



Collaboration, Innovation and Resilience: Championing a Digital Generation

Brisbane, Australia 6-10 April

Uniting Data Science and GIS: Spatial Analysis with Databricks & ArcGIS

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PLATINUM SPONSORS

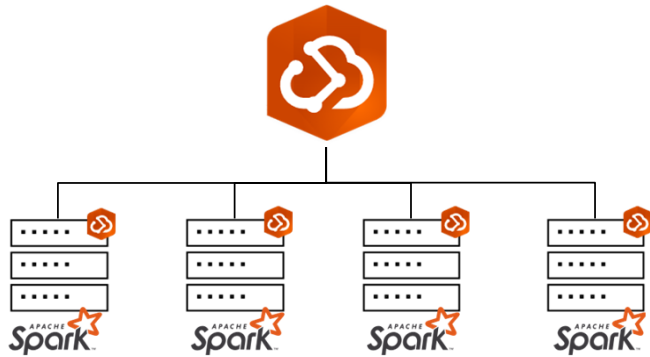




- Advanced Spatial Analytics in Databricks
- Use cases & examples
- Surfacing results from Databricks into GIS

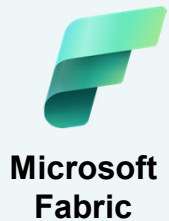


ArcGIS GeoAnalytics Engine



- Spark native library that extends dataframes with spatial processing and analytics
- Over 200 spatial Functions & Tools
- Analyse data from data lakes, warehouses as well as ArcGIS systems

Supported Environments



Azure
Synapse
Analytics



Amazon EMR



Google Cloud
Dataproc



databricks



Your own
Cluster

Data Sources

DATA FORMATS & SYSTEMS SUPPORTED BY SPARK

Generic Files

- CSV file
- Hive table
- JSON file
- Parquet file
- XML file
- Zip file
- ORC files

Data Lakes & Databases

- Amazon S3
- Azure Blob Storage
- Azure Data Lake Storage
- Azure Cosmos DB
- Cassandra
- Couchbase
- Elasticsearch
- Google Cloud Storage
- MongoDB
- Neo4j
- Oracle
- Redis
- Riak Time Series
- SQL databases using JDBC
- Hadoop HDFS

Data Warehouses

- Amazon Redshift
- Azure Synapse Analytics
- Google BigQuery
- Snowflake

ADDS SUPPORT FOR:

Spatial Formats

- Shapefile (Read/Write)
- Feature Service (Read/Write)
- File GeoDatabase (Read)
- Vector Tiles (Write)
- GeoJSON (Read/Write)
- GeoParquet (Read/Write)
- *Use ArcGIS API for Python to write into additional spatial formats.*

Spatial Functions

CONSTRUCTORS

- ST_AsBinary
- ST_AsText
- ST_AsGeoJSON
- ST_AsEsriJSON
- ST_AsShape
- ST_GeomFromBinary
- ST_GeomFromText
- ST_GeomFromGeoJSON
- ST_GeomFromEsriJSON
- ST_GeomFromShape
- ST_PointFromBinary
- ST_PointFromText
- ST_PointFromGeoJSON
- ST_PointFromShape
- ST_MPointFromBinary
- ST_MPointFromText
- ST_MPointFromEsriJSON
- ST_MPointFromGeoJSON
- ST_MPointFromShape
- ST_LineFromBinary
- ST_LineFromText
- ST_LineFromEsriJSON
- ST_LineFromGeoJSON
- ST_LineFromShape
- ST_PolyFromBinary
- ST_PolyFromText
- ST_PolyFromEsriJSON
- ST_PolyFromGeoJSON
- ST_PolyFromShape
- ST_Point
- ST_MultiPoint
- ST_LineString
- ST_MultiLineString
- ST_Polygon
- ST_MultiPolygon

