



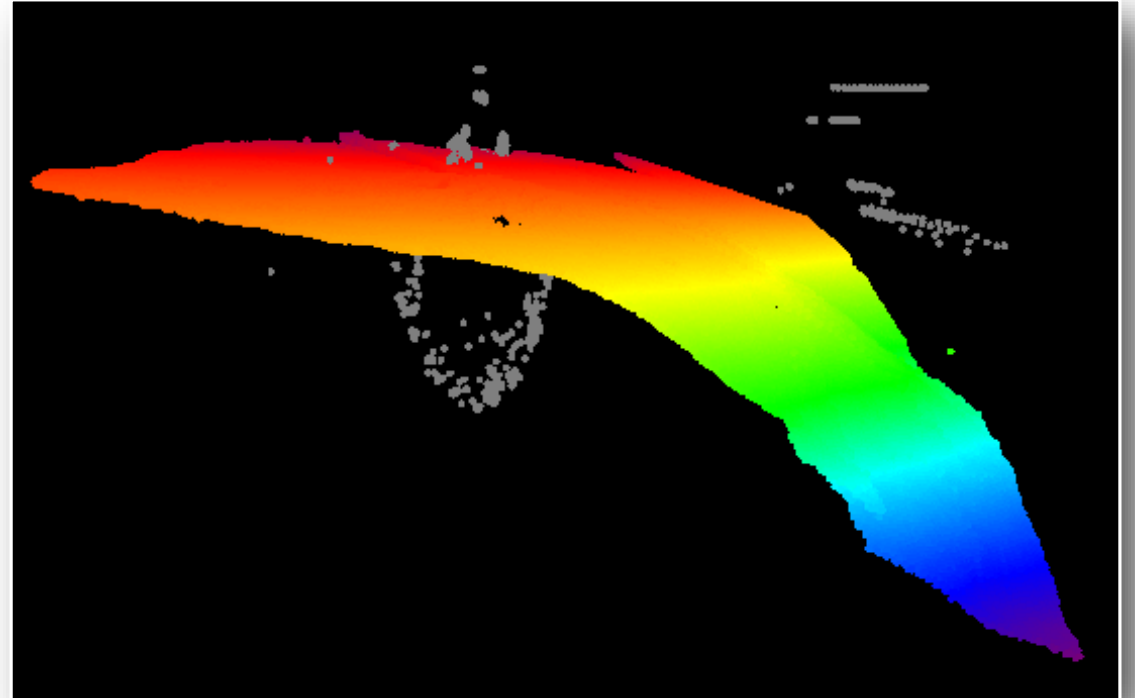
Machine Learning for Bathymetric Processing

By Andy Hoggarth

Sonar Noise

Types of noise:

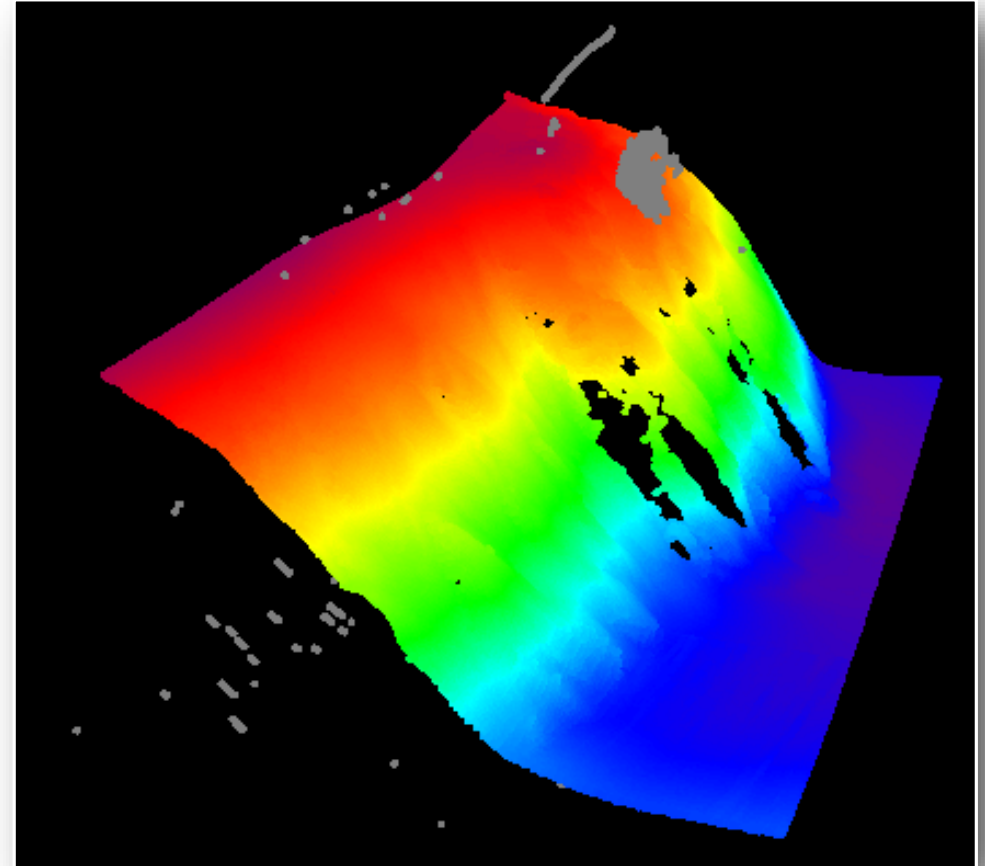
- Cavitation/bubble sweep
- Loss of bottom on outer beams
- Loss of bottom lock
- False returns from the water column



Data Cleaning

Time Consuming and labour-intensive

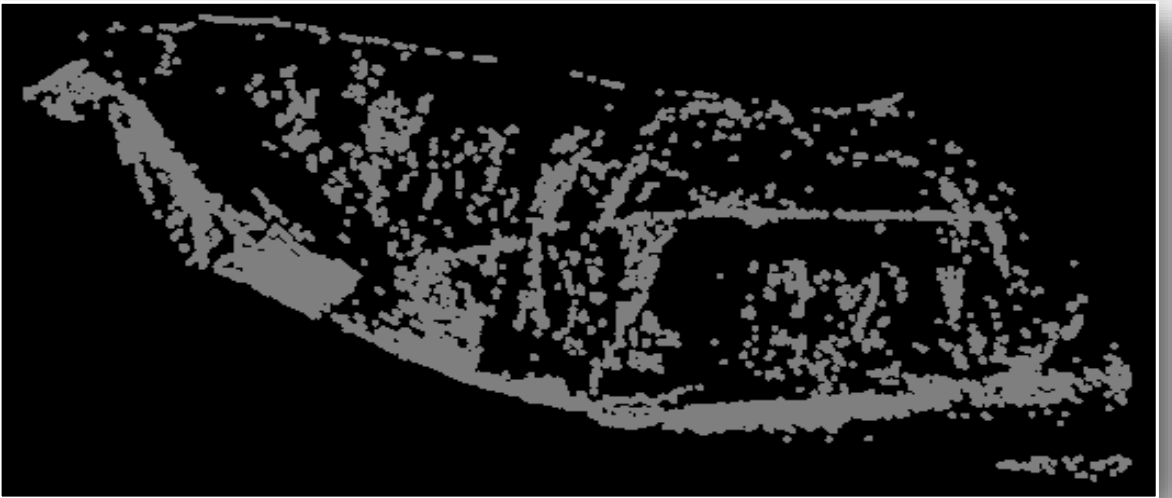
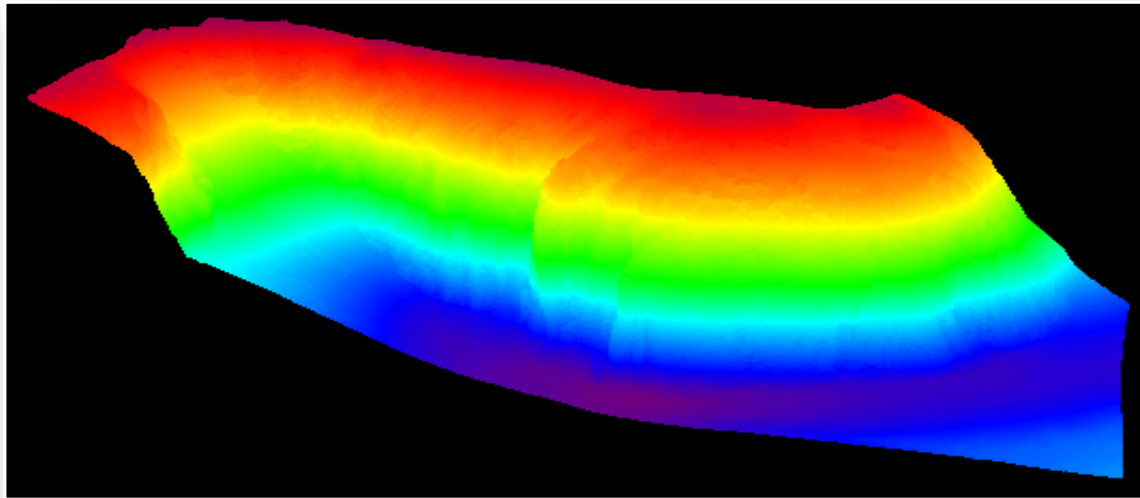
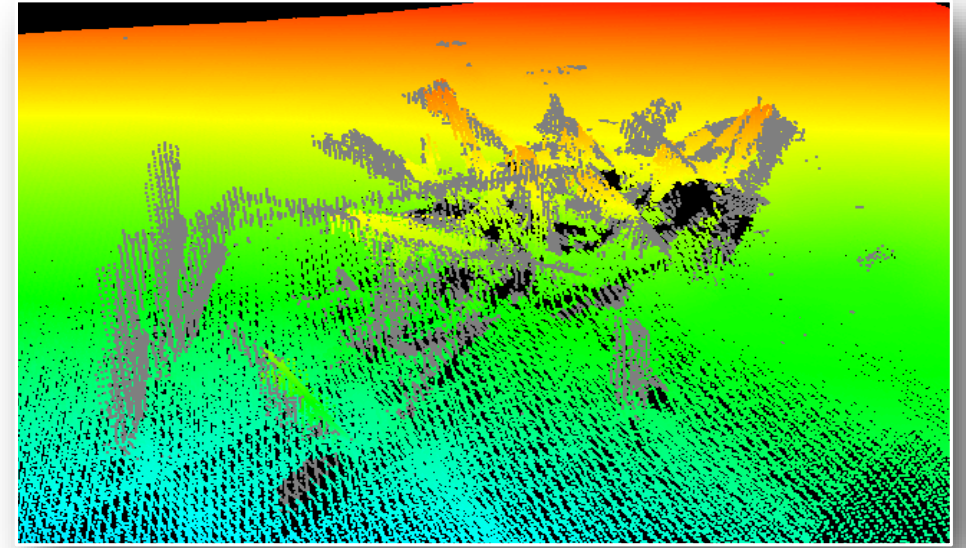
- Current methods:
 - Manual (dot-killing)
 - Simple filters
 - Statistical filters
 - Terrain model binning and filtering



Processing Challenges

Regardless of method or filter type

- Complex features
- And steep slopes
are problematic....



Machine Learning for Bathy

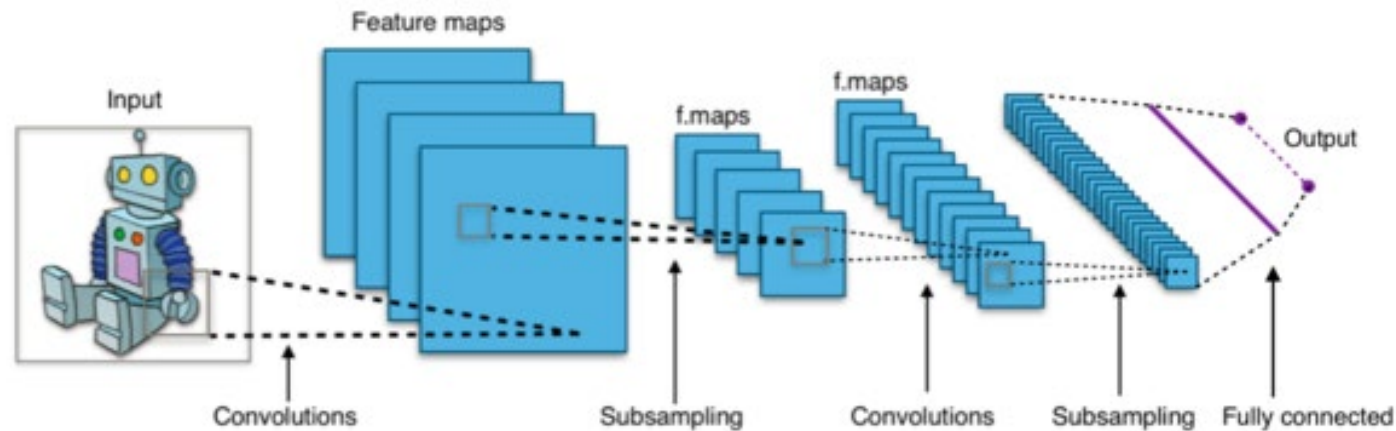


- Machine Learning is Good at:
 - Pattern recognition
 - Prediction
- Requires an extensive library of training data (feature maps)
 - Different data examples
 - Training the algorithm is intensive and requires heavy duty hardware
 - Using the algorithm is not as intensive
 - Cloud based GPU processing is efficient
 - Local PC or Server processing is possible if GPU requirements can be met

- *NVIDIA Titan RTX GPU for training the algorithm*
- *AWS cloud GPU service for day-to-day processing*

Convolutional Neural Networks (CNN)

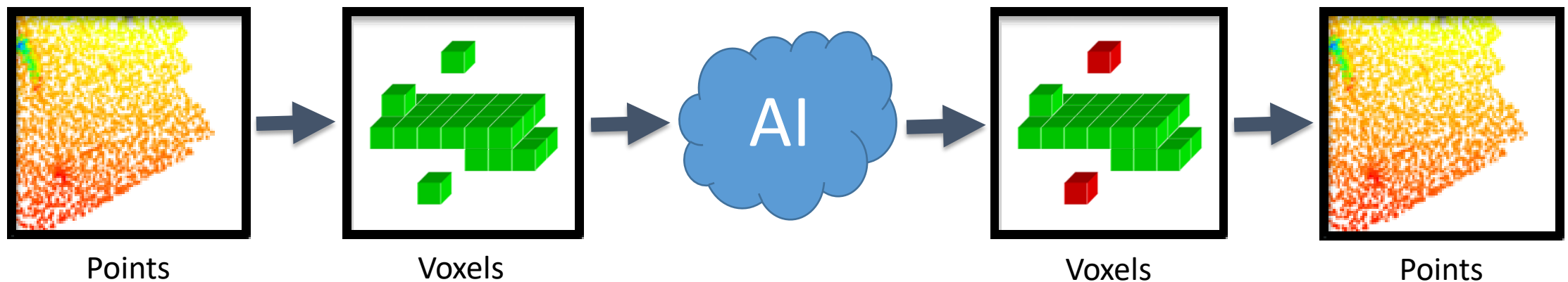
- CNN is very popular and many libraries are available



- Little published work on 3D point clouds
 - Teledyne CARIS is pioneering a **3DCNN** for classifying Sonar Noise and more...
 - Could it help MAP THE GAPS?

