

>>> df.9												
1.					+-							+
					assenger_count t					cationID DOLo	cationID payme	nt_type fare_a
					t_surcharge tota							
11.					+-							
+								+	+			
	1 2019-03-01			00:25:31	1.0	0.0	1.0		N	145	145	2
2.5	0.5 0.5	0.0	0.0		0.3	3.8		0.0	null			
	1 2019-03-01		2019-03-01	00:36:37	2.0	3.7	1.0		N	95	130	1
13.0	0.5 0.5	0.7	0.0		0.3	15.0		0.0	null			
11	1 2019-03-01	. 00:05:21	2019-03-01	00:38:23	1.0	14.1	1.0		N	249	28	1
41.0	3.0 0.5	10.1	5.76		0.3	60.66		2.5	null			
	1 2019-03-01	. 00:48:55	2019-03-01	01:06:03	1.0	9.6	1.0		N	138	98	2
27.0	0.5 0.5	0.0	0.0		0.3	28.3		0.0	null			
	1 2019-03-01			00:16:40	1.0	0.8	1.0		N	48	48	1
5.5	3.0 0.5	3.0	0.0		0.3	12.3		2.5	null			
+	+	+		+	+-	+	+-					+
+	++-	+						+	+			
only sho	owing top 5 ro	WS										
I												
>>>												v

```
>>> # Columns and types
>>> df.printSchema()
root
  -- VendorID: long (nullable = true)
  -- tpep_pickup_datetime: timestamp (nullable = true)
  -- tpep dropoff datetime: timestamp (nullable = true)
  -- passenger count: double (nullable = true)
  -- trip distance: double (nullable = true)
  -- RatecodeID: double (nullable = true)
  -- store_and_fwd_flag: string (nullable = true)
  -- PULocationID: long (nullable = true)
  -- DOLocationID: long (nullable = true)
  -- payment type: long (nullable = true)
  -- fare amount: double (nullable = true)
  -- extra: double (nullable = true)
  -- mta tax: double (nullable = true)
  -- tip amount: double (nullable = true)
  -- tolls amount: double (nullable = true)
  -- improvement_surcharge: double (nullable = true)
  -- total amount: double (nullable = true)
  -- congestion surcharge: double (nullable = true)
 |-- airport fee: integer (nullable = true)
```

3. Initial Cleaning & Understanding

1. Trip Count per Month

```
>>> from pyspark.sql.functions import month
>>> df.withColumn("month", month("tpep_pickup_datetime")) \
      .groupBy("month") \
      .count() \
      .orderBy("month") \
      .show()
|month|
         countl
             42
     2
            362
     3 | 7866111 |
             781
     41
     5 j
             11|
     6
              1
              5
              1
     8
    12
              9|
```

2. Trip Distance Distribution

```
>>> df.select("trip_distance").describe().show()
+-----+
|summary| trip_distance|
+-----+
| count| 7866620|
| mean| 3.023191633764328|
| stddev|3.9280515814262924|
| min| 0.0|
| max| 237.17|
+-----+
```

3. Fare vs. Distance Relationship

```
>>> df.select("fare_amount", "trip_distance") \
      .filter("trip_distance > 0 and fare_amount > 0") \
      .show(10)
 fare_amount|trip_distance|
        13.0
                       3.7
        41.0
                      14.1
        27.0
                       9.6
         5.51
                       0.8|
         6.0
         5.5
                       0.6
        17.0
                      5.65
         6.01
                      1.16
         5.0
                      0.71
        10.5
                      2.63
only showing top 10 rows
```

4. Top Pickup & Drop-off Locations

5. Average Trip Duration

6. Payment Type Distribution

```
>>> df.groupBy("payment_type") \
... .count() \
... .orderBy(col("count").desc()) \
... .show()
+-----+
|payment_type| count|
+-----+
| 1|5721775|
| 2|2057412|
| 3| 39281|
| 0| 33474|
| 4| 14648|
| 5| 30|
+-----+
```

7. Tip Analysis

```
>>> df.select("tip_amount").describe().show()
|summary| tip_amount|
  count 7866620
   mean 2.2224419954258554
  stddev | 50.52138315426142|
          -89.89
| 141492.02
    min|
    max
>>> # Tip-to-Fare Ratio (optional)
>>> df.withColumn("tip_ratio", col("tip_amount") / col("fare_amount")) \
... .select("tip_ratio") \
... .describe() \
    .show()
|summary| tip_ratio|
  count| 7863649|
  mean | 0.19918917663286123 |
  stddev| 11.090063586122845|
    min|-0.4523076923076923|
                    22777.0
    max
```

8. Passenger Count Distribution

```
>>> df.groupBy("passenger_count") \
      .count() \
      .orderBy("passenger_count") \
      .show()
|passenger_count|
                   33474
             null
              0.0 | 140131
              1.0 | 5496239 |
              2.0 | 1176562 |
              3.0 | 329128 |
              4.0 | 152587 |
              5.0 | 340192
              6.0
                   198225
              7.0
                        40
                        18|
              8.0
              9.0
                        241
```