ACCESSORS

- ST_GeometryType
- ST_Area
- ST_Azimuth
- ST_GeodesicArea
- ST_Centroid
- ST_PointOnSurface
- ST_CoordDim
- ST_Dimension
- ST_Distance
- ST_GeodesicDistance
- ST_GeodesicLength
- ST_GeometryN
- ST_Is3D
- ST_IsClosed
- ST_IsEmpty
- ST_IsMeasured
- ST_Length
- ST_GeodesicLength
- ST_MaxM
- ST_MaxX
- ST_MaxY
- ST_MaxZ
- ST_MinM
- ST_MinX
- ST_MinY
- ST_MinZ
- ST_NumGeometries
- ST_NumInteriorRings
- ST_NumPoints
- ST_PointN
- ST_IsRing
- ST_SRID
- ST_StartPoint
- ST_EndPoint
- ST_X, ST_Y, ST_Z, ST_M

OPERATIONS

- ST_Aggr_ConvexHull
- ST_Aggr_Intersection
- ST_Aggr_Linestring
- ST_Aggr_Union
- ST_Aggr_MeanCenter
- ST_Aggr_StdevEllipse
- ST_Bbox_Intersects
- ST_Boundary
- ST_Buffer
- ST_GeodesicBuffer
- ST_Cast
- ST_Centerline
- ST_ClosestPoint
- ST_ConvexHull
- ST_Densify
- ST_Difference
- ST_Envelope
- ST_ExteriorRing
- ST_Flip
- ST_InteriorRingN
- ST_Rotate
- ST_Scale
- ST_Shear
- ST_Split
- ST_SymDifference
- ST_Union
- ST_Segmentize
- ST_Segments
- ST_ShortestLine
- ST_Points
- ST_Geometries
- ST_Generalize
- ST_Simplify
- ST_Transform
- ST_Translate

RELATIONSHIP TESTS

- ST_Contains
- ST_Crosses
- ST_Disjoint
- ST_EnvIntersect
- ST_Equals
- ST_Intersects
- ST_Overlaps
- ST_Relate
- ST_Touches
- ST_Within
- ST_DWithin

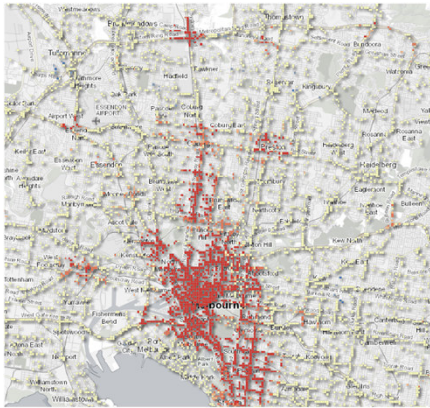
BINNING

- ST_SquareBin
- ST_SquareBins
- ST_BinGeometry
- ST_BinCenter
- ST_HexBin
- ST_HexBins
- ST_H3Bin
- ST_H3Bins
- ST_BinId

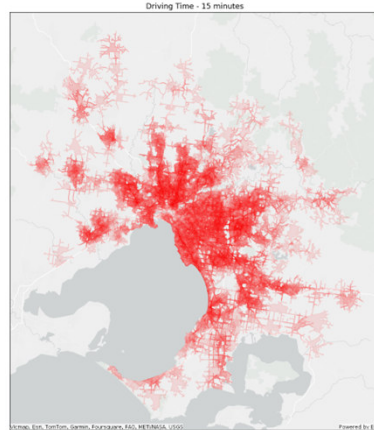
TRACK FUNCTIONS

- TRK_After
- TRK_Aggr_CreateTrack
- TRK_Before
- TRK_Between
- TRK_DistanceAlong
- TRK_Duration
- TRK_DurationAlong
- TRK_EndTimestamp
- TRK_IsValid
- TRK_LCSS
- TRK_Length
- TRK_Query
- TRK_Speed
- TRK_SplitByDistance
- TRK_SplitByDistanceGap
- TRK_SplitByDuration
- TRK_SplitByTimeGap
- Trk_StartTimestamp