Sonar Noise Classification Workflow in HIPS

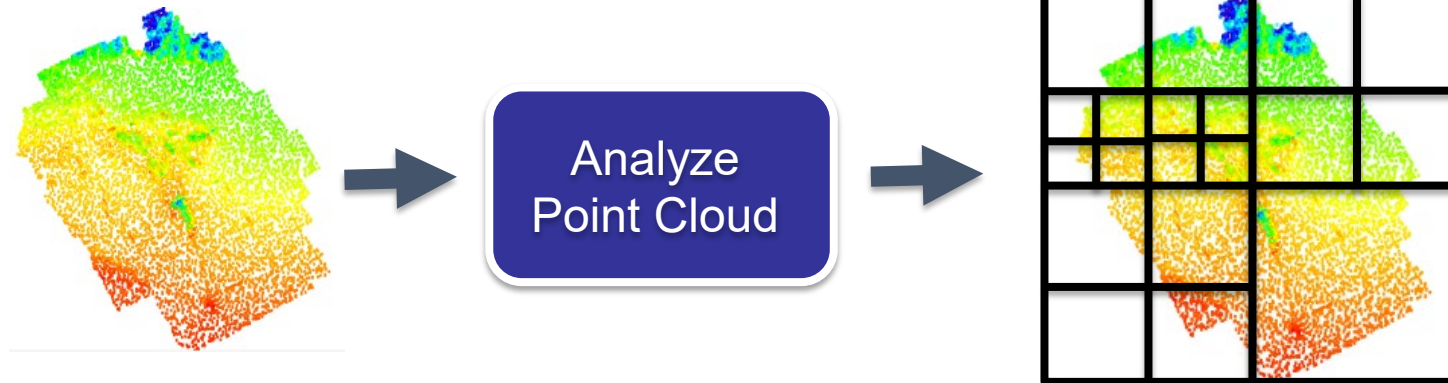
1. Divide dataset into tiles
2. Create a voxel grid for each tile
3. Classify the voxel grid
4. Map the result back to the points



Step 1.

Data is analyzed and divided into tiles

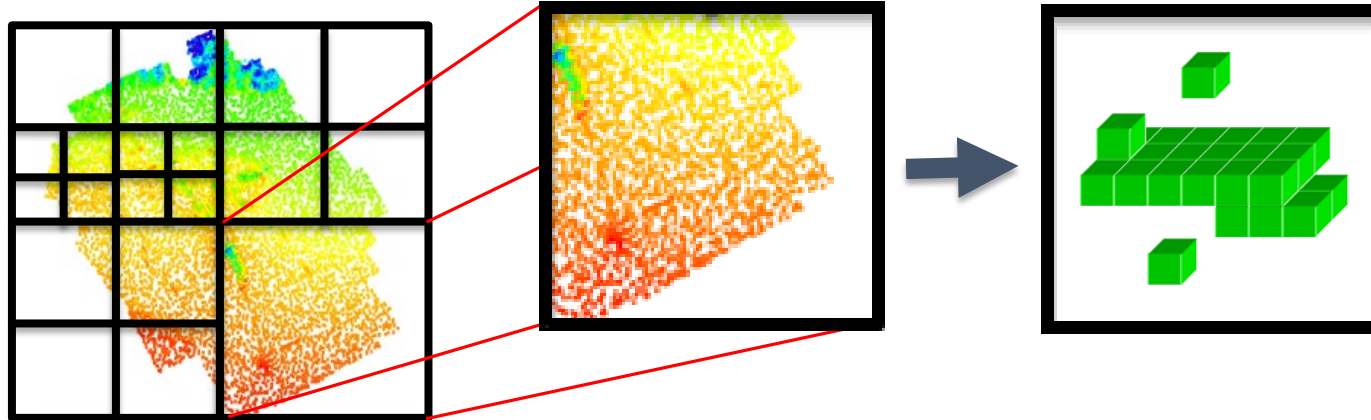
- Based on number of points
 - Low density = big tiles
- and an optional finest vertical resolution



Step 2

A voxel grid is created of all points in each tile

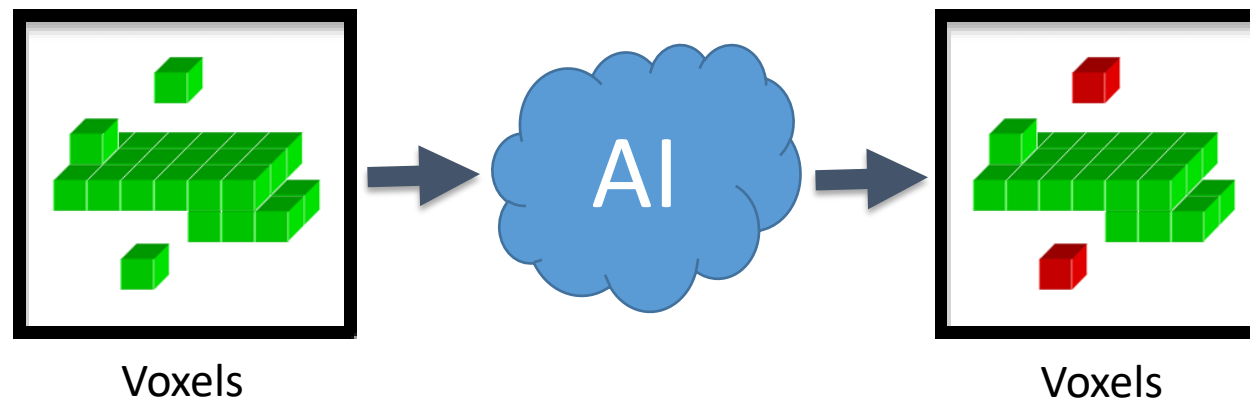
- Get the tile points
- Create voxel grid



Step 3.

Classify the voxel grid

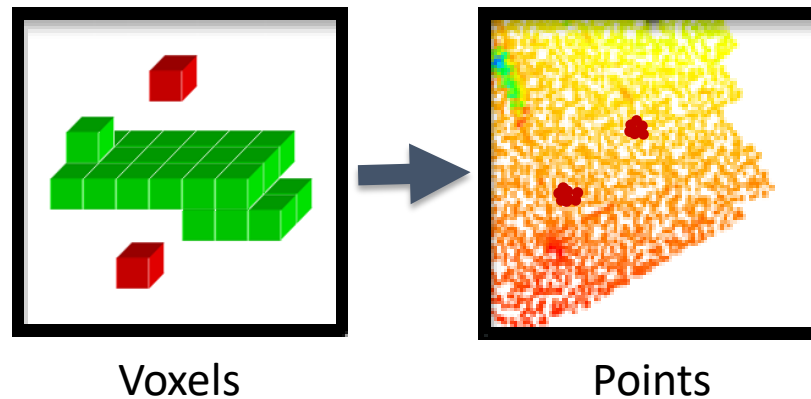
- Send voxels to AI (cloud or local)
 - 100 times smaller than full density point cloud
- Receive classification from AI



Step 4.

Map the result back to the points

- Adjust confidence threshold if required
- Apply as filter to dataset
- Points falling inside Rejected voxels are Rejected (like CUBE)





Layers

Search Layers

- All Critical Soundings
 - Plymouth2004 Critic
- All Track Lines
 - Plymouth2004 Trac
- All Contacts
 - Contacts
- Noisy

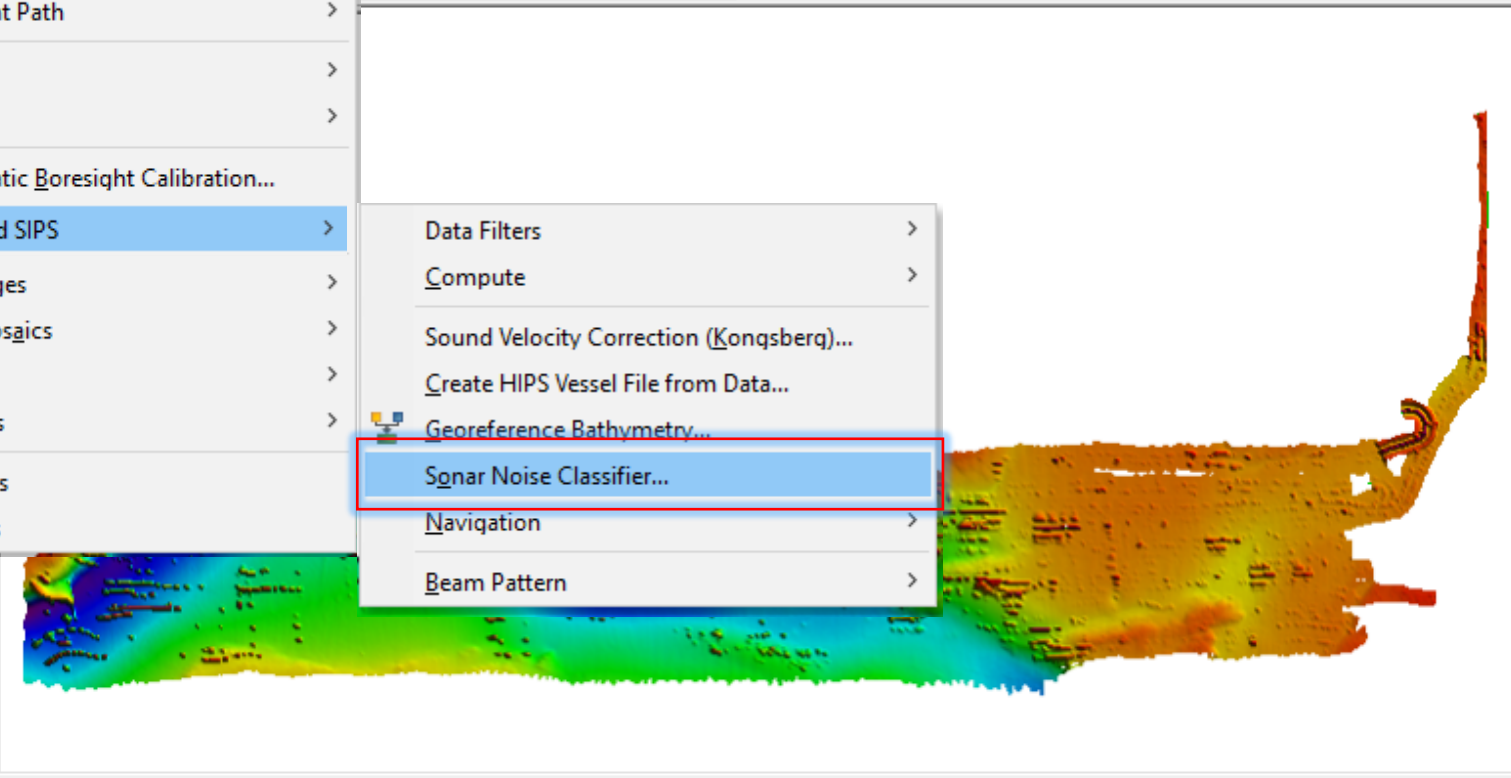
Project

Search Project Items

- Sonar Noise Classifier
 - Data Sources
 - Plymouth2004
 - Noisy

Tools menu:

- Measure Distance and Angle
- Register
- Run Process Model...
- 3D Flight Path
- Editors
- Report
- Automatic Boresight Calibration...
- HIPS and SIPS
 - Data Filters
 - Compute
 - Sound Velocity Correction (Kongsberg)...
 - Create HIPS Vessel File from Data...
 - Georeference Bathymetry...
 - Sonar Noise Classifier...
 - Navigation
 - Beam Pattern
- Coverages
- SIPS Mosajcs
- Profile
- Features
- Modules
- Options



Properties - Layers

Find a property

General

Filter: <none>

Display at Sc...

- Minimum: 0
- Maximum: 10000000

Symbolization

Symbolize li...

