHER_AGE_YEARS=1 3, FATHER_COMBINED_AGE=99, CIG_BEFORE=0, CIG_1_TRI=0, CIG_2_TRI=0, CIG_3_TRI=0, MOTHER_HEIGHT_IN=66, MOTHER_PRE_WEIGHT=133, MOTHER_DE LIVERY_WEIGHT=135, MOTHER_WEIGHT_GAIN=2, DIABETES_PRE=0, DIABETES GEST=0, HYP_TENS_PRE=0, HYP_TENS_GEST=0, PREV_BIRTH_PRETERM=0, BIR TH_PLACE_INT=1, BIRTH_PLACE_VEC=SparseVector(9, \{1: 1.0\}), feature $\mathrm{s}=$ SparseVector $(24,\{0: 13.0,1: 99.0,6: 66.0,7: 133.0,8: 135.0$, 9: 2.0, 16: 1.0\}), rawPrediction=DenseVector([1.0573, -1.0573]), p robability=DenseVector([0.7422, 0.2578]), prediction=0.0)]


Out[27]: ([\{'maxIter': 50\}, \{'regParam': 0.01\}], 2.2158632176362274)

> 0.7334857800726642
> 0.7071651608758281

```
Out[35]: [Row(input_arr=['machine', 'learning', 'can', 'be', 'applied', 'to
    ', 'a', 'wide', 'variety', 'of', 'data', 'types', 'such', 'as', 'v
    ectors', 'text', 'images', 'and', 'structured', 'data', 'this', 'a
    pi', 'adopts', 'the', 'dataframe', 'from', 'spark', 'sql', 'in',
    order', 'to', 'support', 'a', 'variety', 'of', 'data', 'types'])]
```

Out[37]: [Row(input_stop=['machine', 'learning', 'applied', 'wide', 'variet y', 'data', 'types', 'vectors', 'text', 'images', 'structured', 'd ata', 'api', 'adopts', 'dataframe', 'spark', 'sql', 'order', 'supp ort', 'variety', 'data', 'types'])]

```
Out[39]: [Row(nGrams=['machine learning', 'learning applied', 'applied wide
    ', 'wide variety', 'variety data', 'data types', 'types vectors',
    'vectors text', 'text images', 'images structured', 'structured da
    ta', 'data api', 'api adopts', 'adopts dataframe', 'dataframe spar
    k', 'spark sql', 'sql order', 'order support', 'support variety',
    'variety data', 'data types'])]
```




$\begin{array}{ll}0.7736428008521183 & 0.7582781726635287 \\ 0.7415879154340478 & 0.7787580540118526\end{array}$

Out[58]: [Row(prediction=1, avg(MOTHER_HEIGHT_IN)=66.64658634538152, count( 1)=249) ,

Row(prediction=3, avg(MOTHER_HEIGHT_IN) $=67.69473684210526$, count ( 1) $=475$ ),

Row(prediction=4, avg(MOTHER_HEIGHT_IN)=65.38934651290499, count( 1)=3642),

Row(prediction=2, avg(MOTHER_HEIGHT_IN)=83.91154791154791, count( 1)=407), Row(prediction=0, avg(MOTHER_HEIGHT_IN)=63.90958873491283, count( 1)=8948)]

Out[61]: [Row(input_indexed=SparseVector(262, \{2: 7.0, 6: 1.0, 8: 3.0, 10: $3.0,12: 3.0,19: 1.0,20: 1.0,29: 1.0,38: 1.0,39: 2.0,41: 2.0$ , 44: 1.0, 50: 1.0, 60: 1.0, 65: 1.0, 87: 1.0, 108: 1.0, 110: 1.0, 112: 1.0, 114: 1.0, 116: 1.0, 139: 1.0, 149: 1.0, 150: 1.0, 162: 1 .0, 181: 1.0, 182: 1.0, 190: 1.0, 193: 1.0, 218: 1.0, 226: 1.0, 23 $0: 1.0,232: 1.0,249: 1.0,251: 1.0,256: 1.0\})$ ),
Row(input_indexed=SparseVector(262, \{20: 1.0, 21: 1.0, 22: 2.0, 3 $2: 2.0,33: 2.0,36: 2.0,48: 1.0,49: 1.0,55: 1.0,63: 1.0,72:$ $1.0,73: 1.0,77: 1.0,83: 1.0,88: 1.0,90: 1.0,93: 1.0,102: 1$. $0,105: 1.0,111: 1.0,122: 1.0,128: 1.0,130: 1.0,140: 1.0,145$ : 1.0, 146: 1.0, 170: 1.0, 173: 1.0, 195: 1.0, 196: 1.0, 202: 1.0, 203: 1.0, 207: 1.0, 209: 1.0, 212: 1.0, 213: 1.0, 216: 1.0, 221: 1 .0, 224: 1.0, 225: 1.0, 228: 1.0, 231: 1.0, 237: 1.0, 241: 1.0, 24 6: 1.0, 247: 1.0, 255: 1.0, 260: 1.0\}))]

0.48862170400240335

## Chapter 7: GraphFrames


restaurant recommendations

social network + restaurant recommendations





| tripid | delay | src | dst | city_dst | state_dst |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 1011111 | -5 | MSP | INL | International Falls | MN |
| 1021111 | 7 | MSP | INL | International Falls | MN |
| 1031111 | 0 | MSP | INL | International Falls | MN |
| 1041925 | 0 | MSP | INL | International Falls | MN |
| 1061115 | 33 | MSP | INL | International Falls | MN |
| 1071115 | 23 | MSP | INL | International Falls | MN |
| 1081115 | -9 | MSP | INL | International Falls | MN |
| 1091115 | 11 | MSP | INL | International Falls | MN |
| 1101115 | -2 | MASD | INII | Intarnatinnal Falle | MAN |

## - (2) Spark Jobs

- Job 16 View (Stages: 2/2, 4 skipped)
- Job 17 View (Stages: 2/2, 7 skipped)

Airports: 279
Trips: 1361141

- (2) Spark Jobs
- Job 18 View (Stages: 2/2, 7 skipped)
- Job 19 View (Stages: 2/2, 7 skipped)