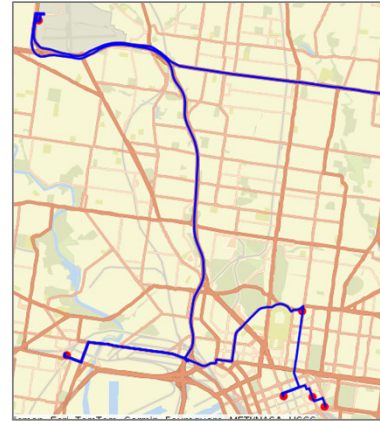
Spatial Analysis Tools



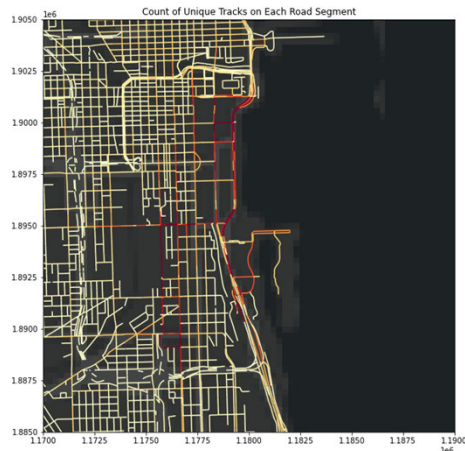
Hotspot analysis of crash data



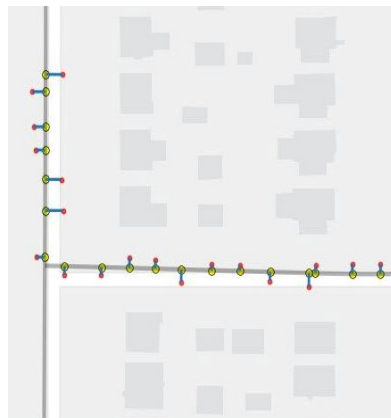
Walk & Drive times to schools



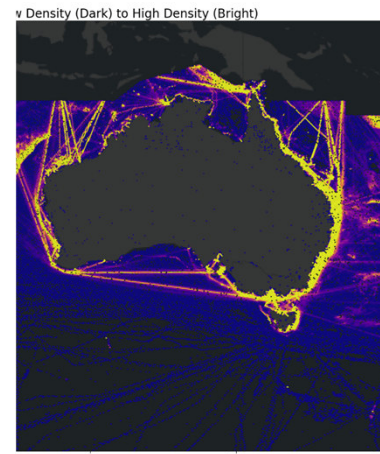
Route optimisation



Counting trips across segments



Snapping GPS data to roads



Time-stepped aggregations

- Aggregate Points
- Calculate density
- Calculate field
- Calculate motion statistics
- Clip Layer
- Create routes
- Create service areas
- Detect incidents
- Find closest facilities
- Find dwell locations
- Find hot spots
- Find point clusters
- Find similar locations
- Generate OD matrix
- Geocode
- Geographically weighted regression
- Group by proximity
- Nearest neighbors
- Overlay
- Reconstruct tracks
- Reverse geocode
- Snap tracks
- Spatiotemporal join
- Summarize within
- Trace proximity events

Compute

Simon Jackson's Cluster



Terminate

Edit

Configuration Notebooks (0) Libraries Event log Spark UI Driver logs Metrics Apps Spark compute UI - Master