Symbols: TRACK_LINE

Line Weight: 0.000000

Colour

Colour by: State

Georeferenced: (0, 200, 0, 255)

Not Georefe...: (0, 0, 200, 255)

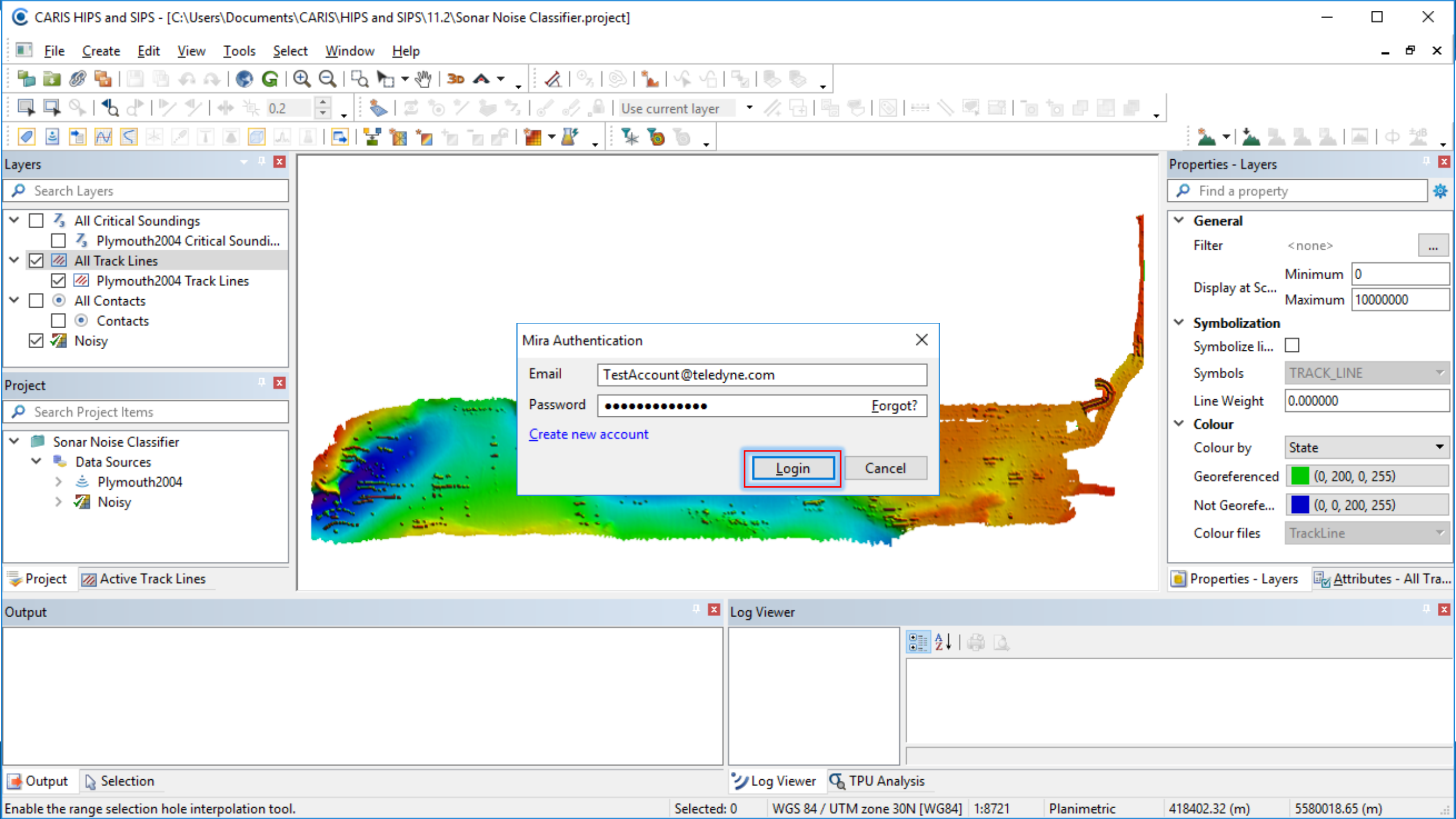
Colour files: TrackLine

Output

Log Viewer

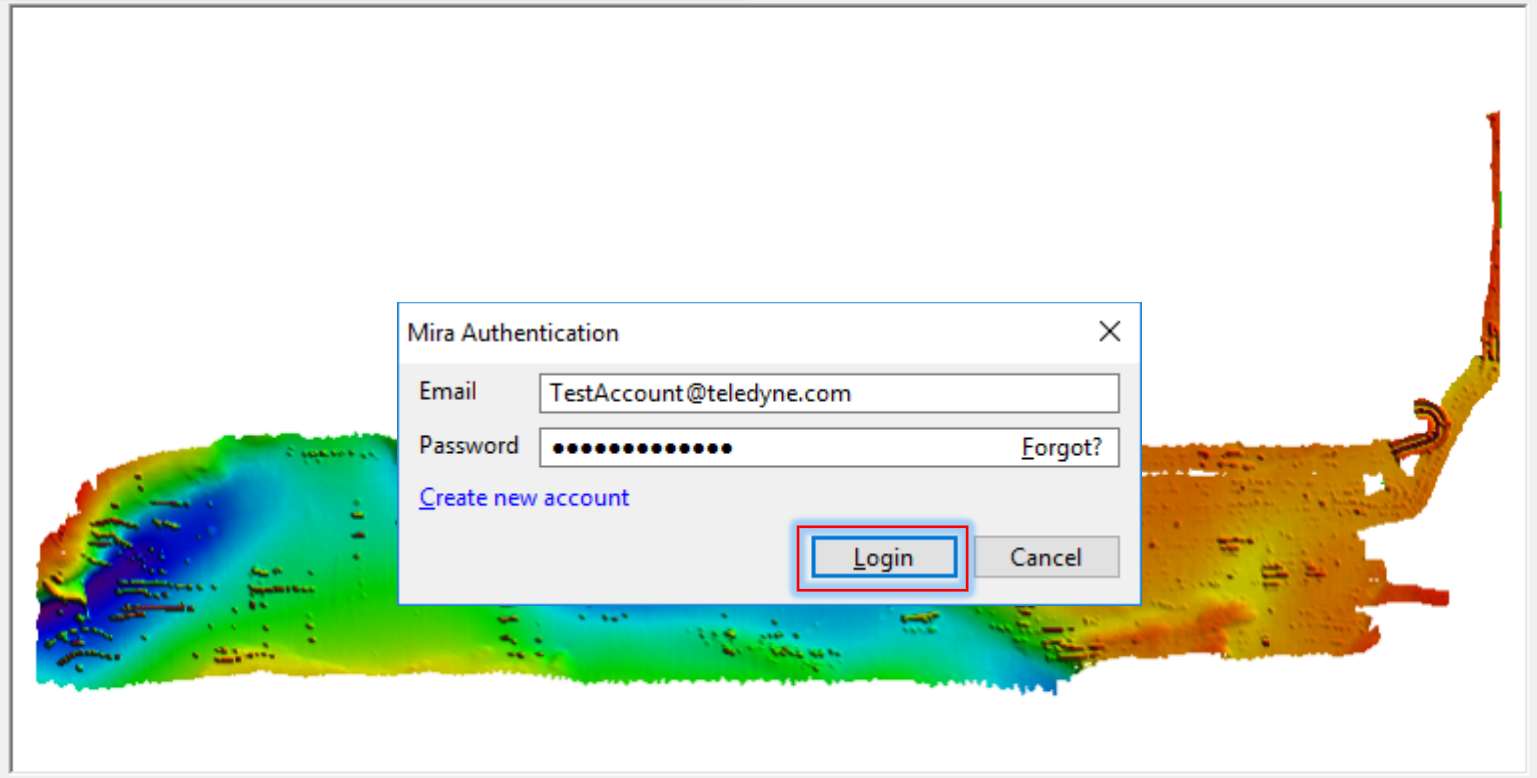
Log Viewer

TPU Analysis



Layers panel with search bar and list of layers: All Critical Soundings, Plymouth2004 Critical Soundi..., All Track Lines, Plymouth2004 Track Lines, All Contacts, Contacts, Noisy.

Project panel with search bar and list of project items: Sonar Noise Classifier, Data Sources, Plymouth2004, Noisy.

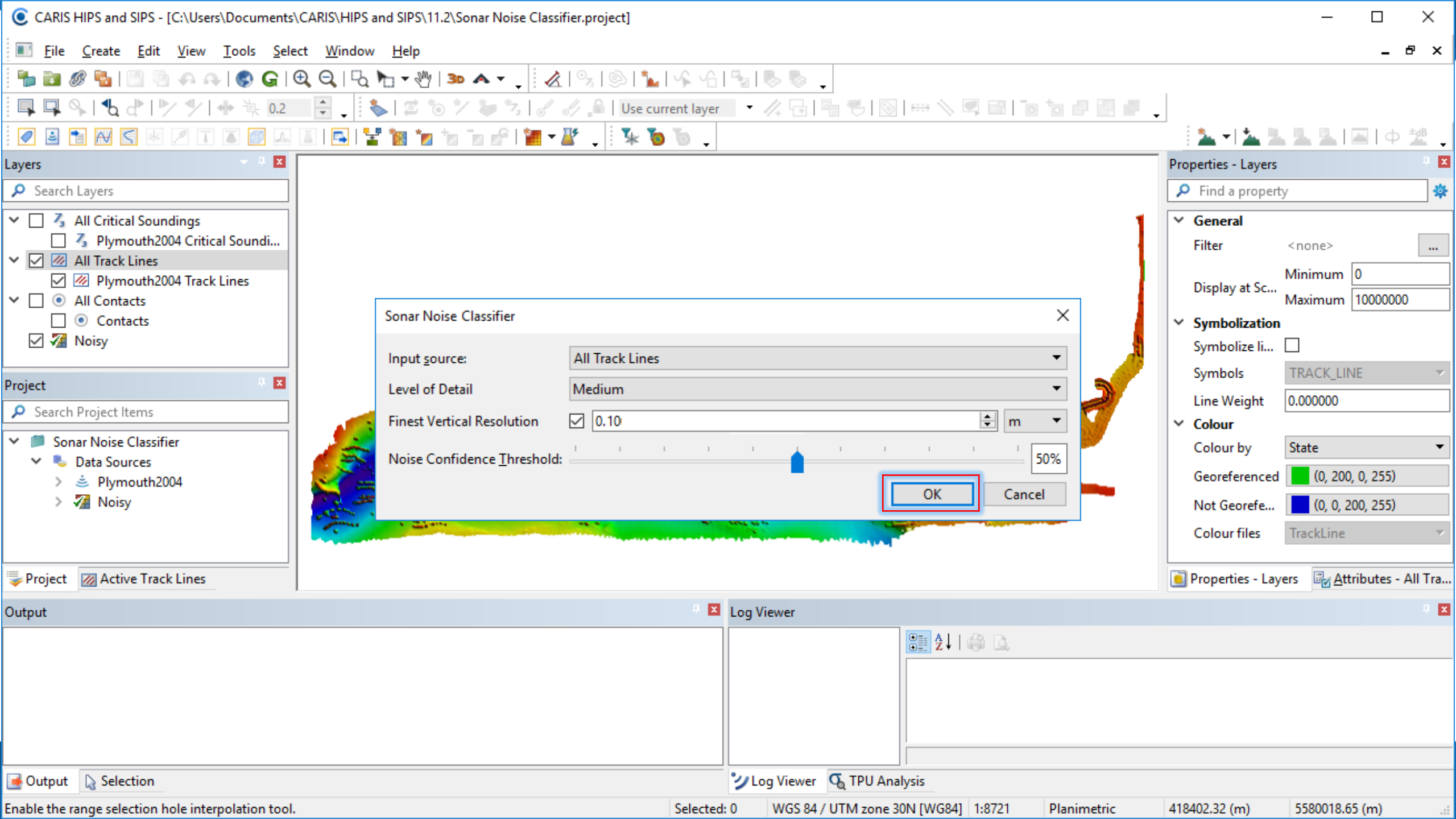


Mira Authentication dialog box with fields for Email (TestAccount@teledyne.com), Password (masked), Forgot?, and Create new account link. Login and Cancel buttons are at the bottom.

Properties - Layers panel with search bar and sections: General (Filter, Display at Sc...), Symbolization (Symbolize li..., Symbols, Line Weight), Colour (Colour by, Georeferenced, Not Georefe..., Colour files).

Output panel with tabs for Output and Selection.

Log Viewer panel with tabs for Log Viewer and TPU Analysis.