On-time / Early Flights: 780469
Delayed Flights: 580672

- (1) Spark Jobs

| \|src|dst| | avg (delay) \| |
| :---: | :---: |
| \|SEA|PHL|55.66666666666664| |  |
| \|SEA|COS| | $43.53846153846154 \mid$ |
| \|SEA|FAT| | $43.03846153846154 \mid$ |
| \|SEA|LGB| | 39.39705882352941\| |
| \|SEA|IAD| | \|37.73333333333334| |
| only showing top 5 rows |  |


| (2) Spark Jobs |  | delay | src | dst | city_dst |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| tripid | 108 | SEA | BUR | Burbank | state_dst |  |
| 3201938 | 107 | SEA | SNA | Orange County | CA |  |
| 3201655 | 123 | SEA | OAK | Oakland | CA |  |
| 1011950 | 194 | SEA | OAK | Oakland | CA |  |
| 1021950 | 317 | SEA | OAK | Oakland | CA |  |
| 1021615 | 385 | SEA | OAK | Oakland | CA |  |
| 1021755 | 283 | SEA | OAK | Oakland | CA |  |
| 1031950 | 364 | SEA | OAK | Oakland | CA |  |
| 1031615 | 130 | SEA | OAK | Oakland | CA |  |
| 1031325 | 107 | SEA | OAK | Oakland | CA |  |
| 1061755 |  |  |  |  | CA |  |

- (2) Spark Jobs


囲 ( - Plot Options... $\underset{\sim}{2}$

- (1) Spark Jobs

- (1) Spark Jobs

- (1) Spark Jobs

- (8) Spark Jobs

- (6) Spark Jobs



- (14) Spark Jobs

| from | e0 | to |
| :---: | :---: | :---: |
| - \{"id":"SEA","City":"Seattle","State": "WA","Country":"USA"\} | ```> {"tripid":1010710,"delay":31,"src":"SEA","dst":"SFO","city_dst":"San Francisco","state_dst":"CA"}``` | - \{"id":"SFO","City":"San <br> Francisco","State":"CA","Country":"USA"\} |
| > \{"id":"SEA", "City":"Seattle","State":"WA","Country":"USA"\} | - \{"tripid":1012125, "delay":-4,"src":"SEA","dst":"SFO","city_dst":"San Francisco","state_dst":"CA"\} | $\begin{aligned} & \text { - \{"id":"SFO","City":"San } \\ & \text { Francisco","State":"CA","Country":"USA"\} } \end{aligned}$ |
| -\{"id":"SEA", "City":"Seattle", "State":"WA","Country": "USA"\} | - \{"tripid":1011840,"delay":-5,"src":"SEA","dst":"SFO","city_dst":"San Francisco","state_dst":"CA"\} | - \{"id":"SFO","City":"San <br> Francisco","State":"CA","Country":"USA"\} |
| -\{"id":"SEA", "City":"Seattle", "State":"WA","Country": "USA"\} | - \{"tripid":1010610,"delay":-4,"src":"SEA","dst":"SFO","city_dst":"San Francisco","state_dst":"CA"\} | - \{"id":"SFO","City":"San <br> Francisco","State":"CA","Country":"USA"\} |
| - \{"id":"SEA", "City": "Seattle","State":"WA","Country": "USA"\} | - \{"tripid":1011230,"delay":-2,"src":"SEA","dst":"SFO","city_dst":"San Francisco","state_dst":"CA"\} | - \{"id":"SFO","City":"San <br> Francisco","State":"CA","Country":"USA"\} |




(1) - Plot Options... $\pm$

Chapter 8: TensorFrames




$$
h_{1}=x_{1} w_{1}+x_{2} w_{2}+x_{3} w_{3} y_{i}=a+b x_{2}+\ldots+b x_{n}+e_{i}
$$

# How to choose which features? 




## GitHub Repositories Created in 2015

Interactive Visualizations of GitHub's Newest, Most Popular Repos Author: https://www. github.com/donnemartin



Hover: View info | Click: View repo url Interact with the filters

Data: Repos created in 2015, >=100 stars | Date Range: 1/1/2015 to $1 / 1 / 2016$
FAQ: See the final tab " $A$ " for more info



$$
\begin{gathered}
o p_{1}=\left[\begin{array}{lll}
a & b & c \\
d & e & f
\end{array}\right] x\left[\begin{array}{ll}
u & v \\
w & x \\
y & z
\end{array}\right] \\
c_{1}=\left[\begin{array}{lll}
3 . & 2 . & 1 .
\end{array}\right] \\
c_{2}=\left[\begin{array}{c}
-1 . \\
2 . \\
1 .
\end{array}\right] \\
\\
\\
\end{gathered}
$$

$$
m_{1}=\left[\begin{array}{ccc}
3 . & 2 . & 1 .
\end{array}\right] \quad m_{2}=\left[\begin{array}{lll}
-1 . & 2 . & 1 .
\end{array}\right]^{-1}
$$



$$
\begin{aligned}
o p_{1} & =t_{1} x t_{2} \\
& =m_{1} x m_{2} \\
& =2
\end{aligned}
$$

$$
m_{1}=\left[\begin{array}{llll}
3 . & 2 . & 1 . & 0 .
\end{array}\right] \quad m_{2}=\left[\begin{array}{llll}
-5 . & -4 . & -3 . & -2 .
\end{array}\right]^{-1}
$$



$$
\begin{aligned}
o p_{1} & =t_{1} x t_{2} \\
& =m_{1} x m_{2} \\
& =-26 .
\end{aligned}
$$



- (2) Spark Jobs
+---+
| $x$ |
+---+
|0.0|
|1.0|
|2.0|
|3.0|
|4.0|
|5.0|
|6.0|
|7.0|
|8.0|
|9.0|
+---+
- (2) Spark Jobs
+-----+---+
| $z|x|$
+----+---+
| 3.0|0.0|
| $4.0|1.0|$
| $5.0|2.0|$
| 6.0|3.0|
| 7.0|4.0|
| 8.0|5.0|
| $9.0|6.0|$
|10.0|7.0|
|11.0|8.0|
|12.0|9.0|
+----+---+

> - (2) Spark Jobs
> | [0.0, 0.0]|
> $|[1.0,-1.0]|$
> $|[2.0,-2.0]|$
> $|[3.0,-3.0]|$
> $|[4.0,-4.0]|$
> $|[5.0,-5.0]|$
> $|[6.0,-6.0]|$
> $|[7.0,-7.0]|$
> $|[8.0,-8.0]|$
> $|[9.0,-9.0]|$
> +-----------+