Policy

Unrestricted

Multi node Single node

Access mode Single user or group access

Single user Simon Jackson

Performance

Databricks Runtime Version

14.3 LTS (includes Apache Spark 3.5.0, Scala 2.12)

Use Photon Acceleration

Node type

Standard_D8ads_v5 32 GB Memory, 8 Cores

Terminate after 23 minutes of inactivity

Tags

No custom tags

> Automatically added tags

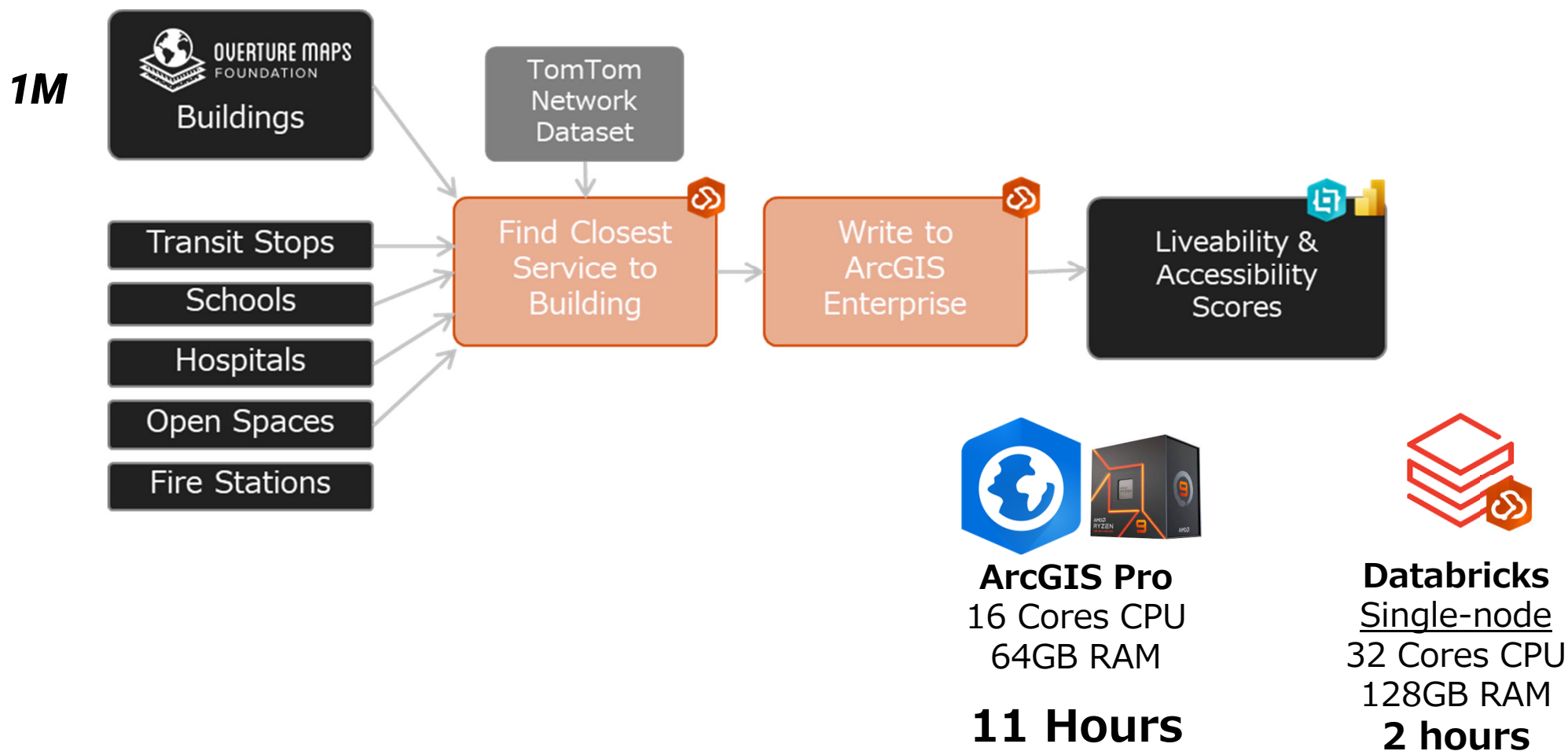
Advanced options

Summary

1 Driver 32 GB Memory, 8 Cores
Runtime 14.3.x-scala2.12
Photon Standard_D8ads_v5 4 DBU/h

How accessible are transit stops in Greater Sydney?