Layers

Search Layers

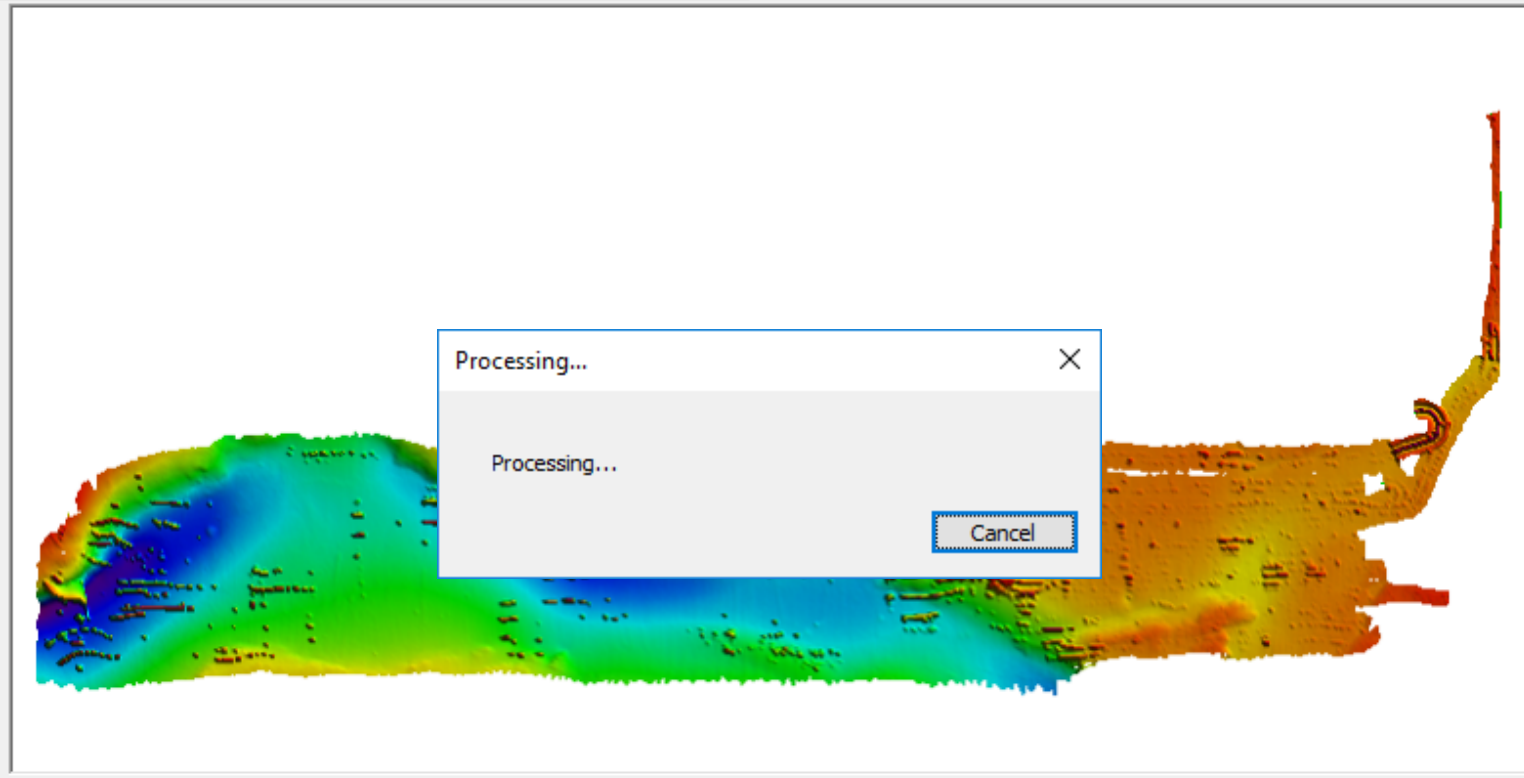
- All Critical Soundings
 - Plymouth2004 Critical Soundi...
- All Track Lines
 - Plymouth2004 Track Lines
- All Contacts
 - Contacts
- Noisy

Project

Search Project Items

- Sonar Noise Classifier
 - Data Sources
 - Plymouth2004
 - Noisy

Project **Active Track Lines**



Properties - Layers

Find a property

General

Filter < none >

Display at Sc... Minimum 0 Maximum 10000000

Symbolization

Symbolize li...

Symbols TRACK_LINE

Line Weight 0.000000

Colour

Colour by State

Georeferenced (0, 200, 0, 255)

Not Georefe... (0, 0, 200, 255)

Colour files TrackLine

Output

Selection

Log Viewer

Log Viewer TPU Analysis



Layers

Search Layers

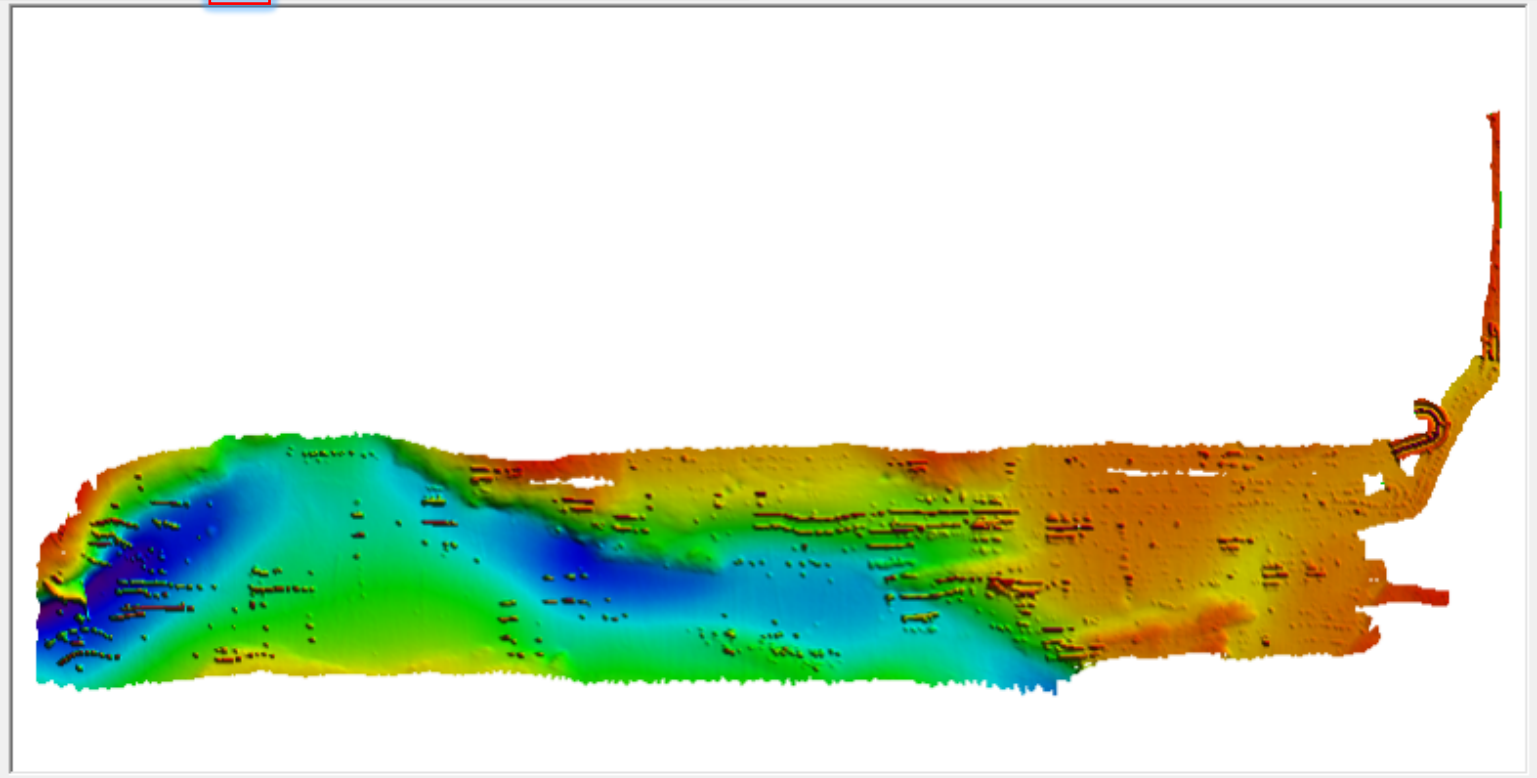
- All Critical Soundings
 - Plymouth2004 Critical Soundi...
- All Track Lines
 - Plymouth2004 Track Lines
- All Contacts
 - Contacts
 - Noisy

Project

Search Project Items

- Sonar Noise Classifier
 - Data Sources
 - Plymouth2004
 - Noisy

Project Active Track Lines



Properties - Layers

Find a property

General

Filter < none >

Display at Sc... Minimum 0 Maximum 10000000

Symbolization

Symbolize li...

Symbols TRACK_LINE

Line Weight 0.000000

Colour

Colour by State

Georeferenced (0, 200, 0, 255)

Not Georefe... (0, 0, 200, 255)

Colour files TrackLine

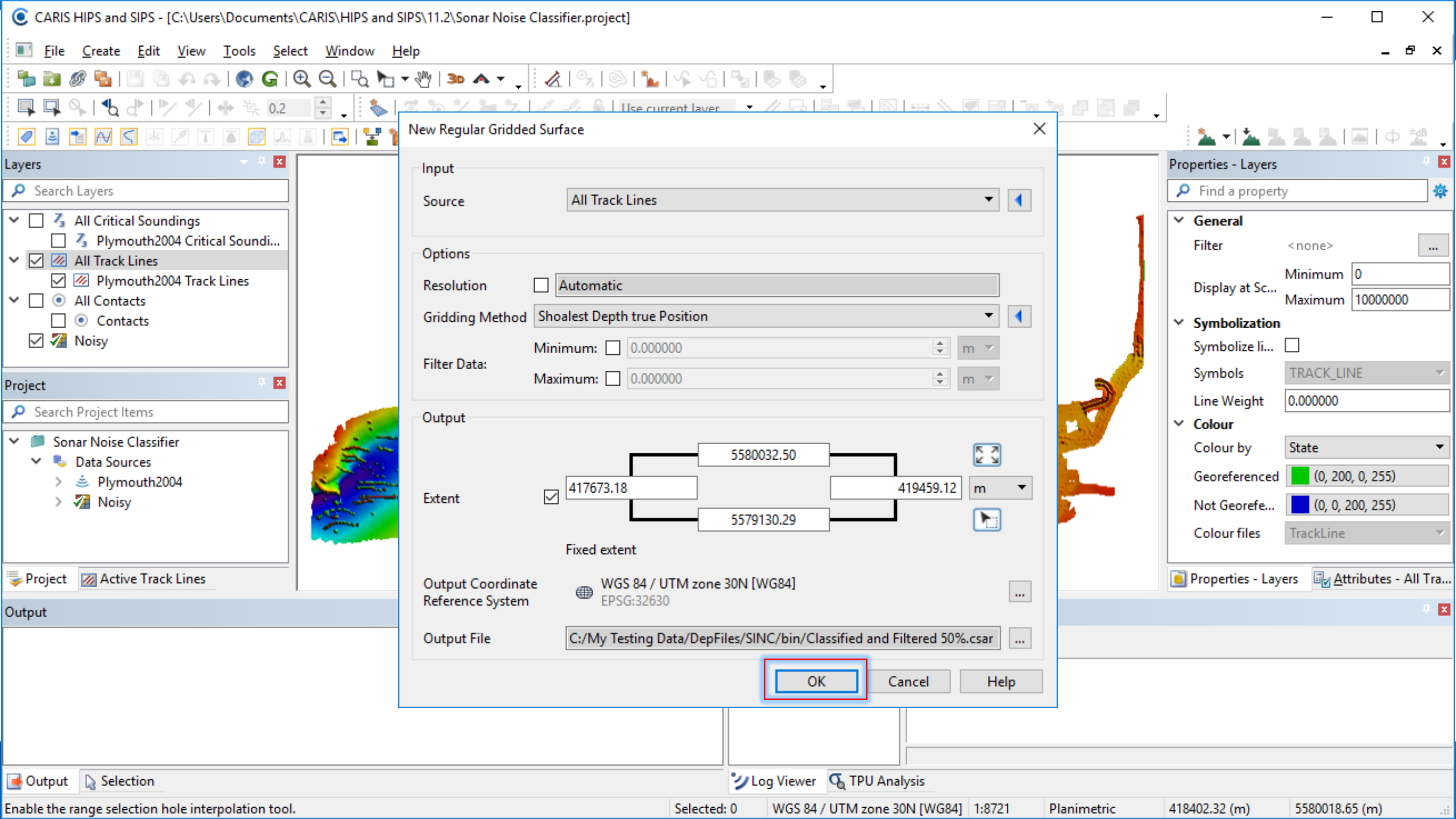
Properties - Layers Attributes - All Tra...

