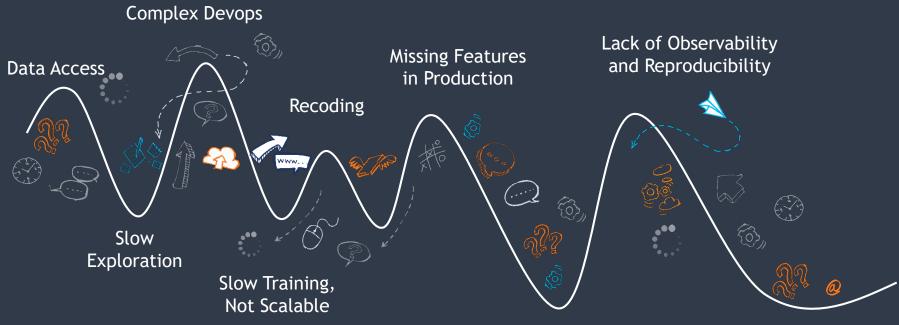


Delivering GPU as a Service

Yaron Haviv, CTO, Iguazio

One Year From Data Science in Production

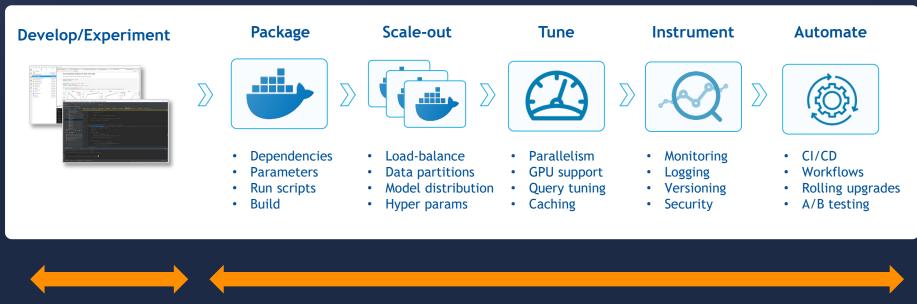


Slow Response Time



Code/Model Development Is Just The FIRST Step

Every piece of code, data science algorithm, or data processing task must be built for production



Weeks with one data scientist

Months with a large team of developers, scientists, data engineers and DevOps



GPUs Accelerate Many Data-Science Workload

cudf

In [7]: %%timeit

```
# Read file
gdf = cudf.read_json(benchmark_file, lines=True)
```

```
# Get N Largest (From original df)
raw_nlargest = gdf.nlargest(nlargest, 'cpu_utilization')
```

1.44 s ± 23.1 ms per loop (mean ± std. dev. of 7 runs, 1 loop each)

Pandas

```
In [8]: %%timeit
```

```
# Read file
pdf = pd.read_json(benchmark_file, lines=True)
```

```
# Get N Largest (From original df)
raw_nlargest = pdf.nlargest(nlargest, 'cpu_utilization')
```

```
43.4 s ± 627 ms per loop (mean ± std. dev. of 7 runs, 1 loop each)
```

30x faster data analytics

BUT we don't want to pay for their idle time



See: https://towardsdatascience.com/python-pandasat-extreme-performance-912912b1047c