ArcGIS brings scalable spatial analytics into Databricks



Detecting speeding incidents from VPS Data



Roads &
Transport Data

Vehicle
Movement
Feeds

10M
Records

Match vehicle
traces to roads

Enrich with
speed limits

Detect
speeding
vehicles



Driver
characteristics &
speeding
behaviour report

Detecting speeding incidents from VPS Data

*Speed &
location from
Vehicle Sensor*



*Speed limit
data*



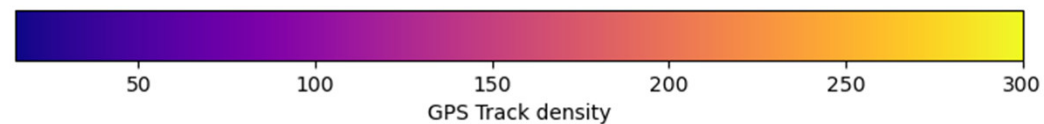
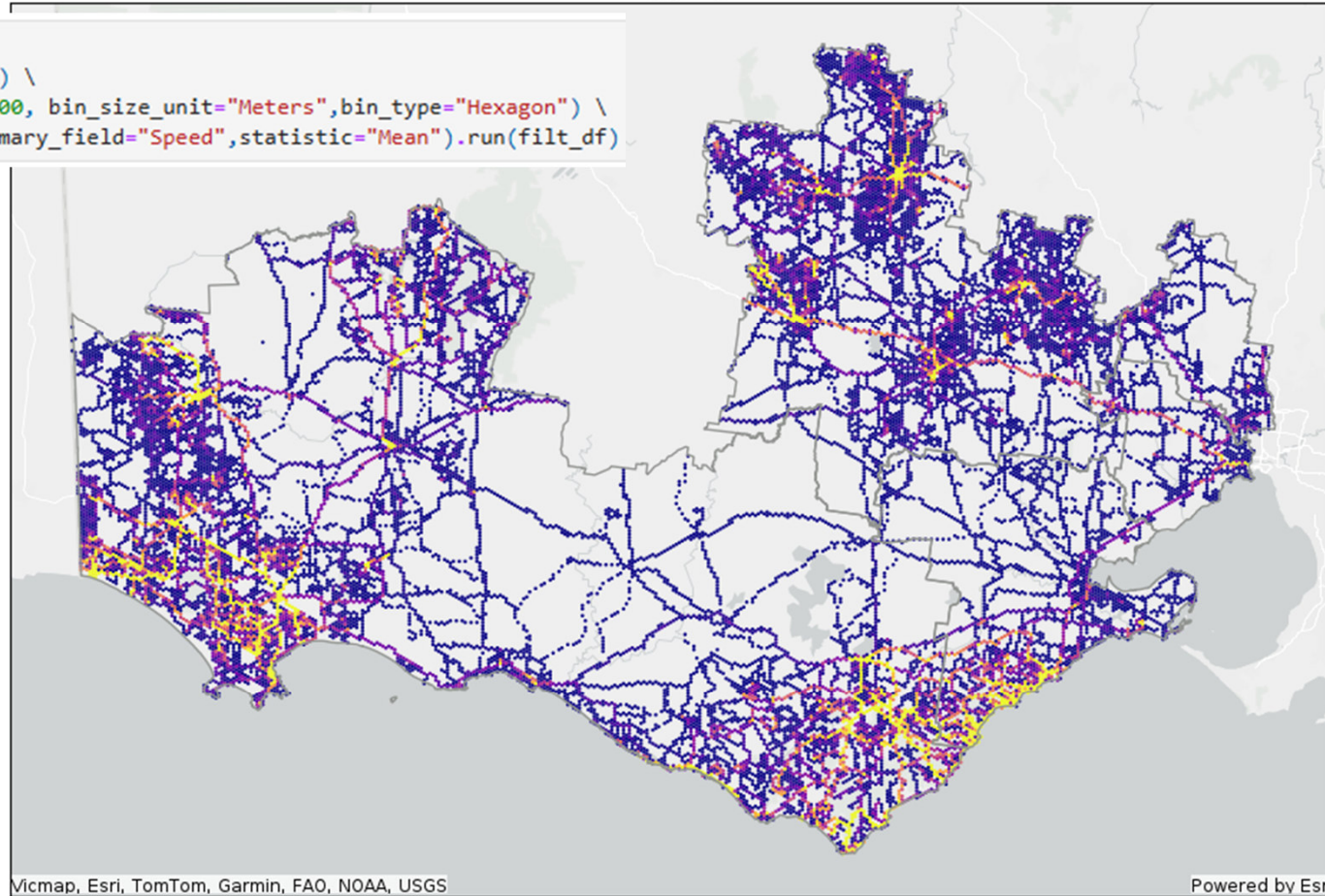
Incident?