Output

Selection

Log Viewer

Log Viewer TPU Analysis



New Regular Gridded Surface

Input
Source: All Track Lines

Options
Resolution: Automatic
Gridding Method: Shoalest Depth true Position
Filter Data:
Minimum: 0.000000 m
Maximum: 0.000000 m

Output
Extent: 417673.18 5580032.50 419459.12 5579130.29 m

Fixed extent
Output Coordinate Reference System: WGS 84 / UTM zone 30N [WG84] EPSG:32630

Output File: C:/My Testing Data/DepFiles/SINC/bin/Classified and Filtered 50%.csar

OK Cancel Help

- Layers
- Search Layers
- All Critical Soundings
 - Plymouth2004 Critical Soundi...
- All Track Lines
 - Plymouth2004 Track Lines
- All Contacts
 - Contacts
- Noisy

- Project
- Search Project Items
- Sonar Noise Classifier
 - Data Sources
 - Plymouth2004
 - Noisy

Project: Active Track Lines

Output

- Properties - Layers
- Find a property
- General
 - Filter: <none>
 - Display at Sc...
 - Minimum: 0
 - Maximum: 10000000
- Symbolization
 - Symbolize li...:
 - Symbols: TRACK_LINE
 - Line Weight: 0.000000
- Colour
 - Colour by: State
 - Georeferenced: (0, 200, 0, 255)
 - Not Georefe...: (0, 0, 200, 255)
 - Colour files: TrackLine



Layers

Search Layers

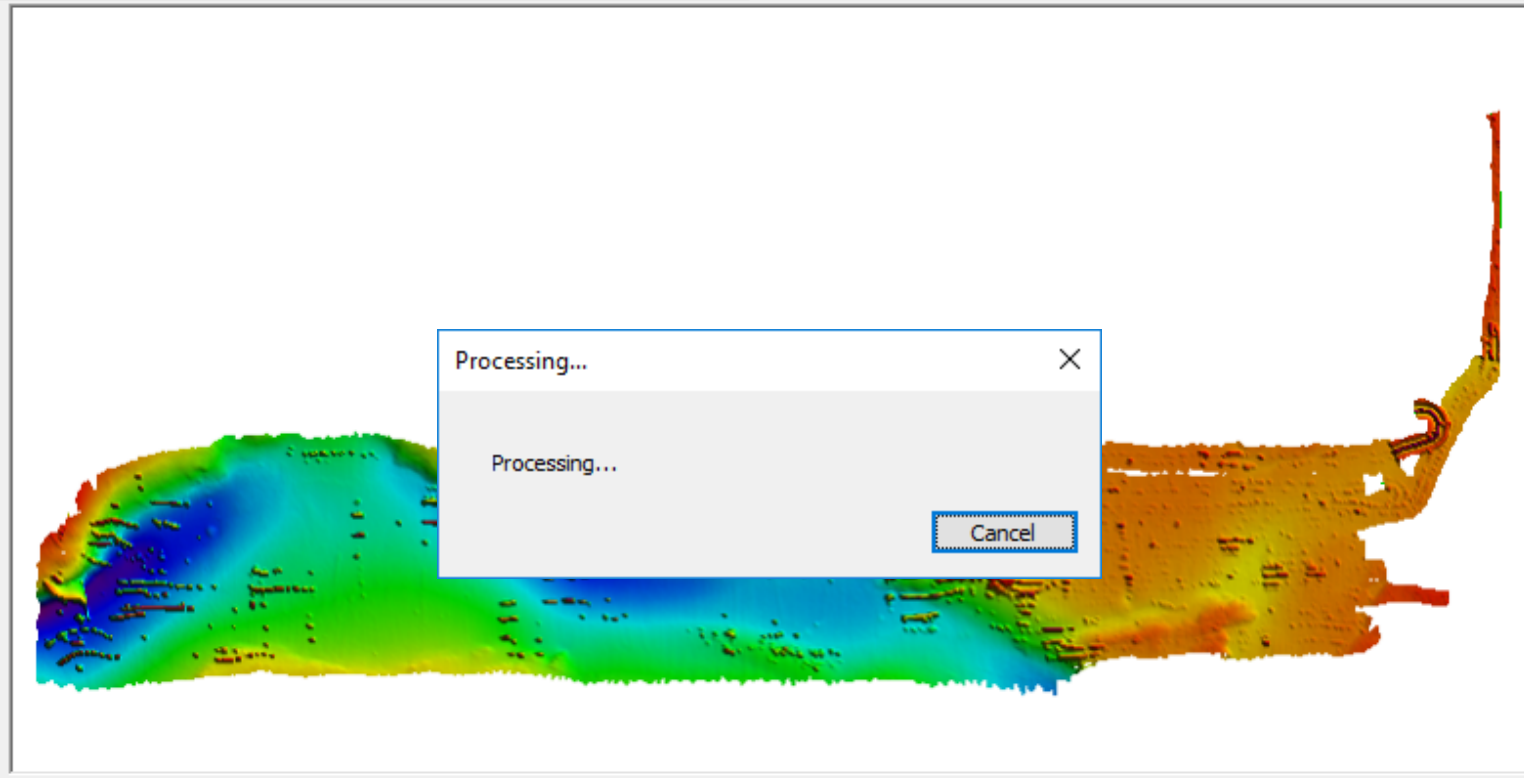
- All Critical Soundings
 - Plymouth2004 Critical Soundi...
- All Track Lines
 - Plymouth2004 Track Lines
- All Contacts
 - Contacts
- Noisy

Project

Search Project Items

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 - Plymouth2004
 - Noisy

Project **Active Track Lines**



Properties - Layers

Find a property

General

Filter <none>

Display at Sc... Minimum 0 Maximum 10000000

Symbolization

Symbolize li...

Symbols TRACK_LINE

Line Weight 0.000000

Colour

Colour by State

Georeferenced (0, 200, 0, 255)

Not Georefe... (0, 0, 200, 255)

Colour files TrackLine

Output

Selection

Log Viewer

Log Viewer TPU Analysis



Layers

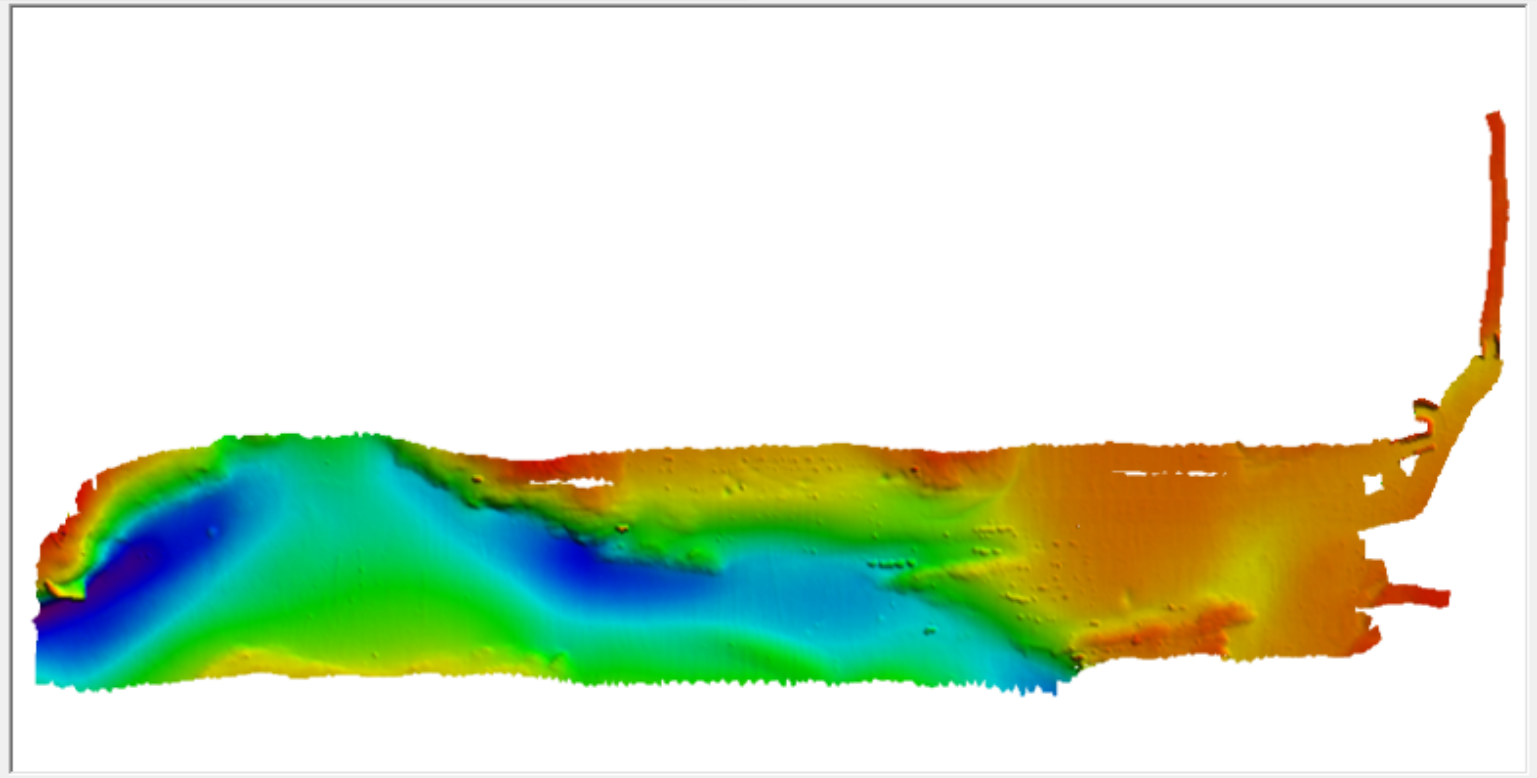
Search Layers

- All Critical Soundings
 - Plymouth2004 Critical Sou...
- All Track Lines
 - Plymouth2004 Track Lines
- All Contacts
 - Contacts
- Noisy
- Classified and Filtered 50%

Project

Search Project Items

- Sonar Noise Classifier
 - Data Sources
 - Plymouth2004
 - Noisy
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Properties - Layers

Find a property

General

Filter < none >

Display at Sc... Minimum 0 Maximum 10000000

Symbolization

Symbolize li...

Symbols TRACK_LINE

Line Weight 0.000000

Colour

Colour by State

Georeferenced (0, 200, 0, 255)

Not Georefe... (0, 0, 200, 255)

Colour files TrackLine

Output

```

===== Classify HIPS Noise start: Oct 29, 2019 5:04:36 PM =====
===== Classify HIPS Noise end: Oct 29, 2019 5:05:52 PM (Elapsed Time: 00:01:16) =====
===== Create HIPS Grid using Shoalest Depth true Position start: Oct 29, 2019 5:06:52 PM =====
===== Create HIPS Grid using Shoalest Depth true Position end: Oct 29, 2019 5:07:02 PM (Elapsed Time: 00:00:10) =====
=====
  
```

Log Viewer

Log Viewer TPU Analysis



Layers

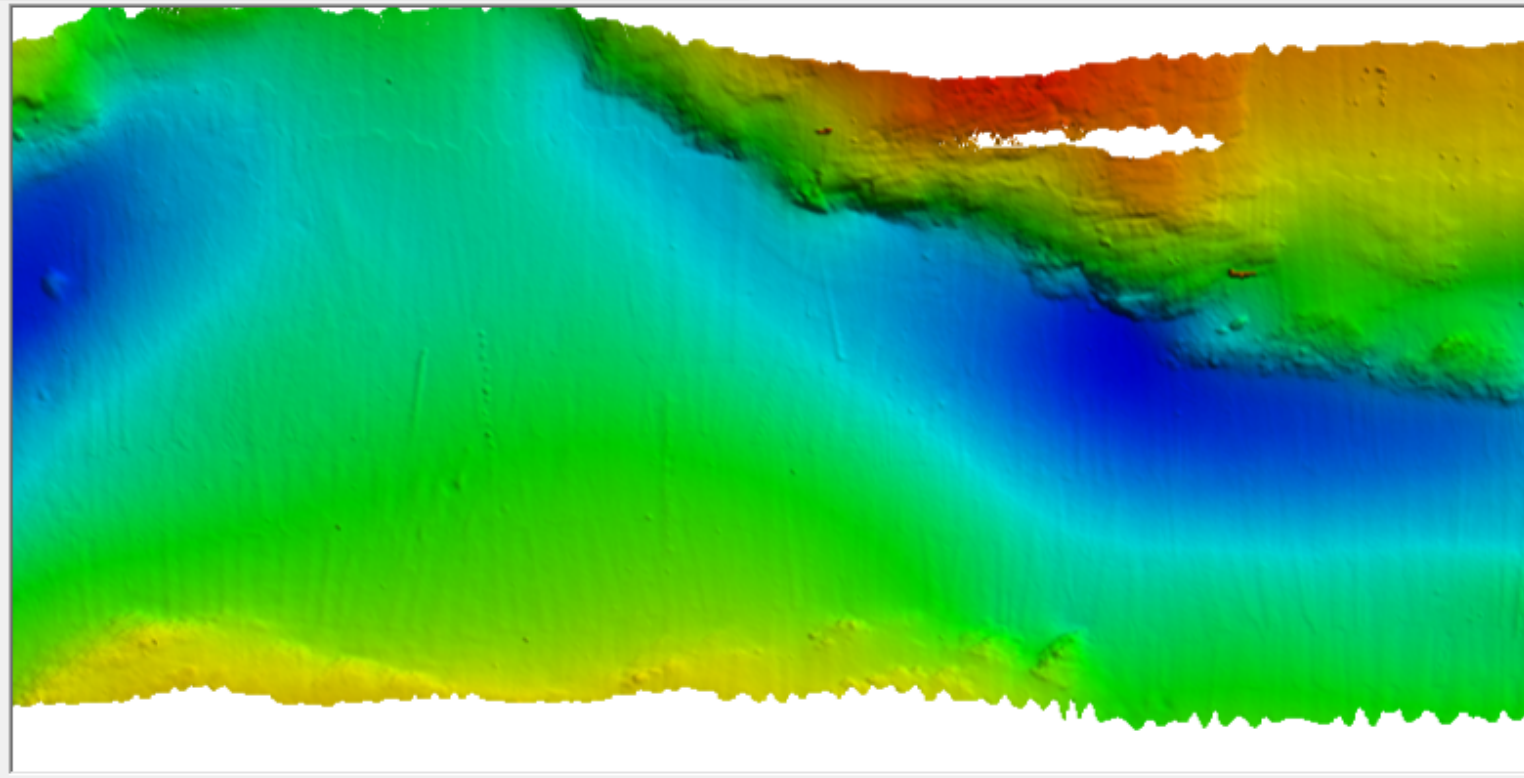
Search Layers

- All Critical Soundings
 - Plymouth2004 Critical Sou...
- All Track Lines
 - Plymouth2004 Track Lines
- All Contacts
 - Contacts
- Noisy
- Classified and Filtered 50%

Project

Search Project Items

- Sonar Noise Classifier
 - Data Sources
 - Plymouth2004
 - Noisy
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Properties - Layers

Find a property

General

Filter < none >

Display at Sc... Minimum 0 Maximum 10000000

Symbolization

Symbolize li...