9. Missing Value Check

10. Trip Duration Outliers

ndor	+- ID tpep_pickup	_datetime	tpep_dropoff	datetime pa	assenger_cou	int tr	ip_dista	nce R	atecodeID s	tore_a	and_fwd_flag	PULocati	lonID D0Loca	ationID payme	ent_type fare
						+		- -	+-				ation_min +	+	+
+-	2 2019-02-28					0		+ 1.79	1.0	+-		 	65	61	2
5	0.5 0.5 2 2019-03-01	0.0			0.3	2.0	8.8	 9.35	1.0	0.0		1387.1666 H	566666667 79	79	2
5		0.0			0.3		9.3		1.0	2.5			666666667	, 31	21
	2 2019-03-01					2.0		2.44	1.0			·!	79	246	1
0	0.5 0.5 2 2019-02-28	2.96			0.3	2.01	17.76	 5.23	1.0	2.5	null	1393.4166	666666667 246	255	2
51	0.5 0.5	0.0			0.3		34.3		1.0	2.5	nulli	'1	1437.9	233	۷
	2 2019-02-28		2019-03-01			0		1.33	1.0		N	II .	90	256	1
5	0.5 0.5	4.66			0.3		27.96			2.5			666666666		
e i	2 2019-02-28	22:32:43				.0		9.78	1.0	2 51		1202 5666	162 666666666	233	1
5	0.5 0.5 2 2019-02-28				0.3	.0	10.79	1.5	1.0	2.5	nuccj	1363.3000	244	2441	2
0	0.5 0.5	0.0			0.3		9.3			0.0	null	1387.9666	666666667		
	2 2019-03-01		2019-03-01	23:59:18		.0		5.93	1.0			4	229	65	1
5	0.5 0.5	0.0	0.0		0.3	0.1	34.3		4.01	2.5			666666667	401	41
0	2 2019-02-28 0.5 0.5	3.45	2019-03-01 0.0		0.3	.0	17.25	1.71	1.0	2.5		 1304_0333	229 33333333333	48	1
٧I	2 2019-03-01					.0		3.67	1.0	2.51		I)	138	17	1
0	0.5 0.5	5.26			0.3		31.56			0.0	null	1396.3666	666666666		
	2 2019-03-01					.0		88.6	1.0	0.51			246	68	1
5	0.5 0.5 2 2019-02-28	0.93	0.0 2019-03-01		0.3	2.01	10.23	 5.32	1.0	2.5		1436.1833 H	3333333334 164	13	1
0	0.5 0.5	0.0			0.3		22.8		1.0	2.5			3333333333	13	-1
	2 2019-03-01					2.0		1.03	1.0				166	238	2
0	0.5 0.5	0.0			0.3		7.3			0.0			666666666		
01	2 2019-03-01	00:56:51			0.3	.0	8.8	9.73	1.0	2.5		 1429 1666	230 666666667	186	2
V١	0.5 0.5 2 2019-02-28					.0		 .63	1.0	2.5	naccj		79	142	1
0	0.5 0.5	4.36			0.3		26.16			2.5	null		1403.1		
-17	2-31-70-249 # 09	4	■ 5.67 GB / 7.7	0 GB 🔻 0.0	Mb/e i 0	ns Mh/s	[0] 82	min li	l hadoon 🙉	/- 24%	/emr: 29% /r	nnt: 2306			
П	0.5 0.5	2.23	0.0		0.3		24.53	,		2.5	null		1428.05	•	
	2 2019-02-28		2019-03-01	14:21:29		.0		.23	1.0		Ń		90	61	1
)	0.5 0.5	7.7	0.0	00.00.074	0.3	0.1	38.5	041	4.01	2.5	null	1411.7833	333333333	2441	41
11	2 2019-03-01 0.5 0.5	2.76	2019-03-02 0.0	00:20:07	0.3	.0	16.56	91	1.0	2.5	nulll	1 1411 0833	107 333333333	211	1
٠,	2 2019-03-01		2019-03-02	01:14:15		.0	8	.95	1.0		N. C.C.		145	33	1
	0.5 0.5	0.0	0.0		0.3		32.8			2.5	nullI	1416.6333	333333334		