Detecting speeding incidents from VPS Data

Vehicle movements - 1km aggregation in VicGrid GDA2020

```
# Aggregate data into bins
result_bins = AggregatePoints() \
    .setBins(bin_size=1000, bin_size_unit="Meters", bin_type="Hexagon") \
    .addSummaryField(summary_field="Speed", statistic="Mean").run(filt_df)
```

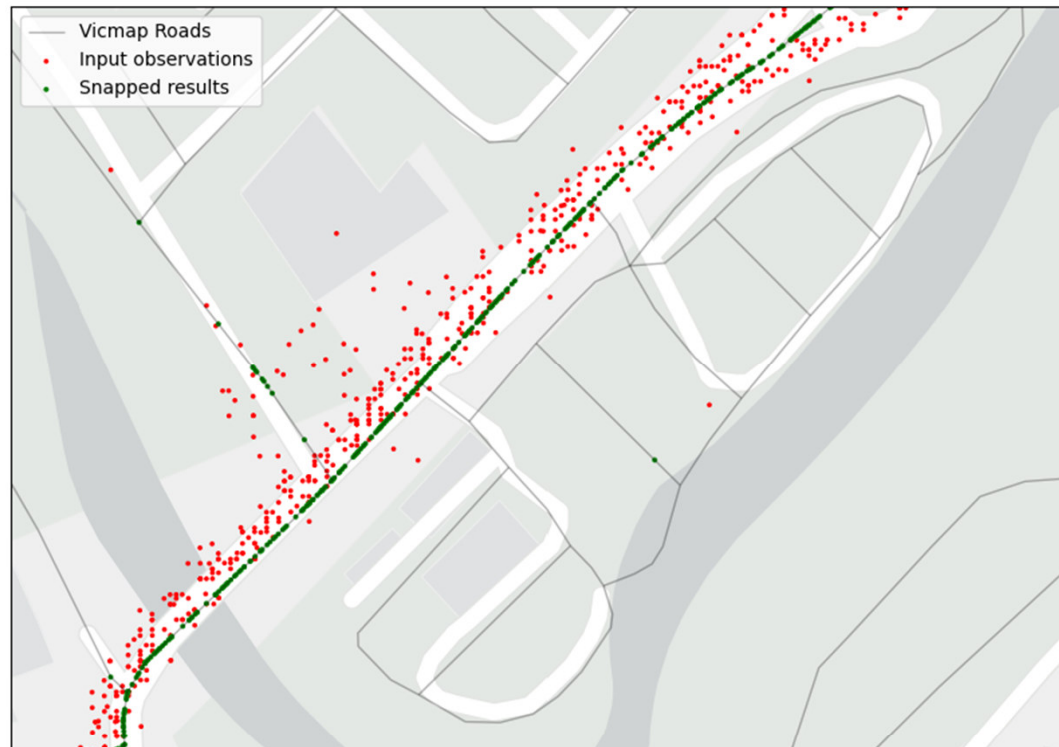


Detecting speeding incidents from VPS Data

Map Matching



- *Uses direction attributes*
- *Cleanses data*
- *Removes GPS Drift*



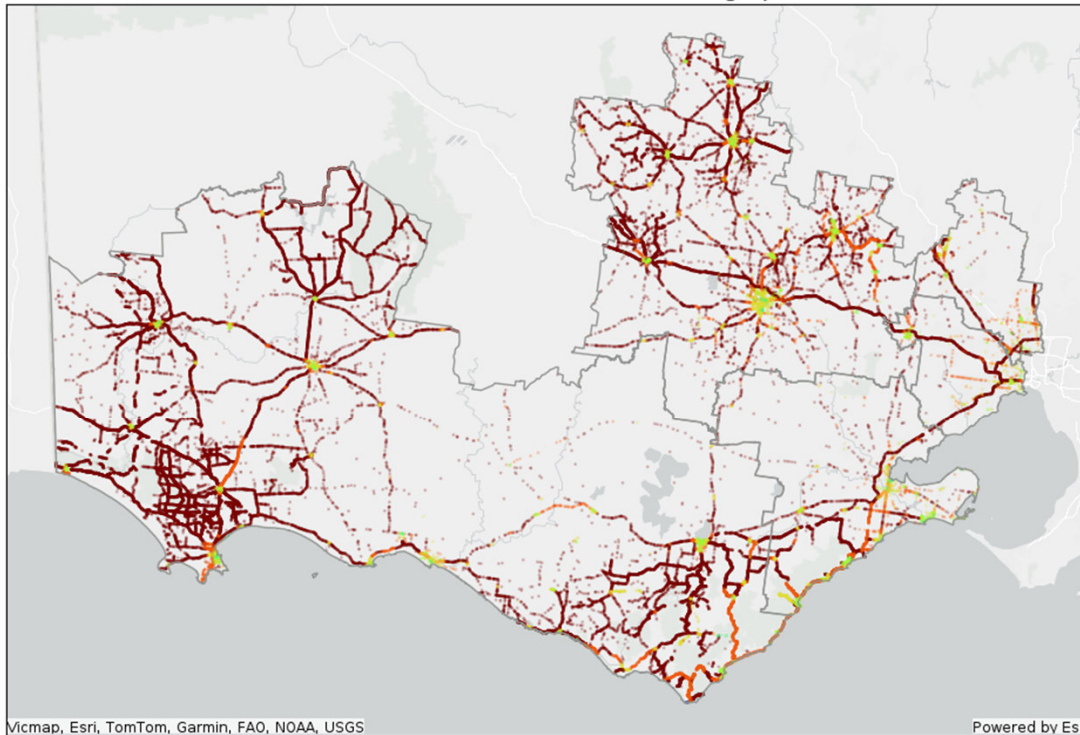
Snap tracks using the device ID as the track identifier and snap within 100 meters

```
vps_snap = SnapTracks() \  
    .setTrackFields("Designator") \  
    .setSearchDistance(search_distance=50, search_distance_unit="Meters") \  
    .setDistanceMethod(distance_method="Planar") \  
    .setConnectivityFields(from_node="from_ufi", to_node="to_ufi") \  
    .setDirectionFieldMatching(direction_field="direction_code", forward_value="F", backward_value="R", both_value="B") \  
    .setOutputMode(output_mode="MatchedPoints") \  
    .run(filt_df, vmt_df)
```