Symbols TRACK_LINE

Line Weight 0.000000

Colour

Colour by State

Georeferenced (0, 200, 0, 255)

Not Georefe... (0, 0, 200, 255)

Colour files TrackLine

Output

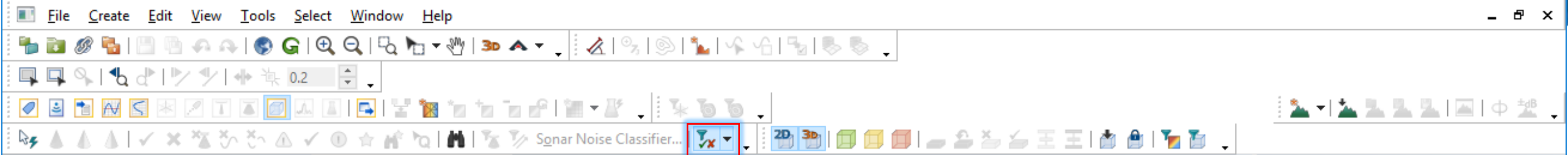
```

===== Classify HIPS Noise start: Oct 29, 2019 5:04:36 PM =====
===== Classify HIPS Noise end: Oct 29, 2019 5:05:52 PM (Elapsed Time: 00:01:16) =====
===== Create HIPS Grid using Shoalest Depth true Position start: Oct 29, 2019 5:06:52 PM =====
===== Create HIPS Grid using Shoalest Depth true Position end: Oct 29, 2019 5:07:02 PM (Elapsed Time: 00:00:10) =====
=====
  
```

Log Viewer

TPU Analysis

File Create Edit View Tools Select Window Help



Layers

Search Layers

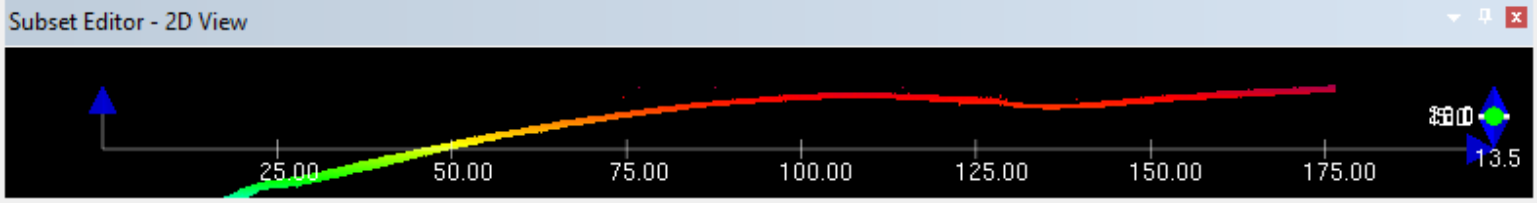
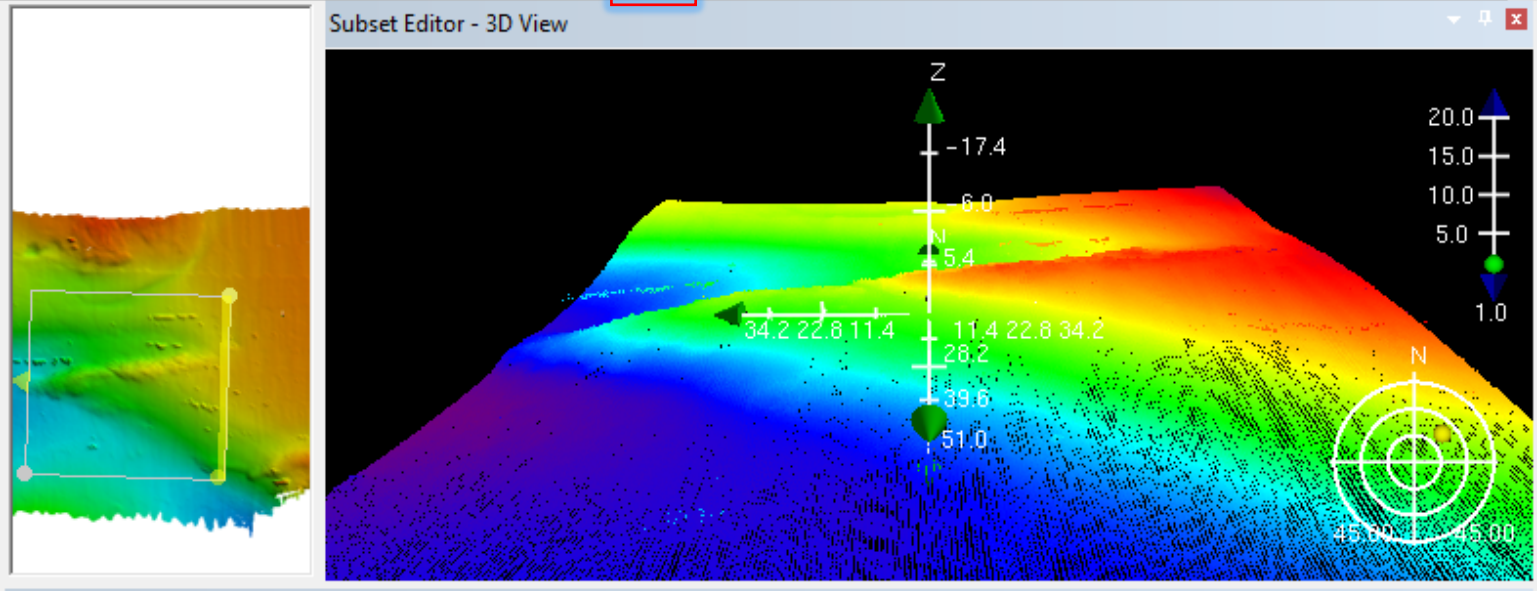
- All Critical Soundings
 - Plymouth2004 Critical Sou...
- All Track Lines
 - Plymouth2004 Track Lines
- All Contacts
 - Contacts
- Noisy
- Classified and Filtered 50%

Project

Search Project Items

- Sonar Noise Classifier
 - Data Sources
 - Plymouth2004
 - Noisy
 - Classified and Filtered 50%

Project Active Track Lines



Subset Control

Data

- HIPS Data
 - 3D View
 - 2D View
- Reference Surface
- CUBE Hypothesis
- Calibration
- Water Column
- Tracking

Properties

Colours

Attribute: Depth

Colour Map: Rainbow

Minimum 0 m

Reverse colours

Subset Co... Properties... Attributes...

Selection

Line	Profile	Beam	Time	Depth (m)	Q	Status	T...	Dp TPU (...)

Output Selection

Log Viewer

Log Viewer TPU Analysis

File Create Edit View Tools Select Window Help

Layers

Search Layers

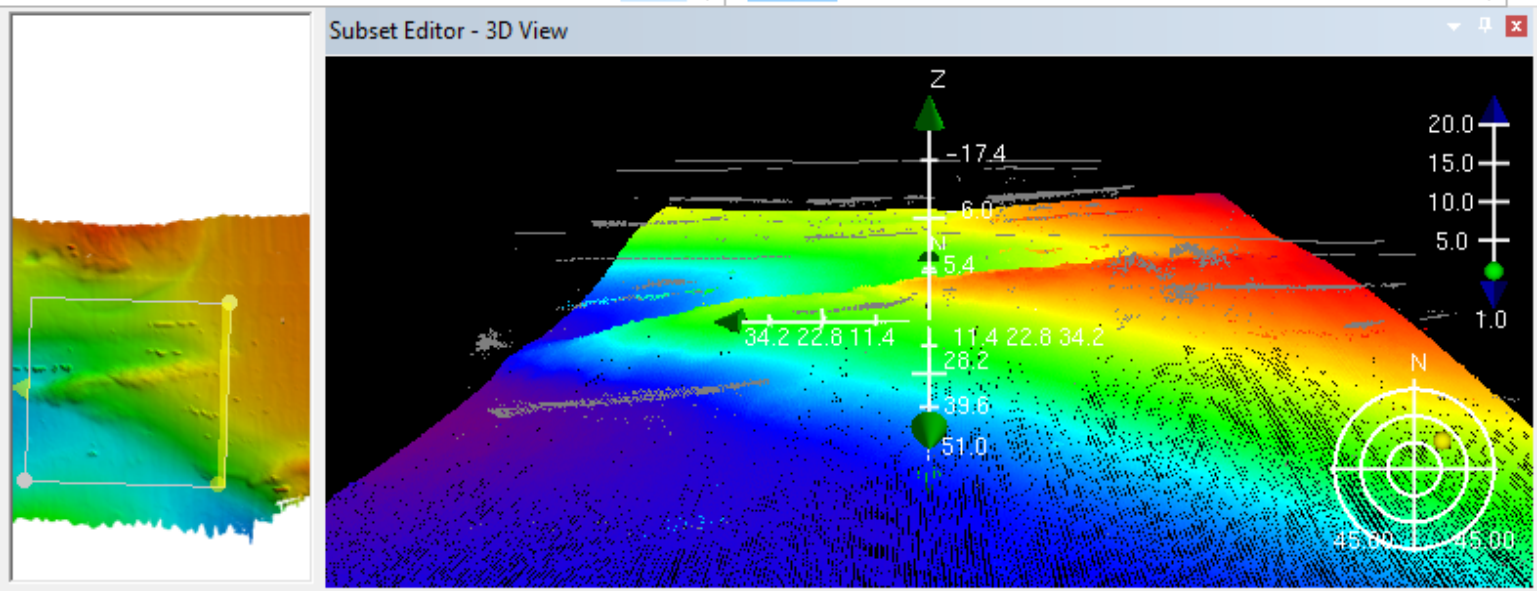
- All Critical Soundings
 - Plymouth2004 Critical Sou...
- All Track Lines
 - Plymouth2004 Track Lines
- All Contacts
 - Contacts
- Noisy
- Classified and Filtered 50%

Project

Search Project Items

- Sonar Noise Classifier
 - Data Sources
 - Plymouth2004
 - Noisy
 - Classified and Filtered 50%

Project Active Track Lines



Subset Control

Data

- HIPS Data
 - 3D View
 - 2D View
- Reference Surface
- CUBE Hypothesis
- Calibration
- Water Column
- Tracking

Properties

Colours

Attribute: Depth

Colour Map:

- Depth
- Depth Uncertainty
- Position Uncertainty
- IHO S-44
- IHO S-57
- Project
- Vessel
- Day
- Line
- Amplitude
- Detection Method
- Detection Type
- Transducer
- Confidence

Selection

Line	Profile	Beam	Time	Depth (m)	Q	Status	T...	Dp TPU (...)

Log Viewer

Log Viewer TPU Analysis



Layers

Search Layers

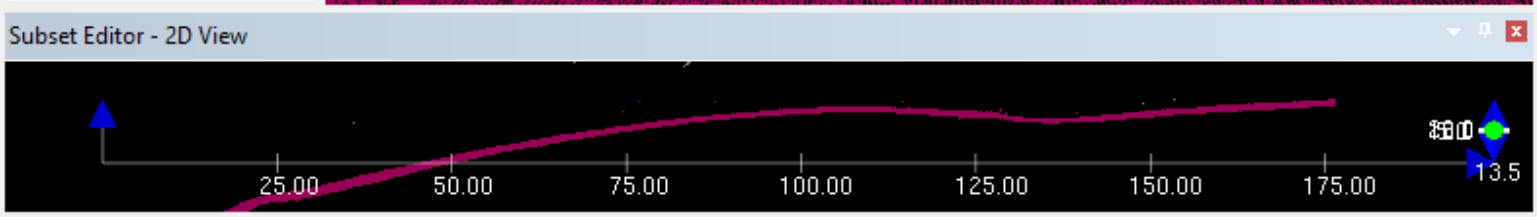
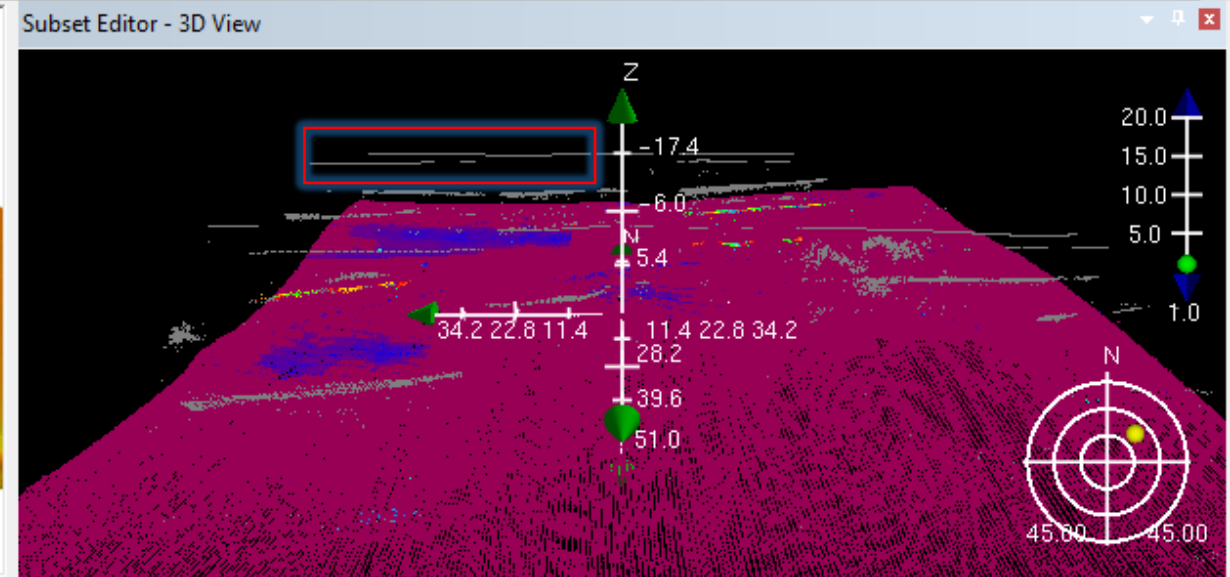
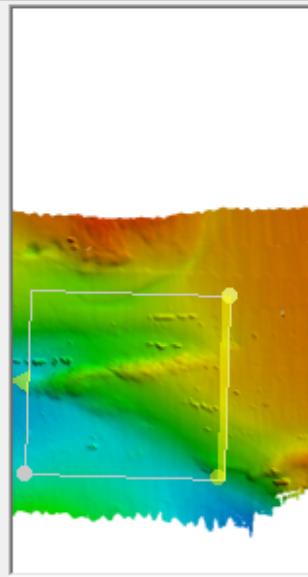
- All Critical Soundings
 - Plymouth2004 Critical Sou...
- All Track Lines
 - Plymouth2004 Track Lines
- All Contacts
 - Contacts
- Noisy
- Classified and Filtered 50%

Project

Search Project Items

- Sonar Noise Classifier
 - Data Sources
 - Plymouth2004
 - Noisy
 - Classified and Filtered 50%

Project | Active Track Lines



Subset Control

Data

- HIPS Data
 - 3D View
 - 2D View
- Reference Surface
- CUBE Hypothesis
- Calibration
- Water Column
- Tracking

Properties

Colours

Attribute: Confidence

Colour Map: Rainbow

Minimum 3.391 m

Reverse colours

Selection

Line	Profile	Beam	Time	Depth (m)	Q	Status	T...	Dp TPU (...)