$10^{15}$

$$
\begin{gathered}
x_{i} \\
w_{i} \\
h_{1}
\end{gathered}
$$

## Chapter 9: Polyglot Persistence with Blaze

```
Fetching package metadata
Solving package specifications:
Package plan for installation in environment /Users/drabast/anaconda:
The following NEW packages will be INSTALLED:
    blaze: 0.10.1-py35_0
Proceed ([y]/n)? y
Linking packages
    COMPLETE
]|###################################################################|| 100%
```

Out[4]: array([[1, 2, 3],
$[4,5,6]])$

Out[6]:

|  | None |
| :--- | :--- |
| 0 | 1 |
| 1 | 2 |
| 2 | 3 |

Out[7]:

|  | None |
| :--- | :--- |
| 0 | 1 |
| 1 | 4 |

Out[9]:


Out[13]:

['Stop_month', 'Stop_day', 'Stop_year', 'Stop_hr', 'Stop_min', 'Sto p_sec', 'Agency', 'SubAgency', 'Description', 'Location', 'Latitude ', 'Longitude', 'Accident', 'Belts', 'Personal_Injury', 'Property_D amage', 'Fatal', 'Commercial_License', 'HAZMAT', 'Commercial_Vehicl e', 'Alcohol', 'Work_Zone', 'State', 'VehicleType', 'Year', 'Make', 'Model', 'Color', 'Violation_Type', 'Charge', 'Article', 'Contribut ed_To_Accident', 'Race', 'Gender', 'Driver_City', 'Driver_State', ' DL_State', 'Arrest_Type', 'Geolocation']

|  | Stop_month | Stop_day | Stop_year | Stop_hr | Stop_min | Stop_sec | Agency |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| $\mathbf{0}$ | 9 |  |  |  |  |  |  |
| 1 | 30 | 2014 | 23 | 51 | 0 | MCP |  |
|  |  |  |  |  |  |  |  |

Out [19]:

|  | Stop_month | Stop_day | Stop_year | Stop_hr | Stop_min | Stop_sec | Agency |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| $\mathbf{0}$ | 3 |  |  |  |  |  |  |
| 1 | 8 | 2013 | 17 | 34 | 0 | MCP |  |
|  |  |  |  |  |  |  |  |

Out[28]:

|  | Year |
| :--- | :--- |
| $\mathbf{0}$ | 2014.0 |
| $\mathbf{1}$ | 2003.0 |

Out[29]:

|  | Location | Year | Accident | Fatal | Alcohol |
| :--- | :--- | :--- | :--- | :--- | :--- |
| $\mathbf{0}$ | PARK RD AT HUNGERFORD DR | 2014.0 | No | No | No |
| $\mathbf{1}$ | CONNECTICUT AT METROPOLITAN AVE | 2003.0 | No | No | No |

Out[33]:

|  | Stop_year | Arrest_Type | Color | Charge |
| :--- | :--- | :--- | :--- | :--- |
| 73 | 2013 | A - Marked Patrol | SILVER | 13-409(b) |
| 215 | 2013 | B - Unmarked Patrol | BLACK | $21-309(\mathrm{~b})$ |

[2013 'A - Marked Patrol' 'SILVER' '13-409(b)']
[2013 'B - Unmarked Patrol' 'BLACK' '21-309(b)']

| Out [35] |  | Stop_year |
| :---: | :--- | :--- |
| 2 | 2013 |  |
| $\mathbf{0}$ | 2014 |  |
| $\mathbf{1}$ | 2015 |  |
| 3 | 2016 |  |

Out [36]: |  | Stop_year |
| ---: | :--- |
| $\mathbf{0}$ | 14 |
| $\mathbf{1}$ | 15 |

| Out [37 ] | Stop_year |  |
| :--- | :--- | :--- |
|  | $\mathbf{0}$ | 7.607878 |
| $\mathbf{1}$ | 7.608374 |  |

Out[38]: 2016

Out[9]:

|  | Stop_year | Year | Age_of_car |
| :--- | :--- | :--- | :--- |
| $\mathbf{0}$ | 2014 | 2014.0 | 0.0 |
| $\mathbf{1}$ | 2015 | 2003.0 | 12.0 |

Out[40]:

|  | Fatal | Fatal_AvgAge | Fatal_Count |
| :--- | :--- | :--- | :--- |
| $\mathbf{0}$ | No | 9.580998 | 404418 |
| $\mathbf{1}$ | Yes | 8.798246 | 116 |

Out[43]:

|  | Violation_Type | Belts | Violation_count |
| :--- | :--- | :--- | :--- |
| $\mathbf{0}$ | Citation | No | 989728 |
| $\mathbf{5}$ | Warning | No | 439490 |
| $\mathbf{2}$ | ESERO | No | 56447 |
| $\mathbf{1}$ | Citation | Yes | 35596 |
| $\mathbf{6}$ | Warning | Yes | 12245 |
| $\mathbf{3}$ | ESERO | Yes | 1327 |
| $\mathbf{4}$ | SERO | No | 3 |

## Chapter 10: Structures Streaming



| Streaming Statistics <br> Running batches of 1 second for 3 minutes 11 seconds since 2015/12/28 04:37:21 ( 53 completed batches, 77 records) |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  |  |
|  | Timelines (Last 190 batches, 137 active, 53 completed) | Histograms |  |  |  |
| Input Rate <br> Receivers: 1 / 1 active <br> Avg: 1.15 events $/ \mathrm{sec}$ |  |  | $40$ | $60$ | \#batches |
| Scheduling Delay ${ }^{(7)}$ Avg: 52 seconds 305 ms |  |  | 40 | $60$ | \#batches |
| Processing Time ${ }^{\text {(7) }}$ <br> Avg: 3 seconds 534 ms |  |  | $40$ |  | \#batches |
| Total Delay (7) <br> Avg: 54 seconds 254 ms |  |  | 40 | $60$ | \#batches |



Time: 2017-01-14 13:30:31

Time: 2017-01-14 13:30:32
---------------------------------------------
(u'blue', 5)
(u'green', 3)

Time: 2017-01-14 13:30:33

```
O
2. nc
dennyleeegallifrey~$ nc -lk 9999
green green green blue blue blue blue blue
gohawks
```

Time: 2017-01-14 13:30:31

Time: 2017-01-14 13:30:32
(u'blue', 5) (u'green', 3)

Time: 2017-01-14 13:30:33
-------------------------------------------------

Time: 2017-01-14 13:30:34
--------------------------------------------

Time: 2017-01-14 13:30:35
(u'gohawks', 1)

