



# Work with pandas-like DataFrames in Apache Beam

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# The Beam DataFrame API...

... is a [pandas](#)-compatible API for building Beam pipelines.

... is a **deferred** API.

... is easier to use and more performant than Beam Python.



```
import pandas as pd
```

```
df = pd.read_csv('data.csv')  
agg = df.foo.groupby(df.bar).sum()  
agg.to_csv('result.csv')
```



```
from apache_beam.dataframe.io import read_csv
```

```
with beam.Pipeline() as p:  
    bdf = p | read_csv('gs://all-the/data/*.csv')  
    agg = bdf.foo.groupby(bdf.bar).sum()  
    agg.to_csv('gs://all-the/results/result.csv')
```

Live Demo!

What happens when I `run()`  
a DataFrame pipeline?

# Execution with pandas DataFrames

```
df = pd.read_csv(...)
```



	pickup_hour	passenger_count
0	15	1
1	23	1
2	7	2
...	...	...

```
df.passenger_count.groupby(df.pickup_hour).sum()
```



	passenger_count
pickup_hour	
0	28630
1	32778
...	...
22	11460
23	14822

# Execution with beam DataFrames

```
bdf = p | beam.dataframe.io.read_csv(...)
```



	pickup_hour	passenger_count
...	...	...

```
bdf.passenger_count.groupby(bdf.pickup_hour).sum()
```

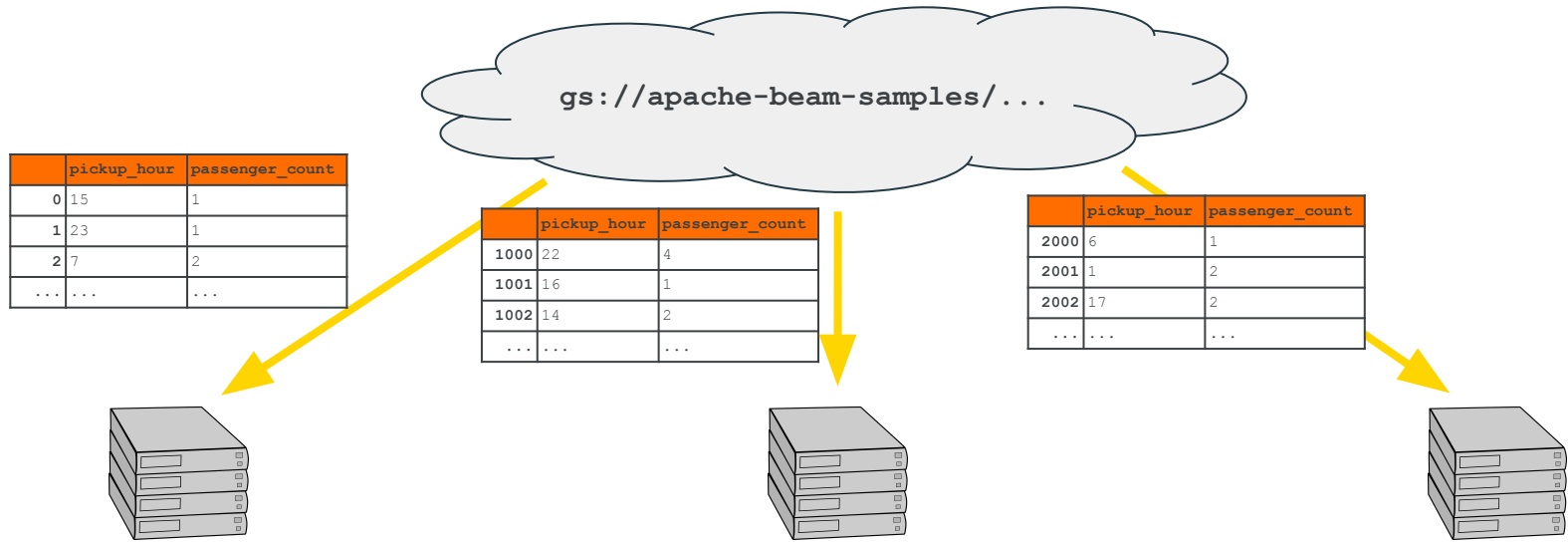


	passenger_count
pickup_hour	
...	...

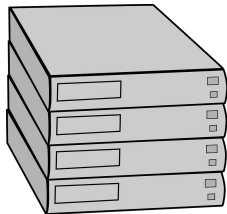
```
p.run()
```



Then what??







```
df = pd.read_csv(...)
```



	pickup_hour	passenger_count
1000	22	4
1001	16	1
1002	14	2
...	...	...

```
df.passenger_count.groupby(df.pickup_hour).sum()
```