Log Viewer

Log Viewer | TPU Analysis



Layers

Search Layers

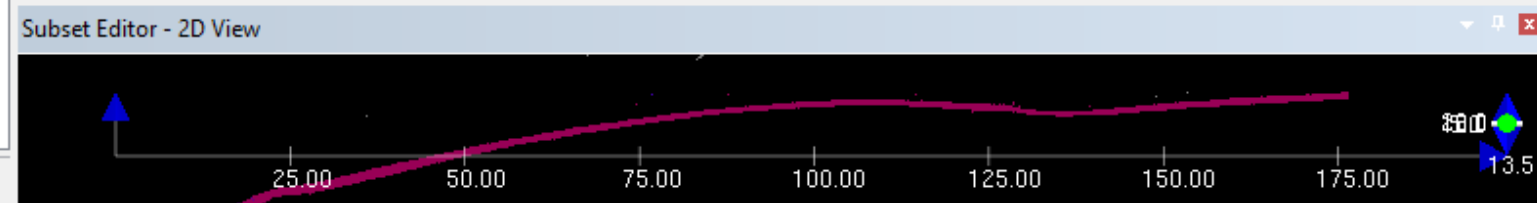
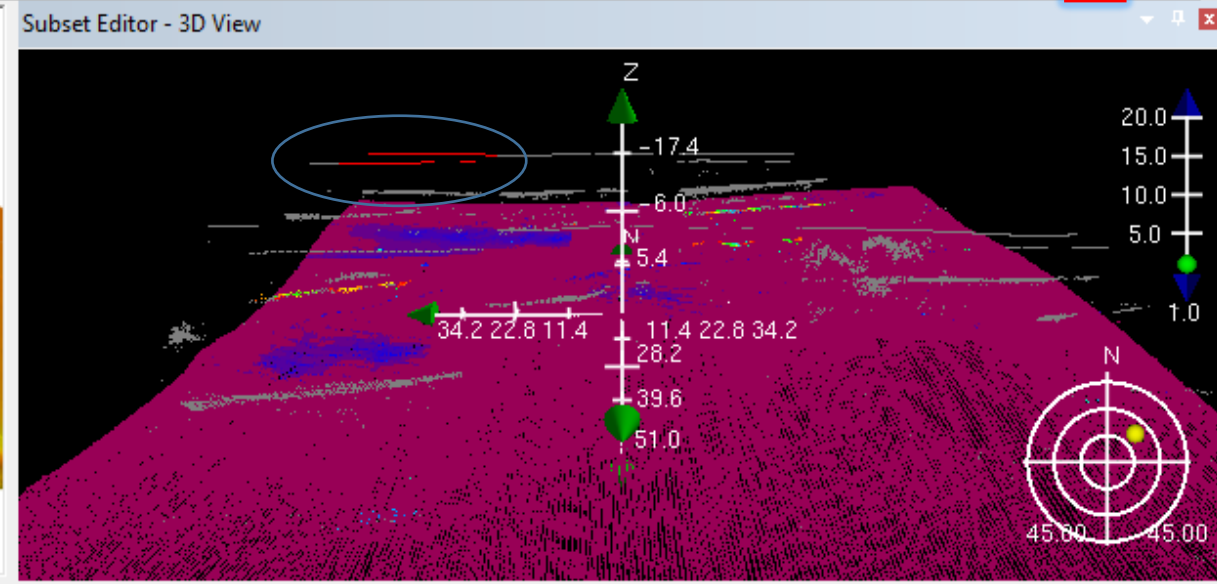
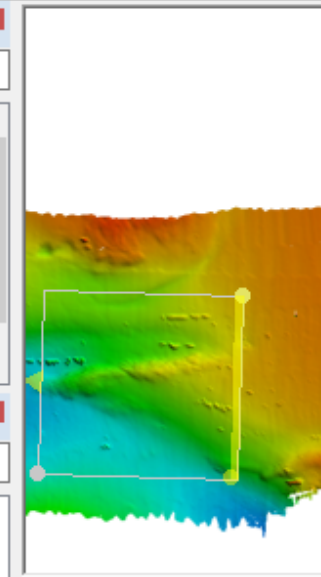
- All Critical Soundings
 - Plymouth2004 Critical Sou...
- All Track Lines
 - Plymouth2004 Track Lines
- All Contacts
 - Contacts
- Noisy
- Classified and Filtered 50%

Project

Search Project Items

- Sonar Noise Classifier
 - Data Sources
 - Plymouth2004
 - Noisy
 - Classified and Filtered 50%

Project Active Track Lines



Subset Control

Data

- HIPS Data
 - 3D View
 - 2D View
- Reference Surface
- CUBE Hypothesis
- Calibration
- Water Column
- Tracking

Properties

Colours

Attribute: Confidence

Colour Map: Rainbow

Minimum 3.391 m

Reverse colours

Subset Co... Properties... Attributes...

Selection

Profile	Beam	Time	Depth (m)	Q	Noise Confidence	Status	T...	Dp TF
1,785	8	2004-08-04 09:42:43.843	-3.674	0	99	Reject (Area Filter)	4...	
1,785	9	2004-08-04 09:42:43.843	-3.674	0	99	Reject (Area Filter)	4...	
1,784	8	2004-08-04 09:42:43.703	-3.674	0	99	Reject (Area Filter)	4...	

Log Viewer

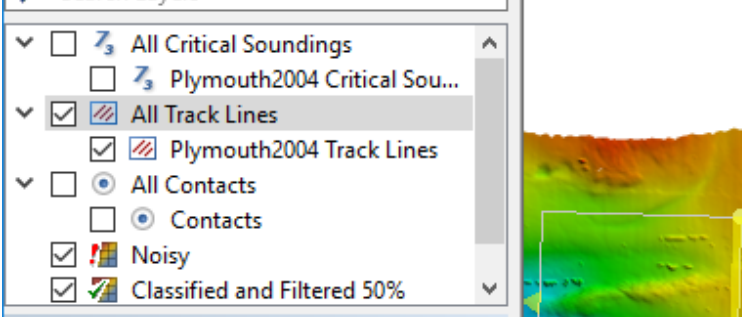
Log Viewer TPU Analysis



Layers

Search Layers

- All Critical Soundings
 - Plymouth2004 Critical Sou...
- All Track Lines
 - Plymouth2004 Track Lines
- All Contacts
 - Contacts
- Noisy
- Classified and Filtered 50%



Project

Search Project Items

- Sonar Noise Classifier
 - Data Sources
 - Plymouth2004
 - Noisy
 - Classified and Filtered 50%

Subset Editor - 2D View

Selection

Profile	Beam	Time	Depth (m)	Q	Noise
1,785	8	2004-08-04 09:42:43.843	-3.674	0	
1,785	9	2004-08-04 09:42:43.843	-3.674	0	
1,784	8	2004-08-04 09:42:43.703	-3.674	0	

Filter Processed Depths

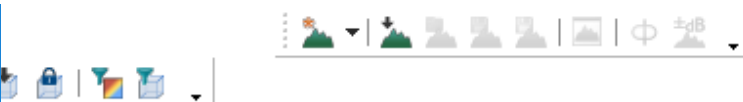
Input source: Subset

Filter type: Noise Confidence

Options:

- Protective Radius**
 - Protective Radius [] m
 - Protective Radius Designated
 - Protective Radius Examined
 - Protective Radius Outstanding
- Include Rejected**
- Confidence**
 - Threshold

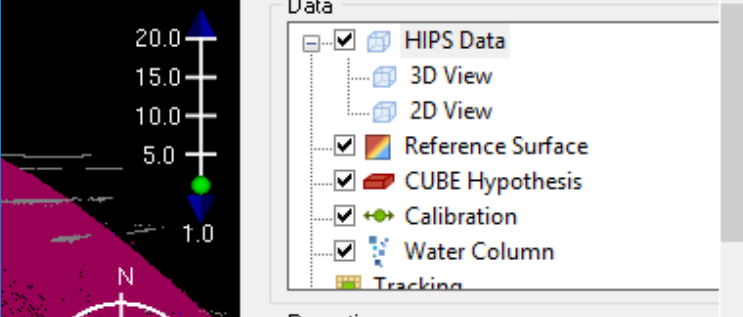
OK Cancel Apply



Subset Control

Data

- HIPS Data
 - 3D View
 - 2D View
- Reference Surface
- CUBE Hypothesis
- Calibration
- Water Column
- Tracking



Properties

Colours

Attribute: Confidence

Colour Map: Rainbow

Minimum 3.391 m

Reverse colours

Subset Co... Properties... Attributes...



Layers

Search Layers

- All Critical Soundings
 - Plymouth2004 Critical Sou...
- All Track Lines
 - Plymouth2004 Track Lines
- All Contacts
 - Contacts
- Noisy
- Classified and Filtered 50%

Project

Search Project Items

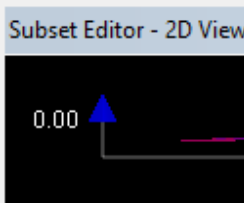
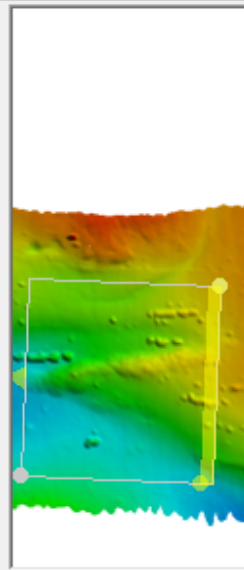
- Sonar Noise Classifier
 - Data Sources
 - Plymouth2004
 - Noisy
 - Classified and Filtered 50%

Project

Active Track Lines

Selection

Y (m)	X (m)	Project	Vessel	Day



Filter Processed Depths

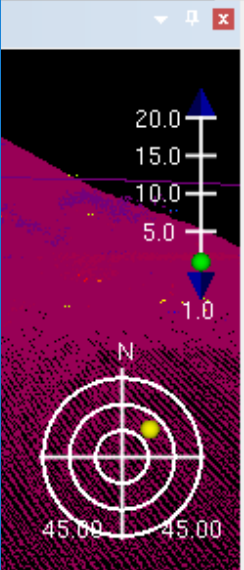
Input source: Subset

Filter type: Noise Confidence

Options:

- Protective Radius**
 - Protective Radius [] m
 - Protective Radius Designated
 - Protective Radius Examined
 - Protective Radius Outstanding
- Include Rejected
- Confidence**
 - Threshold

OK Cancel Apply



Subset Control

Data

- HIPS Data
 - 3D View
 - 2D View
- Reference Surface
- CUBE Hypothesis
- Calibration
- Water Column
- Tracking

Properties

Colours

Attribute: Confidence

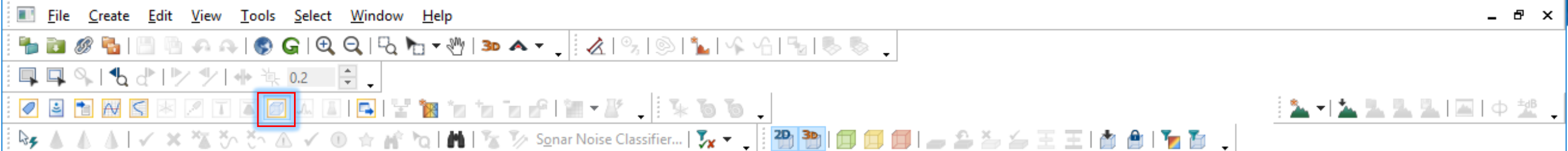
Colour Map: Rainbow

Minimum 3.391 m

Reverse colours

Subset Co... Properties... Attributes...