Time: 2017-01-14 13:30:36

Time: 2017-01-14 13:30:37
dennylee@gallifrey~\$ nc -lk 9999
green green blue blue blue blue blue
gohawks
green green

```
Time: 2017-01-16 17:19:38
```

Time: 2017-01-16 17:19:39
(u'blue', 5)
(u'green', 2)

Time: 2017-01-16 17:19:40
(u'gohawks', 1)

Time: 2017-01-16 17:19:41
---------------------------------------------

T-ー, $2017-01-16$ 17:-19:42
Time: 2017-01-16 17:19:42

Time: 2017-01-16 17:19:43
(u'green', 2)

## lines DStream



## lines DStream





Batch: 0


Batch: 1


I word l countl
+--------+-----+
I greenl 31
I bluel 51
I gohawks I 1 |

```
+--------+-----+
```

Batch: 2

```
+--------+-----+
| wordl countl
+--------+-----+
| greenl 5।
| bluel 5|
|gohawks| 1|
+--------+-----+
```


## Bonus Chapter 1: Installing Spark



User variables for todrabas

| Variable | Value |
| :--- | :--- |
| Path | C:\Users\todrabas\AppData\Local\Continuum\Anaconda3;C:\Users... |
| TEMP | \%USERPROFILE\%\AppData\Local\Temp |
| TMP | \%USERPROFILE\%\AppData\Local\Temp |
|  |  |
|  |  |
|  |  |

New...
Edit...
Delete

## System variables

| Variable | Value | $\wedge$ |
| :---: | :---: | :---: |
| ComSpec | C:\WINDOWS\system32\cmd.exe |  |
| NUMBER_OF_PROCESSORS | 4 |  |
| OS | Windows_NT |  |
| Path | C:\ProgramData\Oracle\Java\javapath;C:\WINDOWS\system32;Ci\... |  |
| PATHEXT | .COM; ,EXE;,BAT;,CMD;,VBS;,VBE; JS;,JSE; WSF;,WSH; MSC |  |
| PROCESSOR_ARCHITECTURE | AMD64 |  |
| PROCESSOR IDENTIFIER | Intel64 Familv 6 Model 58 Stepoina 9. Genuinelntel | $\checkmark$ |

New...
Edit...
Delete


| [INF0] |  |  |  |
| :---: | :---: | :---: | :---: |
| [INFO] | Reactor Summary: |  |  |
| [INFO] |  |  |  |
| [INFO] | Spark Project Parent POM | SUCCESS | $2.612 \mathrm{~s}]$ |
| [INFO] | Spark Project Tags | SUCCESS | $5.155 \mathrm{~s}]$ |
| [INFO] | Spark Project Sketch | SUCCESS | $6.345 \mathrm{~s}]$ |
| [INFO] | Spark Project Networking | SUCCESS | $8.141 \mathrm{~s}]$ |
| [INFO] | Spark Project Shuffle Streaming Service | SUCCESS | $4.775 \mathrm{~s}]$ |
| [INFO] | Spark Project Unsafe | SUCCESS | $6.784 \mathrm{~s}]$ |
| [INFO] | Spark Project Launcher | SUCCESS | [ 7.271 s ] |
| [INFO] | Spark Project Core | SUCCESS | [01:50 min] |
| [INFO] | Spark Project ML Local Library | SUCCESS | $6.066 \mathrm{~s}]$ |
| [INFO] | Spark Project GraphX | SUCCESS | [ 11.841 s ] |
| [INFO] | Spark Project Streaming | SUCCESS | [ 24.800 s ] |
| [INFO] | Spark Project Catalyst | SUCCESS | [ 59.887 s$]$ |
| [INFO] | Spark Project SQL | SUCCESS | [01:21 min] |
| [INFO] | Spark Project ML Library | SUCCESS | [01:02 min] |
| [INFO] | Spark Project Tools | SUCCESS | [ 0.886 s ] |
| [INFO] | Spark Project Hive | SUCCESS | [ 38.901 s ] |
| [INFO] | Spark Project REPL | SUCCESS | 3.463 s ] |
| [INFO] | Spark Project YaRN Shuffle Service | SUCCESS | $5.193 \mathrm{~s}]$ |
| [INFO] | Spark Project YARN | SUCCESS | [ 8.081 s ] |
| [INFO] | Spark Project Hive Thrift Server | SUCCESS | [ 16.256 s ] |
| [INFO] | Spark Project Assembly | SUCCESS | $2.667 \mathrm{~s}]$ |
| [INFO] | Spark Project External Flume Sink | SUCCESS | [ 4.421 s ] |
| [INFO] | Spark Project External Flume | SUCCESS | [ 9.387 s$]$ |
| [INFO] | Spark Project External Flume Assembly | SUCCESS | $2.294 \mathrm{~s}]$ |
| [INFO] | Spark Integration for Kafka 0.8 | SUCCESS | [ 8.363 s ] |
| [INFO] | Spark Project Examples | SUCCESS | [ 14.318 s ] |
| [INFO] | Spark Project External Kafka Assembly | SUCCESS | $3.098 \mathrm{~s}]$ |
| [INFO] | Spark Integration for Kafka 0.10 | SUCCESS | $6.825 \mathrm{~s}]$ |
| [INFO] | Spark Integration for Kafka 0.10 Assembly | SUCCESS | $2.987 \mathrm{~s}]$ |
| [INFO] | Kafka 0.10 Source for Structured Streaming | SUCCESS | [ 7.260 s$]$ |
| [INFO] | Spark Project Java 8 Tests | SUCCESS | [ 3.987 s ] |
| [INFO] |  |  |  |
| [INFO] | BUILD SUCCESS |  |  |
| [INFO] |  |  |  |
| [INFO] | Total time: 08:57 min |  |  |
| [INFO] | Finished at: 2017-01-15T16:29:36-08:00 |  |  |
| [INFO] | Final Memory: 92M/952M |  |  |
| [INFO] |  |  |  |