Building a Cloud-Native Data Science and ML Platform



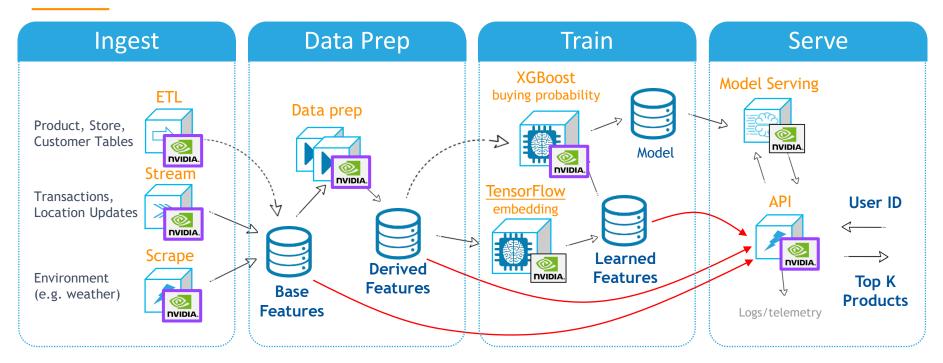
Automation and user facing portals/APIs

Managed Services

Shared GPU/CPU resources

Features (Online, offline) and raw data

Pipeline Example: Real-time Product Recommendations



Elastic functions + GPUs = Performance, Scale, Simplicity



- ML Functions



- Feature/Model Store

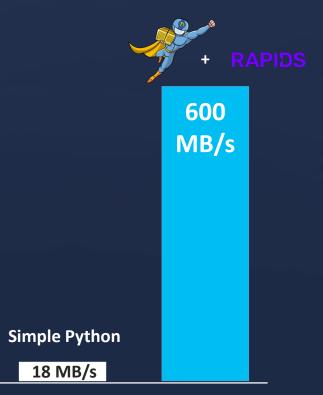




Using Nuclio + GPU to Accelerate ETL and Streaming

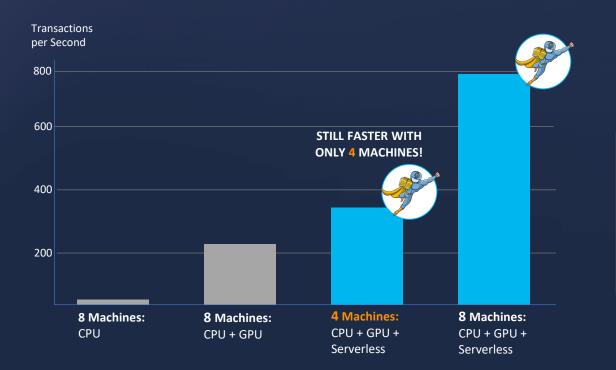
Simple code! Automated DevOps ! Any Source! (e.g. read JSON Stream + aggregate + dump to Parquet)

```
def init context(context):
   os.makedirs(sink, exist ok=True)
def handler(context, event):
   add log to batch(context, event.body)
   if len(batch) > batch len:
        df = batch to df(context)
       if not df.empty:
            df = df.groupby(['log ip']).agg({'feconn':'mean',
                                                     'beconn':'mean',
                                                     'time backend response':'max'.
                                                     'time backend response':'mean',
                                                     'time queue':'mean',
                                                     'time duration': 'mean',
                                                     'time request': 'mean',
                                                     'time_backend_connect':'mean'
                                                    })
        df_to_parquet(df)
        reset batch()
```



https://github.com/nuclio

Using Nuclio for Real-time Model Serving



Single command from notebook to function

<pre>% ************************************</pre>	
<pre>With the section of the section</pre>	# If the multip-jupyter package to not installed run (pip Install nuclio-jupyter
<pre>statistics additional tables additional tab</pre>	Institutes in FileAmerican and an an and an an an and an
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Introducing Nuclio ML Functions and MLRun

Access from your notebook, IDE, or KubeFlow







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New York Connect (

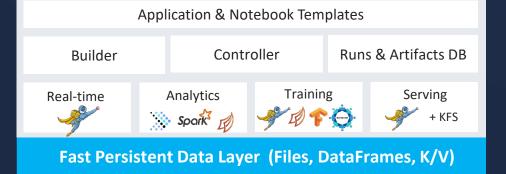


Built-in Artifacts & Runs Tracking

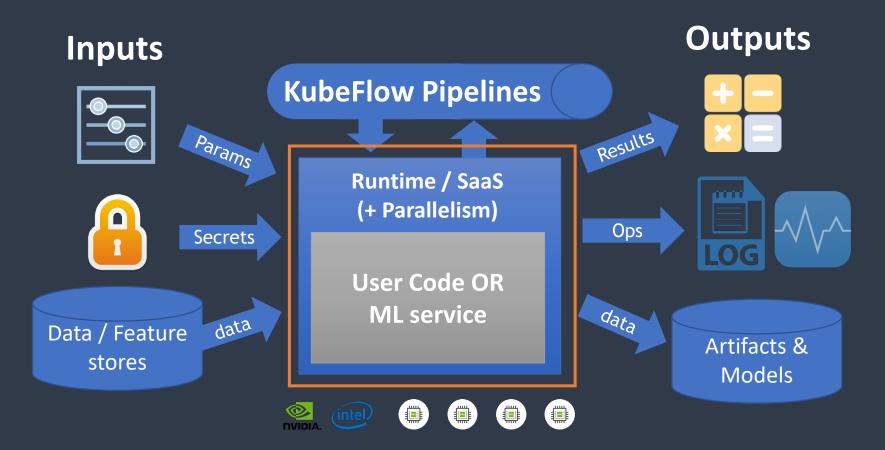
Elastic Scaling of CPUs & GPUs

Common APIs & Automation

Multiple Engines

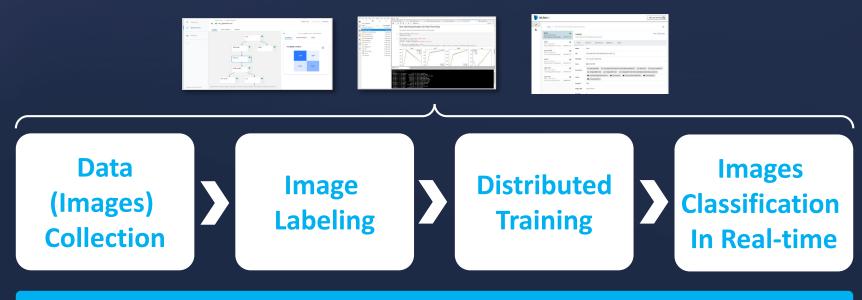






ML & Analytics Functions Architecture

Demo: Fast and Dynamically Scaling ML Pipeline



Real-time Data Fabric



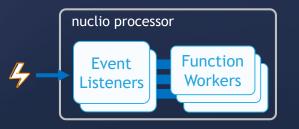


Thank You

yaronh@iguazio.com, @yaronhaviv

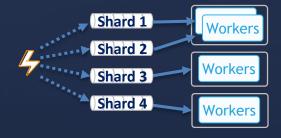
Nuclio: Taking Serverless to Data Intensive Apps

Extreme Performance



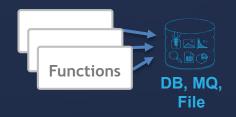
- Non-blocking, parallel
- Zero copy, buffer reuse
- Up to 400K events/sec/proc
- **GPU** optimizations

Advanced Data & Al Features



- Auto-rebalance, checkpoints
- Any source: Kafka, NATS, Kinesis, event-hub, iguazio, pub/sub, RabbitMQ, Cron, ...
- NVIDIA Rapids integration

Statefulness



- Data bindings
- Shared volumes
- Context cache



Natively integrated with KubeFlow and Jupyter Notebooks