unt e	'ID tpep_pickup_datetime							-+			
	xtra mta tax tip amount									tionID payme	nt_type far
	:xcrajiiica_caxjcqb_aiiioaircj										+
+-	++							+		471	
.01	2 2019-03-01 00:25:59 0.0 0.5 0.0		01:19:28	2.0	0.8	0 1.	Θ. Θ.(N N N	17 3.48333333333334	17	2
. 61	0.0 0.5 0.0 1 2019-03-01 00:30:11	0.0 2019-03-01 6	00.50.141	0.3 1.0	0.81 0.	01 1.		oj nuttjos		871	21
.01	3.0 0.5 0.0	0.0	00.30.14	0.3	17.8	٠, ١.	2.	51 nulli	79 20.05	0/	2
. • [2 2019-03-01 00:28:33	2019-03-01	00.40.051	4.01	0.	0 1.		NI NI	361	171	11
.51	0.5 0.5 10.0	0.0		0.3	13.8	~!	0.0	ol nulli11	5333333333333333		-1
	2 2019-03-01 21:56:09	2019-03-02	00:04:53	1.0	0.	0 1.		N I	264	264	1
.0	0.0 0.0 0.0	0.0		0.0	0.0		0.0	9 null 12	8.733333333333332		
	1 2019-03-01 01:02:40	2019-03-01	01:24:02	1.0	· 0 .	0 1.	0	. N	79	37	1
.0	3.0 0.5 6.2	0.0		0.3	27.0		2.	5 null 21	36666666666667		
	2 2019-03-01 02:52:36	2019-03-01	93:28:02	1.0	Θ.	0 5.		N	265	265	1
1.0	0.0 0.0 18.86	0.0		0.3	113.16		0.0	9 null 3	5.43333333333333		
	1 2019-03-01 03:05:48	2019-03-01	93:19:23	1.0	0.	0 1.		N I	231	257	1
9.0	3.0 0.5 4.55	0.0		0.3	27.35		2.!		.58333333333334	4401	
	2 2019-03-01 03:59:29	2019-03-01	94:11:19	1.0	0.	0 5.		N N	264	142	1
3.3	0.0 0.5 2.73 2 2019-03-01 03:35:24	0.0 2019-03-01	14.46.201	0.3	11.83	ol E	0.0		83333333333334	2201	4.1
0.01		0.0	94:10:28	1.0 0.0	0. 27.0	0 5.	ا ^ن 2.!	N 	68 1.0666666666667	238	1
,.01	0.0 0.0 4.5 1 2019-03-01 05:56:12	2019-03-01	06.21.541	1.0	27.0	0 1.		5	139	93	1
1.41	0.0 0.5 0.0	0.0	90.21.34	0.3	75.2	٠, ١	0.0		25.7	95	
	1 2019-03-01 05:48:48	2019-03-01	06:21:241	1.0	73.2	0 1.		NI NI	691	971	11
.41	0.0 0.5 0.0	0.0		0.3	71.2		0.0	ol nulli	32.61		-1
	1 2019-03-01 06:54:48	2019-03-01	07:05:28	1.0	0.	0 1.		NI NI	151	74	2
0.5	0.0 0.5 0.0	0.0		0.3	10.3		0.0	9 null 16	.66666666666666		
	1 2019-03-01 06:53:50	2019-03-01 6	08:18:09	1.0	΄Θ.	0 1.	0	Ϋ́Ι	16	14	1
.4	0.0 0.5 0.0	0.0		0.3	75.2		0.0	9 null 8	4.31666666666666		
	2 2019-03-01 06:08:53	2019-03-01	06:36:06	0.0	΄Θ.	0 5.	0	Ň	265	265	1
2.5	0.0 0.5 22.0	0.0		0.3	195.3		0.0	9 null 27	.21666666666665		
	1 2019-03-01 07:19:43	2019-03-01	97:30:38	1.0	Θ.	0 1.		N	43	164	1
9.5	2.5 0.5 2.75	0.0		0.3	16.55		2.!		.91666666666666		
	2 2019-03-01 06:28:52	2019-03-01	07:28:06	1.0	Θ.	0 5.	0	N	186	132	1

```
0.0|
2019-03-01 07:30:38|
0.0|
2019-03-01 07:28:06|
0.0|
2019-03-01 08:26:39|
0.0|
2019-03-01 08:47:36|
0.0|
2019-03-01 09:59:10|
5.76|
2019-03-01 08:19:31|
0.0|
1] 2019-03-01 07:19:43]
2.5] 0.5] 2.75]
0.6] 2.75]
0.9] 0.9] 19:052
0.9] 0.0] 19:055
0.0] 0.5] 0.0]
2] 2019-03-01 07:08:153
0.0] 0.5] 0.0]
2] 2019-03-01 08:49:49
0.0] 0.5] 0.0]
2] 2019-03-01 07:57:44
0.0] -0.5] 0.0]
                                                                                                                 0.3|
                                                                                                                                                                                                                  N| 43|
null|10.9166666666666666|
                                                                                                                                        82.55|
                                                                                                                                                                                                                 N| 186|
null|59.23333333333334|
                                                                                                                                                                                                                                                                             132
                                                                                                                           1.0|
                                                                                                                                           75.2
                                                                                                                 0.3
                                                                                                                                            5.8
                                                                                                                 0.3| 1.0|
                                                                                                                                                                                                                               75|
32.3666666666667|
                                                                                                                                                                                                                 null
                                                                                                                                                                                                                                                   72|
69.5|
                                                                                                                                          76.96|
0.0|
                                                                                                                                                                                                                                                                              244
                                                                                                               -0.3| -3.3| 0.0| 0.0|
```

6. Example - Trip Duration Calculation

7. Convert to Pandas for Plotting (optional)

8. Save Cleaned/Analyzed Data to S3 (optional)