[^0]```
Running PySpark tests. Output is in /Users/drabast/Downloads/spark-2.1.0/python/unit-tests. Log
Will test against the following Python executables: ['python']
Will test the following Python modules: ['pyspark-core', 'pyspark-ml', 'pyspark-mllib', 'pyspark-sql', 'pyspark-streaming']
Finished test(python): pyspark.sql.tests (63s)
Finished test(python): pyspark.accumulators (8s)
Finished test(python): pyspark.broadcast (5s)
Finished test(python): pyspark.conf (4s)
Finished test(python): pyspark.context (19s)
Finished test(python): pyspark.ml.classification (30s)
Finished test(python): pyspark.tests (140s)
Finished test(python): pyspark.ml.clustering (23s)
Finished test(python): pyspark.ml.evaluation (14s)
Finished test(python): pyspark.ml.linalg.__init__ (0s)
Finished test(python): pyspark.ml.recommendation (18s)
Finished test(python): pyspark.ml.feature (31s)
Finished test(python): pyspark.streaming.tests (187s)
Finished test(python): pyspark.ml.regression (25s)
Finished test(python): pyspark.ml.tuning (23s)
Finished test(python): pyspark.mllib.tests (214s)
Finished test(python): pyspark.mllib.classification (26s)
Finished test(python): pyspark.mllib.evaluation (20s)
Finished test(python): pyspark.mllib.feature (26s)
Finished test(python): pyspark.mllib.clustering (42s)
Finished test(python): pyspark.mllib. linalg._-init_-- (0s)
Finished test(python): pyspark.mllib.fpm (21s)
Finished test(python): pyspark.mllib.random (10s)
Finished test(python): pyspark.ml.tests (89s)
Finished test(python): pyspark.mllib.stat.KernelDensity (0s)
Finished test(python): pyspark.mllib.recommendation (27s)
Finished test(python): pyspark.mllib.linalg.distributed (31s)
Finished test(python): pyspark.mllib.regression (27s)
Finished test(python): pyspark.mllib.stat._statistics (14s)
Finished test(python): pyspark.mllib.util (11s)
Finished test(python): pyspark.profiler (9s)
Finished test(python): pyspark.mllib.tree (17s)
Finished test(python): pyspark.shuffle (1s)
Finished test(python): pyspark.serializers (15s)
Finished test(python): pyspark.rdd (21s)
Finished test(python): pyspark.sql.conf (5s)
Finished test(python): pyspark.sql.catalog (18s)
Finished test(python): pyspark.sql.column (19s)
Finished test(python): pyspark.sql.context (21s)
Finished test(python): pyspark.sql.group (34s)
Finished test(python): pyspark.sql.dataframe (39s)
Finished test(python): pyspark.sql.functions (41s)
Finished test(python): pyspark.sql.types (9s)
Finished test(python): pyspark.sql.window (5s)
Finished test(python): pyspark.streaming.util (0s)
Finished test(python): pyspark.sql. readwriter (33s)
Finished test(python): pyspark.sql.session (16s)
Tests passed in 372 seconds
```

```
Python 3.5.1 |Anaconda 2.4.1 (x86_64)| (default, Dec 7 2015, 11:24:55)
[GCC 4.2.1 (Apple Inc. build 5577)] on darwin
Type "help", "copyright", "credits" or "license" for more information.
Using Spark's default log4j profile: org/apache/spark/log4j-defaults.properties
Setting default log level to "WARN".
To adjust logging level use sc.setLogLevel(newLevel).
Welcome to
```


version 2.1.0
Using Python version 3.5.1 (default, Dec 72015 11:24:55)
SparkSession available as 'spark'.
>>>

## cian Command Prompt - pyspark

C: \Users\todrabas>pyspark
Python 3.5.1 |Anaconda 2.4.1 (64-bit)| (default, Dec 7 2015, 15:00:12) [MSC v. 190064 bit (AMD64)] on win32
Type "help", "copyright", "credits" or "license" for more information.
Using Spark's default log4j profile: org/apache/spark/log4j-defaults.properties
Setting default log level to "WARN".
To adjust logging level use sc.setLogLevel(newLevel).
16/07/18 20:57:04 ERROR Shell: Failed to locate the winutils binary in the hadoop binary path
java.io. IOException: Could not locate executable null\bin\winutils.exe in the Hadoop binaries.
at org.apache.hadoop.util.Shell.getQualifiedBinPath(Shell.java:356)
at org.apache.hadoop.util.Shell.getWinUtilsPath(Shell.java:371)
at org.apache.hadoop.util.Shell.<clinit>(Shell.java:364)
at org.apache.hadoop.util.StringUtils.<clinit>(StringUtils.java:80)
at org.apache.hadoop.security.SecurityUtil.getAuthenticationMethod(SecurityUtil.java:611)
at org.apache.hadoop.security.UserGroupInformation.initialize(UserGroupInformation. java:272)
at org.apache.hadoop.security.UserGroupInformation.ensureInitialized(UserGroupInformation. java: 260)
at org.apache.hadoop.security.UserGroupInformation.loginUserFromSubject (UserGroupInformation.java:790)
at org.apache.hadoop.security.UserGroupInformation.getLoginUser(UserGroupInformation.java:760)
at org.apache.hadoop.security.UserGroupInformation.getCurrentUser(UserGroupInformation.java:633)
at org.apache.spark.util.Utils\$\$anonfun\$getCurrentUserName\$1.apply(Utils.scala:2181)
at org.apache.spark.util.Utils\$\$anonfun\$getCurrentUserName\$1.apply(Utils.scala:2181)
at scala.Option.getOrElse(Option.scala:121)
at org.apache.spark.util.Utils\$.getCurrentUserName(Utils.scala:2181)
at org.apache.spark.SparkContext.<init>(SparkContext. scala:299)
at org.apache.spark.SparkContext.<init>(SparkContext.scala:299)
at org.apache.spark.api.java.JavaSparkContext.<init>(JavaSparkContext.scala:58)
at sun.reflect. NativeConstructorAccessorImpl.newInstance0(Native Method)
at sun.reflect. NativeConstructorAccessorImpl.newInstance(Unknown Source)
at sun.reflect.DelegatingConstructorAccessorImpl.newInstance(Unknown Source)
at java.lang.reflect.Constructor.newInstance(Unknown Source)
at py4j.reflection.MethodInvoker.invoke(MethodInvoker.java:240)
at py4j.reflection.ReflectionEngine.invoke(ReflectionEngine.java:357)
at py4j.Gateway.invoke(Gateway.java:236)
at py4j.commands.ConstructorCommand.invokeConstructor(ConstructorCommand.java:80)
at py4j.commands.ConstructorCommand.execute(ConstructorCommand.java:69)
at py4j.GatewayConnection.run(GatewayConnection.java:211)
at java.lang. Thread.run(Unknown Source)
16/07/18 20:57:04 WARN NativeCodeLoader: Unable to load native-hadoop library for your platform... using builtin-java classes where applicable 16/07/18 20:57:05 WARN AbstractHandler: No Server set for org.spark_project.jetty.server.handler.ErrorHandler@17f9462 Welcome to