Detecting speeding incidents from VPS Data

Enrich Vehicle Positioning points with road speed limits

Vehicle Position data enriched with intersecting speed zones data



Enrich Vehicle Position data with underlying Speed Limit from roads

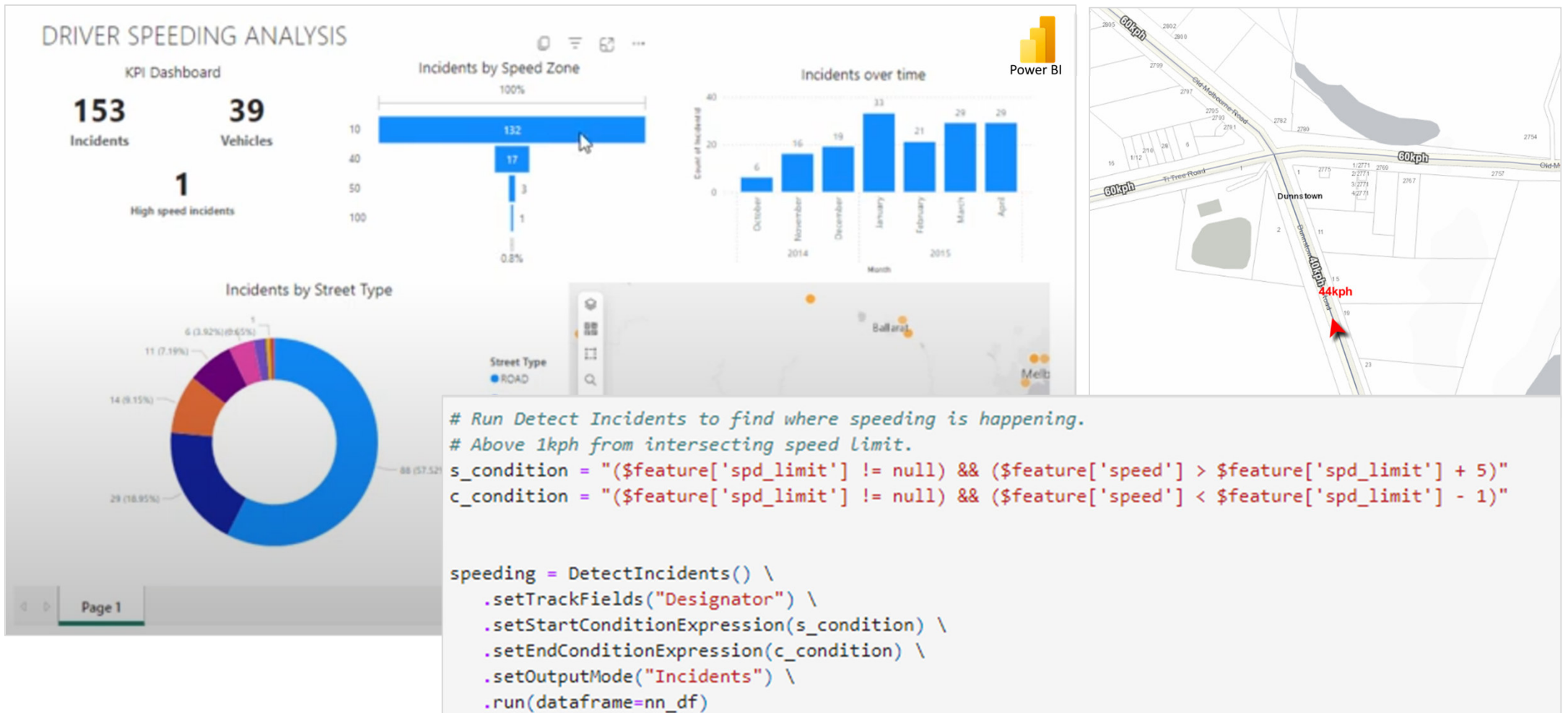
```
# Get Geoscape Roads from Digital Atlas Australia
gs_url = "https://services-ap1.arcgis.com/ypkPEy1AmwPKGNv/arcgis/rest/services/NationalRoadNetwork/FeatureServer/0"
gs_df = spark.read.format("feature-service").load(gs_url)\
    .filter("state == 'VIC'")\
    .withColumn("shape", ST.transform("shape", 7899)) # Transform to VicGrid GDA2020
gs_df = gs_df.withColumnRenamed("speed", "spd_limit")
```

StatementMeta(, 954eb665-5cd0-447b-89da-a6f4e53a9adc, 81, Finished, Available, Finished)

```
# Use nearest neighbour tool to enrich movement data with the nearest roads speed zone
nn_df = NearestNeighbors()\
    .setNumNeighbors(1)\
    .setSearchDistance(5, "Meters")\
    .setResultLayout("long")\
    .run(vps_snap, gs_df)
```

Detecting speeding incidents from Victorian Government VPS Data

Speeding Incidents with an Incident Detector



Wealth of use cases for Spatial Analytics in Databricks

PREDICTIVE MAINTENANCE

Predict where
issues will occur
with your assets

MINING

Fuel consumption
monitoring
across sites,
outlier analysis

WATER UTILITY

Work Order
Optimisation -
proximity based
clustering &
efficient routing

RAIL

High level reporting
of assets and
incidents using
linear measure
values

LAW

ENFORCEMENT

Identify patterns
in call histories.

INSURANCE

Calculating
exposure to cyclone
risk / Flood risk
modelling

ELECTRIC UTILITY

Demand
forecasting from
smart meter &
weather data

FINANCE

Fraud detection in transactions.

Incident detection
using spatiotemporal
joins

LOGISTICS EFFICIENCY

Identifying where
problems are in
supply chain

HEALTH & PARTNERS

Processing human
movement data for
scenario modelling