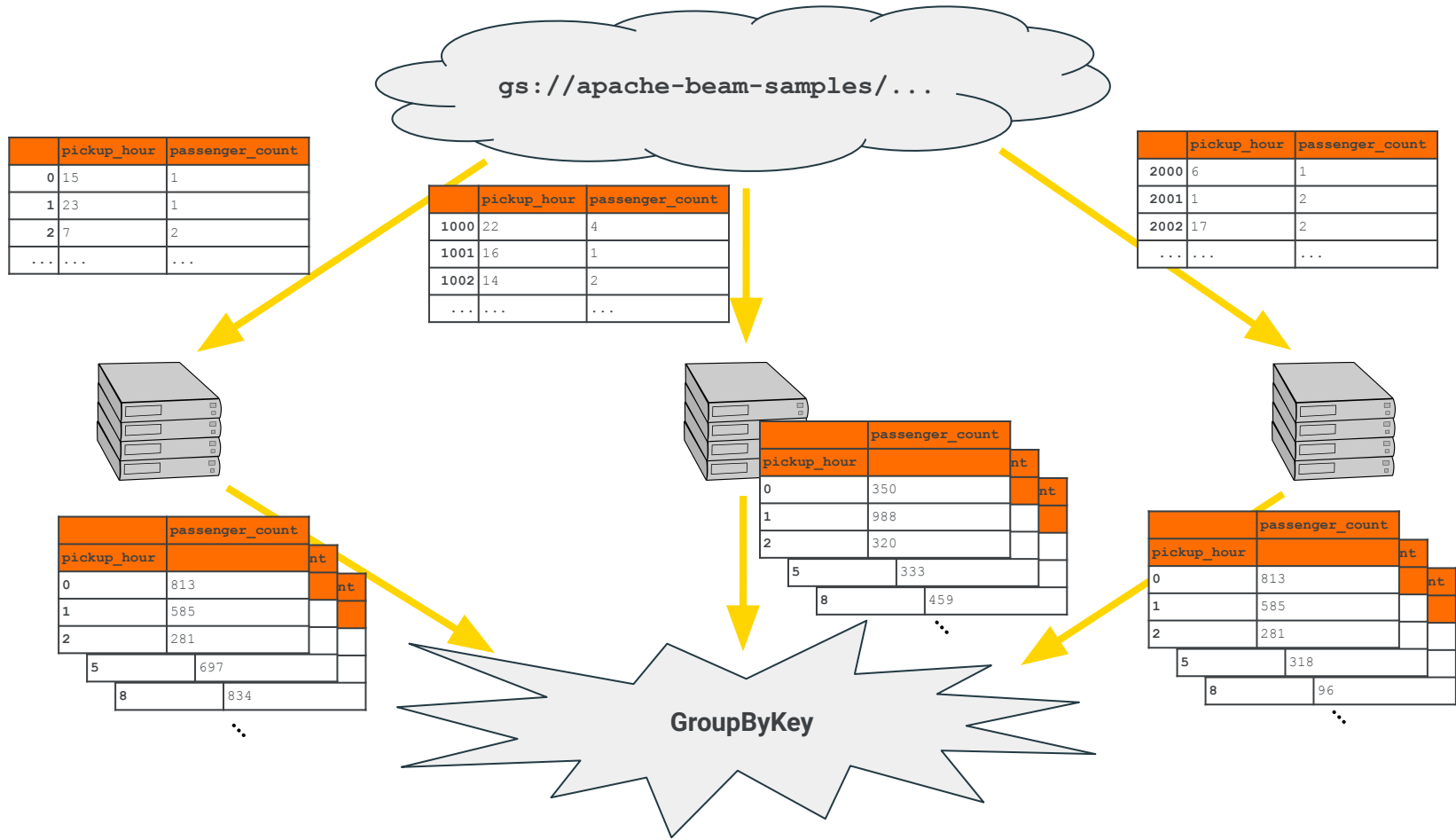


	passenger_count
pickup_hour	
0	813
1	585
...	...
22	818
23	612

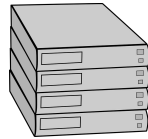
Partition the intermediate result



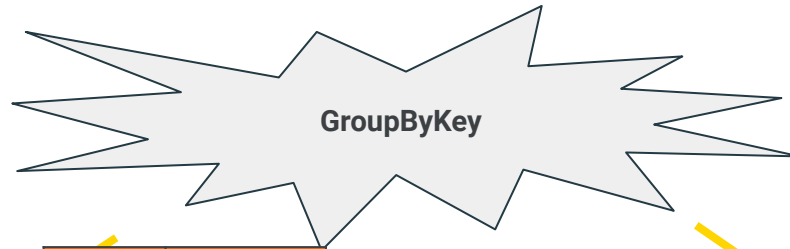
	passenger_count	
pickup_hour		
0	813	unt
1	585	unt
2	281	unt
...	...	...
5	697	unt
...	...	...
8	834	unt
...	...	...



passenger_count	
pickup_hour	
0	813
1	585
2	281



passenger_count	
pickup_hour	
0	9326
1	1808
2	5681

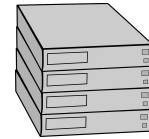


passenger_count	
pickup_hour	
3	591
4	573
5	697



passenger_count	
pickup_hour	
3	6109
4	9233
5	6064

passenger_count	
pickup_hour	
6	813
7	585
8	834



passenger_count	
pickup_hour	
6	9437
7	6007
8	9041



# Key Takeaways

- Unlike pandas DataFrames, computation on Beam DataFrames is **distributed**.
- Beam DataFrames use **efficient pandas code** on the workers, just inserting **GroupByKey** where necessary.

# Want to learn more?

- [Beam DataFrame API Documentation](#)
- Example pipelines: [apache\\_beam.examples.dataframe](#)
- More details about internals:
  - [Design doc](#)
  - [Simpler Python Pipelines - Beam Summit 2020](#)
  - [Scaling up pandas with the Beam DataFrame API - Beam Summit 2022](#)  
(coming soon)

# Thank you!