```
\(l_{\bar{\prime}}^{\prime}-\sqrt{1}\)
```



Using Python version 3.5.1 (default, Dec 72015 15:00:12)
SparkSession available as 'spark'.
>>>

Jupyter

Files Running Clusters
Select items to perform actions on them. New $\sim$ Upload
$\square$ ャ 会 $\quad$ Notebook list empty.

| Upload | New - |
| :---: | :---: |
| Text File |  |
| Folder |  |
| Terminal |  |
| Notebooks |  |
| Python 3 |  |



In [ ]: |

Out[1]: <pyspark.context.SparkContext at 0x1050456a0>

Out[2]: <pyspark.sql.context.sQLContext at 0x10b832a58>

Jupyter HelloWorldFromPySpark
File Edit View Insert Cell Kernel ト

| New Notebook Open... | 个 | $\downarrow$ | $N$ | C | Code |
| :---: | :---: | :---: | :---: | :---: | :---: |
|  |  |  |  |  |  |
| Make a Copy... |  |  |  |  |  |
| Rename... <br> Save and Checkpoint | rk.context.SparkContext |  |  |  |  |
| Revert to Checkpoint | text |  |  |  |  |
|  | rk.sql.context.SQLContes |  |  |  |  |
| Print Preview |  |  |  |  |  |
| Download as | sc.version) |  |  |  |  |
| Trusted Notebook | preview |  |  |  |  |
|  |  |  |  |  |  |
| Close and Halt |  |  |  |  |  |

## Bonus Chapter 2: Free Spark Cloud Offering



## Select a version to get started.

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INTRODUCTION
Welcome
Navigating this Guide
Introduction to Apache Spark Get Databricks

Additional Resources

## Welcome

This self-paced guide is the "Hello World" tutorial of Apache Spark using Databricks (try Databricks here). In the following chapters, you will familiarize yourself with the Spark UI, learn how to create Spark jobs, load data and work with Datasets, get familiar with Spark's DataFrames API, run machine learning algorithms, and understand the basic concepts behind Spark Streaming. Instead of worrying about spinning up clusters, maintaining clusters, maintaining code history, or Spark versions, you can start writing Spark queries instantly and focus on your data problems.

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|  | Send text message | Call me |
| :--- | :--- | :--- |

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| :---: | :---: | :---: | :---: | :---: | :---: |
| * Cluster Name | Cluster configuration |  |  |  |  |
| LearningPySparkTestCluster $\checkmark$ | * Cluster Type © | * Operating System * Version |  |  |  |
| .azurehdinsight.net |  |  |  |  |  |
|  | Spark $\quad \checkmark$ | Linux | Spark 2.0.1 (HDI 3.5) | $\checkmark$ |  |
| Free Trial $\downarrow$ | * Cluster Tier © |  |  |  |  |
|  | STANDARD PREMIUM |  |  |  |  |
| Cluster configuration © <br> Configure required settings | Spark : Fast data analytics and cluster computing using in-memory processing. |  |  |  |  |
| Applications © | Features |  |  |  |  |
|  | * denotes preview feature |  |  |  |  |
|  | Available | Not available |  |  |  |
| * Credentials <br> Configure required settings | + Secure shell (SSH) access | + Apache Ranger* (PREMIUM) © |  |  |  |
|  | + HDInsight applications | + Domain joining* (PREMIUM) © |  |  |  |
| * Data Source © <br> Configure required settings | + Custom virtual network | + Remote Desktop access ${ }^{\text {© }}$ |  |  |  |
| * Pricing <br> Please configure required settings | + Custom Oozie metastore |  |  |  |  |
| Advanced configurations | + Data Lake Store access |  |  |  |  |
|  | + ADLS as primary FS (storage) |  |  |  |  |









Current session configs: \{u'executorCores': 4, u'numExecutors': 2, u'executorMemory': u'2GB', u'name': u'learningPySpark_Example', u'kind': 'pyspark'\}

No active sessions.

| Magic | Example | Explanation |
| :---: | :---: | :---: |
| info | \%\%info | Outputs session information for the current Livy endpoint. |
| cleanup | \%\%cleanup -f | Deletes all sessions for the current Livy endpoint, including this notebook's session. The force flag is mandatory. |
| delete | \%\%delete -f -s 0 | Deletes a session by number for the current Livy endpoint. Cannot delete this kernel's session. |
| logs | \%\%logs | Outputs the current session's Livy logs. |
| configure | \%\%configure -f <br> \{"executorMemory": "1000M", "executorCores": 4\} | Configure the session creation parameters. The force flag is mandatory if a session has already been created and the session will be dropped and recreated. <br> Look at Livy's POST /sessions Request Body for a list of valid parameters. Parameters must be passed in as a JSON string. |
| sql | \%\%sql -o tables -q <br> SHOW TABLES | Executes a SQL query against the variable sqIContext (Spark v1.x) or spark (Spark v2.x). Parameters: <br> - -o VAR_NAME: The result of the query will be available in the \%\%local Python context as a Pandas dataframe. <br> - -q: The magic will return None instead of the dataframe (no visualization). <br> - -m METHOD: Sample method, either take or sample. <br> - -n MAXROWS: The maximum number of rows of a SQL query that will be pulled from Livy to Jupyter. If this number is negative, then the number of rows will be unlimited. <br> - -r FRACTION: Fraction used for sampling. |
| local | $\begin{aligned} & \text { \%\%local } \\ & a=1 \end{aligned}$ | All the code in subsequent lines will be executed locally. Code must be valid Python code. |

## Starting Spark application

| ID | YARN Application ID | Kind | State | Spark UI | Driver log | Current session? |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| 5 | application_1483055828481_0010 | pyspark | idle | Link | Link | $\boldsymbol{V}$ |

```
SparkSession available as 'spark'.
```

```
Row(BIRTH_PLACE=1, count=44558)
Row(BIRTH_PLACE=2, count=136)
Row(BIRTH_PLACE=3, count=224)
Row(BIRTH_PLACE=4, count=327)
Row(BIRTH_PLACE=5, count=74)
Row(BIRTH_PLACE=6, count=11)
Row(BIRTH_PLACE=7, count=91)
Row(BIRTH_PLACE=9, count=8)
```

| BIRTH_PLACE | Count |
| :--- | :--- |
| 1 | 44558 |
| 2 | 136 |
| 3 | 224 |
| 4 | 327 |
| 5 | 74 |
| 6 | 11 |
| 7 | 91 |
| 9 | 8 |

Encoding:


Func. $\quad$ Max $\quad \bullet$


Type:
Table Pie Scatter Line $\quad$ Area $\quad$ Bar

| BIRTH_PLACE | Count |
| :--- | :--- |
| 1 | 44558 |
| 6 | 11 |
| 3 | 224 |
| 5 | 74 |
| 9 | 8 |




|  | Jobs | Stages | Storage | Environment | Executors | SQL | livy-session-7 application UI |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |

## Spark Jobs ${ }^{(?)}$

User: yarn
Total Uptime: 8.0 min
Scheduling Mode: FIFO
Completed Jobs: 9

- Event Timeline


## Completed Jobs (9)

| Job ld | Description | Submitted | Duration | Stages: Succeeded/Total | Tasks (for all stages): Succeeded/Total |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 8 | runJob at PythonRDD.scala:441 | 2016/12/31 22:54:49 | 75 ms | 1/1 (2 skipped) | 4/4 (201 skipped) |
| 7 | runJob at PythonRDD.scala:441 | 2016/12/31 22:54:49 | 67 ms | 1/1 (2 skipped) | 4/4 (201 skipped) |
| 6 | runJob at PythonRDD.scala:441 | 2016/12/31 22:54:48 | 0.9 s | 2/2 (1 skipped) | 201/201 (1 skipped) |
| 5 | toJSON at NativeMethodAccessorimpl.java:-2 | 2016/12/31 22:54:47 | 0.8 s | 2/2 | 201/201 |
| 4 | collect at <stdin>:4 | 2016/12/31 22:54:43 | 0.6 s | $2 / 2$ (1 skipped) | 209/209 (1 skipped) |
| 3 | collect at <stdin>:4 | 2016/12/31 22:54:41 | 2 s | $2 / 2$ | 201/201 |
| 2 | csv at NativeMethodAccessorlmpl.java:-2 | 2016/12/31 22:54:35 | 2 s | 1/1 | 1/1 |
| 1 | csv at NativeMethodAccessorimpl.java:-2 | 2016/12/31 22:54:35 | 0.1 s | 1/1 | 1/1 |
| 0 | csv at NativeMethodAccessorimpl.java:-2 | 2016/12/31 22:54:33 | 1 s | 1/1 | 1/1 |

SOMrK $_{20.0 .0 .25 .21-1}$ Jobs Stages Storage Environment Executors SQL livy-session-7 application UI

Details for Stage 6 (Attempt 0)
Total Time Across All Tasks: 1.0 s s
Locality Level Summary: Node local: 8; Process local: 192
Shuffle Read: 504.0 B/8
Shuffle Write: 504.0 B / 8

- DAG Visualization
, Show Additional Metrics
, Event Timeline
Summary Metrics for $\mathbf{2 0 0}$ Completed Tasks

| Metric |  |  |  | Min |  | 25th percentile |  | Median |  |  | 75th percentile M |  |  | Max |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Duration |  |  |  | 1 ms |  | 2 ms |  | 3 ms |  |  | 5 ms |  |  | 27 ms |  |  |
| GC Time |  |  |  | 0 ms |  | 0 ms |  | 0 ms |  |  | 0 ms |  |  | 0 ms |  |  |
| Shutfle Read Size / Records |  |  |  | $0.0 \mathrm{~B} / 0$ |  | $0.0 \mathrm{~B} / 0$ |  | $0.0 \mathrm{~B} / 0$ |  |  | $0.0 \mathrm{~B} / 0$ |  | $63.0 \mathrm{~B} / 1$ |  |  |  |
| Shuffle Write Size / Records |  |  |  | $0.0 \mathrm{~B} / 0$ |  | $0.0 \mathrm{~B} / 0$ |  | $0.0 \mathrm{~B} / 0$ |  |  | $0.0 \mathrm{~B} / 0$ |  | $63.0 \mathrm{~B} / 1$ |  |  |  |
| Aggregated Metrics by Executor |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| Executor ID 4 A |  |  | Address | Task Time | Total Tasks | s Failed Tasks |  | Succeeded Tasks |  | Shuffle Read Size / Records |  |  | Shuffle Write Size / Records |  |  |  |
| 1 100, |  |  | 10.0.0.7:44793 | 2 s | 150 |  | 0 | 150 |  | $504.0 \text { B / } 8$ |  |  | 504.0 B / 8 |  |  |  |
| 21 |  |  | 10.0.0.6:46439 | 2 s | 50 |  | 0 | 50 |  | $0.0 \mathrm{~B} / 0$ |  |  | $0.0 \mathrm{~B} / 0$ |  |  |  |
| Tasks (200) |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |
| Page: 1 | 2 | $>$ |  |  |  |  |  |  |  |  | 2 Pages. Jump to 1 |  | . Show | items in a page. |  | Go |
| Index 4 | ID | Attempt | Status | Locality Level | Executor ID | / Host | Launch Time | Duration | GC Time | Shuffle Read Siz | e / Records | Write Time | Shuffle Write Size / Records |  | Erro |  |
| 0 | 208 | 0 | Success | PROCESS_LOCAL | 2/10.0.0.6 |  | 2016/12/31 22:54:43 | 324 ms |  | $0.0 \mathrm{~B} / 0$ |  |  | $0.0 \mathrm{~B} / 0$ |  |  |  |
| 1 | 209 | 0 | Success | PROCESS_LOCAL | 2/10.0.0.6 |  | 2016/12/31 22:54:43 | 311 ms |  | $0.0 \mathrm{~B} / 0$ |  |  | $0.0 \mathrm{~B} / 0$ |  |  |  |
| 2 | 210 | 0 | SUCCESS | PROCESS_LOCAL | 2/10.0.0.6 |  | 2016/12/31 22:54:43 | 315 ms |  | $0.0 \mathrm{~B} / 0$ |  |  | $0.0 \mathrm{~B} / 0$ |  |  |  |
| 3 | 211 | 0 | SUCCESS | PROCESS_LOCAL | 2/10.0.0.6 |  | 2016/12/31 22:54:43 | 9 ms |  | $0.0 \mathrm{~B} / 0$ |  |  | $0.0 \mathrm{~B} / 0$ |  |  |  |
| 4 | 216 | 0 | SUCCESS | PROCESS_LOCAL | 2/10.0.0.6 |  | 2016/12/31 22:54:43 | 8 ms |  | $0.0 \mathrm{~B} / 0$ |  |  | $0.0 \mathrm{~B} / 0$ |  |  |  |
| 5 | 217 | 0 | SUCCESS | PROCESS_LOCAL | 2/10.0.0.6 |  | 2016/12/31 22:54:43 | 7ms |  | $0.0 \mathrm{~B} / 0$ |  |  | $0.0 \mathrm{~B} / 0$ |  |  |  |


\&databricks

```
> -- Join to the response codes table
    -- Switch to pie chart using the chart button below the results
    select r.responsedesc, count(1) as responses
        from weblog f
        inner join response_codes r
            on r.responsecode = f.responsecode
    group by r.responsedesc
    order by responses desc
```



```
p = ggplot(pydf, aes('pop','price')) + \
    geom_point(color='blue') + \
    geom_line(pydf, aes('pop','predA'), color='red') + \
    geom_line(pydf, aes('pop','predB'), color='green') + \
    scale_x_log10() + scale_y_log10()
display(p)
```



(\#)

On-Time Flight Performance (Spark 2.0) (Python)


tripdelaysFilePath = "/databricks-datasets/flights/departuredelays.csv"
airportsnaFilePath = "/databricks-datasets/flights/airport-codes-na.txt"
\# Obtain airports dataset
airportsna =
sqtContextpark. read. format("com.databricks.spark.csv").options(header='true',
inferschema='true', delimiter='\t'). load(airportsnaFilePath)
airportsna.fegisterTempTable("airports_na")
\# Obtain departure Detays data
departureDelays $=$ sqtContextcreateOrReplaceTempView("airports_na")
\# Obtain departure Delays data
departureDelays =
spark.read.format("com.databricks.spark.csv").options(header='true'). load(tri
pdelaysFilePath)
departureDelays.fegisterTempTablecreateOrReplaceTempView("departureDelays")
departureDelays.cache()
\# Available IATA codes from the departuredelays sample dataset
tripIATA = sqlContextpark.sql("select distinct iata from (select distinct
origin as iata from departureDelays union all select distinct destination as
Uctuver 10, IU:IO rivirui
- Denny Lee
0
October 16, 8:46 PM PDT

- Denny Lee
October 16, 8:27 PM PDT
    - Denny Lee
Restore this revision

October 16, 7:52 PM PDT - Den

Send Feedback
\# Setup the textFile RDD to read the \# Note this is lazy textFile = sc.textFile("/databricks-d

Command took 0.17 seconds -- by denny.g.lee@gm

RDDs have actions, which return values, a Details for Job 6

Status: SUCCEEDED
Job Group: 5349193575997819680_6197296117139168760_d1018fa4067b4522b67d2e284a692297 Completed Stages: 1

Event Timeline
-DAG Visualization


Create Cluster

New Cluster Cancel Create Cluster OWorkers, 0 GB Memory, 0 Cores © and 1 Driver, 6 GB

Cluster Name
pandas-2.1.0_2.11
Apache Spark Version 3
Spark 2.1.0-db1 (Scala 2.11) 令
Instance
Free 6GB Memory
As a Community Edition user, your cluster will automatically terminate after an idle period of two hours. For more configuration options, please upgrade your Databricks subscription.

Hide advanced settings
AWS Spark

Availability Zone (3)
us-west-2c $\frac{\Delta}{\text { v }}$
Worker Node Type ?
Community Optimized $\quad \stackrel{*}{ } 6 \mathrm{~GB}$ Memory, 0.88 Cores (3)
Driver Node Type (\%)
Same as worker



## Quick Start Using Python

- Using a Databricks notebook to showcase RDD operations using Python
- Reference http://spark.apache.org/docs/latest/quick-start.html

```
> # Take a look at the file system
display(dbutils.fs.ls("/databricks-datasets/samples/docs/"))
\begin{tabular}{|c|c|c|}
\hline path & name & size \\
\hline dbfs:/databricks-datasets/samples/docs/README.md & README.md & 3137 \\
\hline
\end{tabular}
#
```

```
# Setup the textFile RDD to read the README.md file
# Note this is lazy
textFile = sc.textFile("/databricks-datasets/samples/docs/README.md")
```

RDDs have actions, which return values, and transformations, which return pointers to new RDDs.

```
# When performing an action (like a count) this is when the textFile is read and aggregate calculated
    # Click on [View] to see the stages and executors
    textFile.count()
Out[5]: 65
```



| databricks | Workspace v |  |  | quick start V |
| :---: | :---: | :---: | :---: | :---: |
|  | ? Documentation <br> </> Release Notes <br> Training \& Tutorials | $\square$ fights <br> genomics |  |  |
|  |  | $\bigcirc$ quick start |  |  |
| Home | \& Shared |  | Create | - |
|  | 20\% Users |  | Clone |  |
| Workspace |  |  | Rename |  |
| © |  |  | Move |  |
| Recent |  |  | Delete |  |
|  |  |  | Import |  |
| \# |  |  | Export | > |
| Tables |  |  | Permissions |  |
| Clusters |  |  |  |  |

## Import Notebooks

Import from: $\bigcirc$ File $\bigcirc$ URL

## databricks.com/hubfs/notebooks/Quick_Start/Quick_Start_Using_Python.htm|

Accepted formats: .dbc, .scala, .py, .sql, .r, .ipynb, .html
(To import a library, such as a jar or egg, click here)




Quick Start Using Python（Python）

Quick Start Using Python
－Using a Databricks notebook to showcase RDD operations using Python
－Reference http：／／spark．apache．org／docs／latest／quick－start．html


Quick Start Using Python（Python）



## Quick Start Using Python

－Using a Databricks notebook to showcase RDD operations using Python
－Reference http：／／spark．apache．org／docs／latest／quick－start．html

```
# Take a look at the file system
    display(dbutils.fs.ls("/databricks-datasets/samples/docs/"))
    * (5) Spark Jobs
\begin{tabular}{|l|l|l|}
\hline path & name \\
\hline dbfs：／databricks－datasets／samples／docs／README．md & README．md \\
\hline
\end{tabular}
囲 alll * &
4
Command took 0.60 seconds -- by denny.g.lee@gmail.com at 1/6/2017, 2:36:24 PM on My Cluster
```




[^0]:    [info] Packaging /Users/drabast/Downloads/spark-2.1.0/examples/target/scala-2.11/jars/spark-examples_2.11-2.1.0.jar
    [info] Done packaging.
    [success] Total time: 238 s, completed Jan 16, 2017 8:40:00 PM