File Create Edit View Tools Select Window Help



Layers

Search Layers

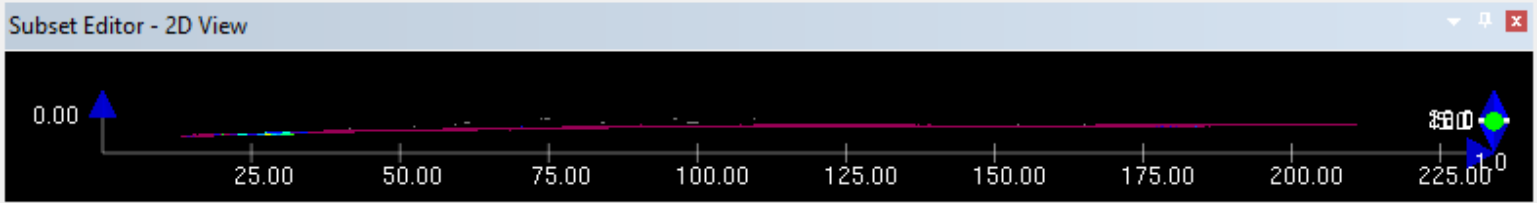
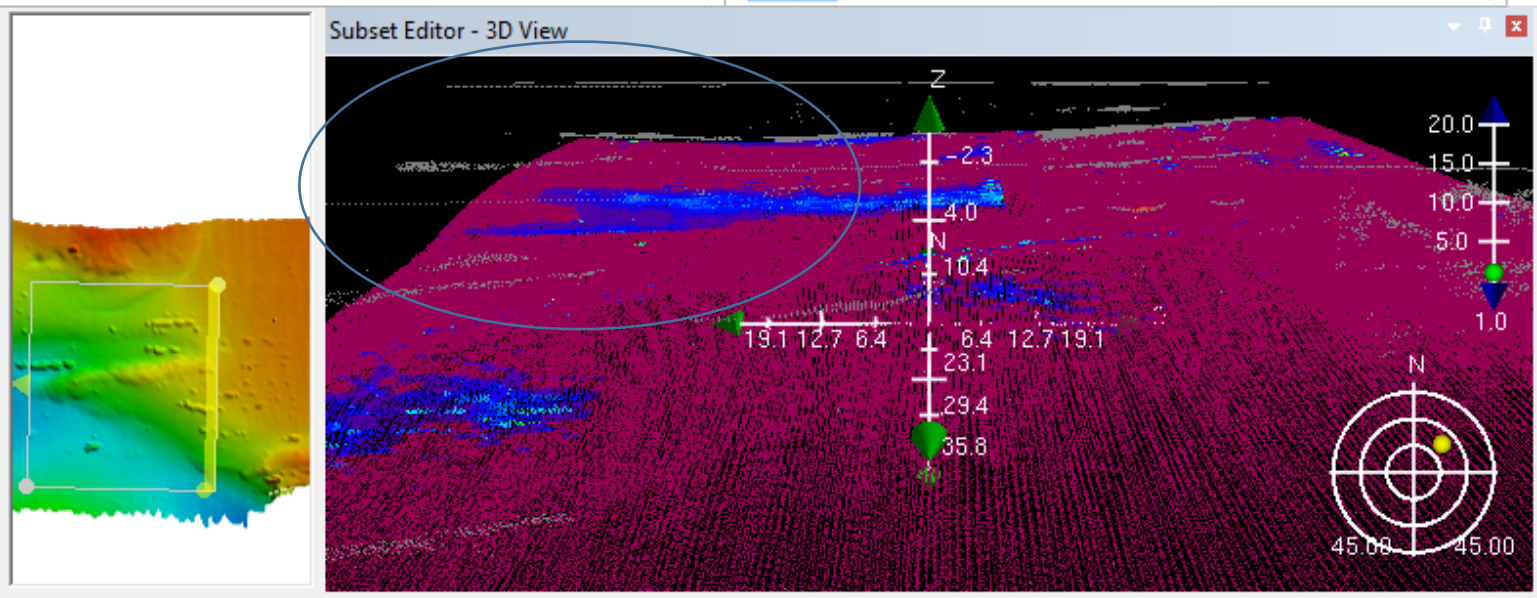
- All Critical Soundings
 - Plymouth2004 Critical Soundi...
- All Track Lines
 - Plymouth2004 Track Lines
- All Contacts
 - Contacts
- Noisy
- Classified and Filtered 50%

Project

Search Project Items

- Sonar Noise Classifier
 - Data Sources
 - Plymouth2004
 - Noisy
 - Classified and Filtered 50%

Project Active Track Lines



Subset Control

Data

- HIPS Data
 - 3D View
 - 2D View
- Reference Surface
- CUBE Hypothesis
- Calibration
- Water Column
- Tracking

Properties

Colours

Attribute: Confidence

Colour Map: Rainbow

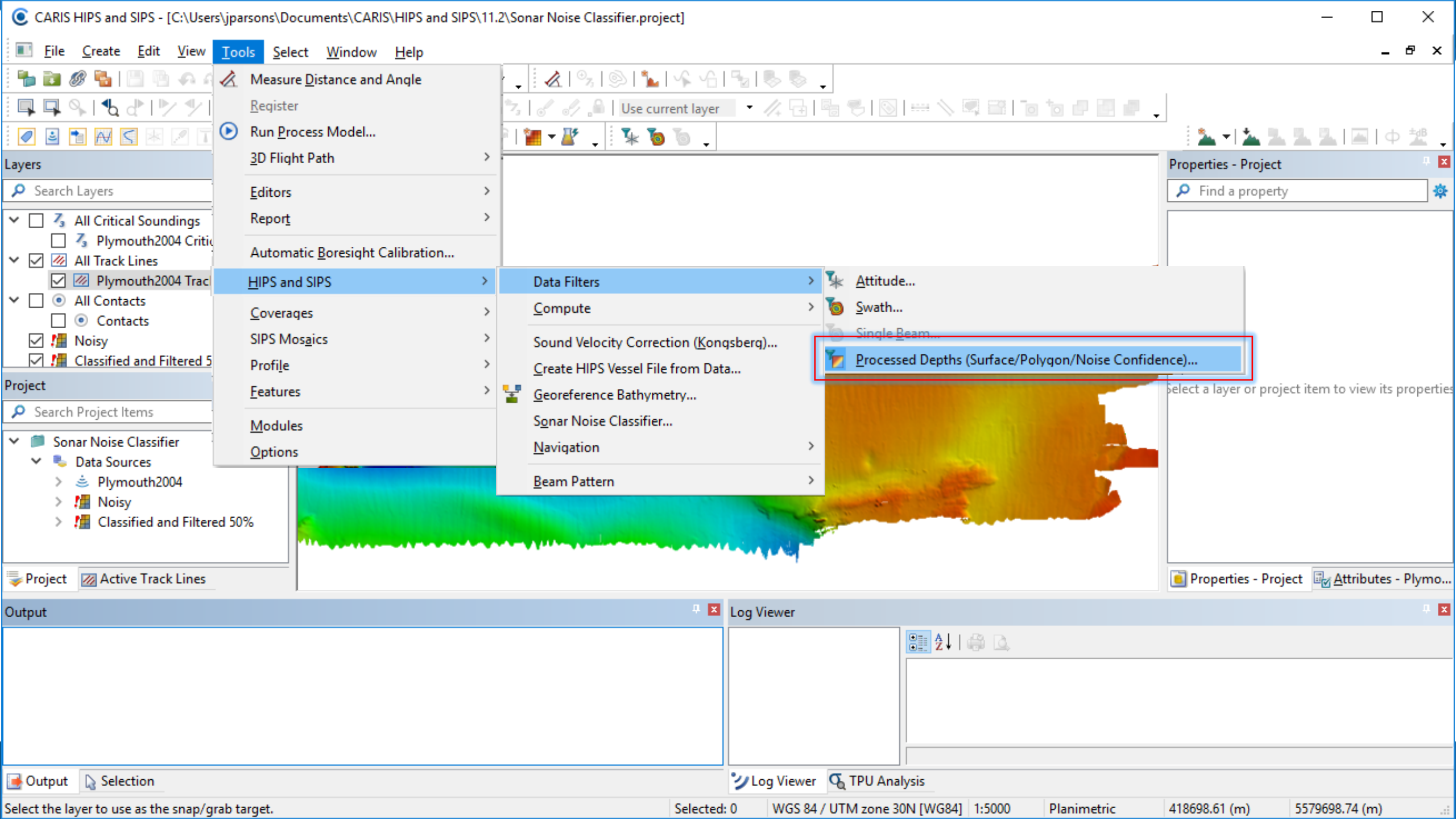
Minimum 3.391 m

Reverse colours

Output

Log Viewer

Log Viewer TPU Analysis



- Tools
 - Measure Distance and Angle
 - Register
 - Run Process Model...
 - 3D Flight Path
 - Editors
 - Report
 - Automatic Boresight Calibration...
 - HIPS and SIPS**
 - Data Filters**
 - Attitude...
 - Swath...
 - Single Beam...
 - Processed Depths (Surface/Polygon/Noise Confidence)...**
 - Compute
 - Sound Velocity Correction (Kongsberg)...
 - Create HIPS Vessel File from Data...
 - Georeference Bathymetry...
 - Sonar Noise Classifier...
 - Navigation
 - Beam Pattern
 - Coverages
 - SIPS Mosaics
 - Profile
 - Features
 - Modules
 - Options

- Layers
- Search Layers
- All Critical Soundings
 - Plymouth2004 Critic
 - All Track Lines
 - Plymouth2004 Trac
 - All Contacts
 - Contacts
 - Noisy
 - Classified and Filtered 5
- Project
- Search Project Items
- Sonar Noise Classifier
 - Data Sources
 - Plymouth2004
 - Noisy
 - Classified and Filtered 50%

Properties - Project

Find a property

Select a layer or project item to view its properties

Properties - Project

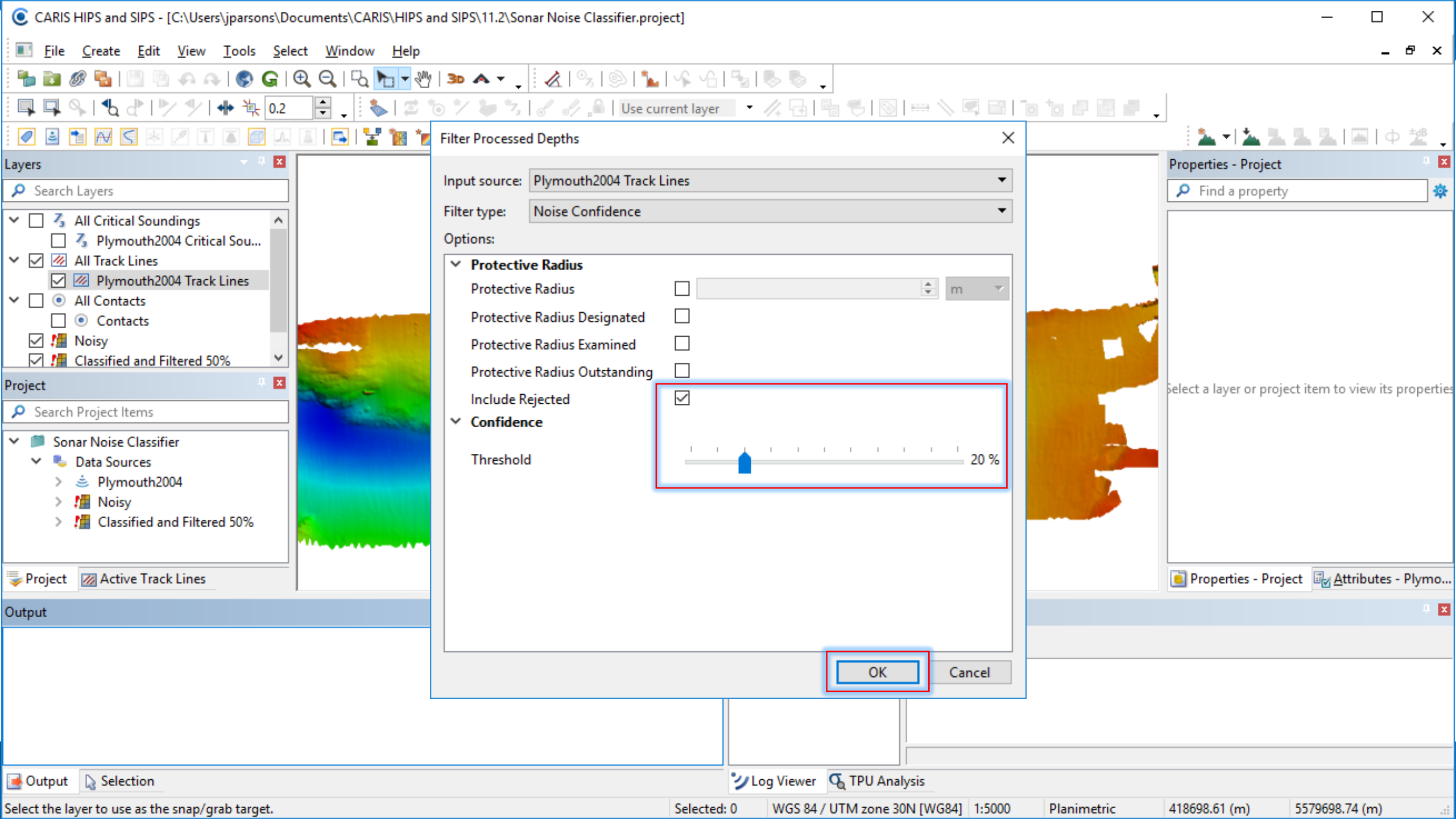
Attributes - Plymo...

Output

Log Viewer

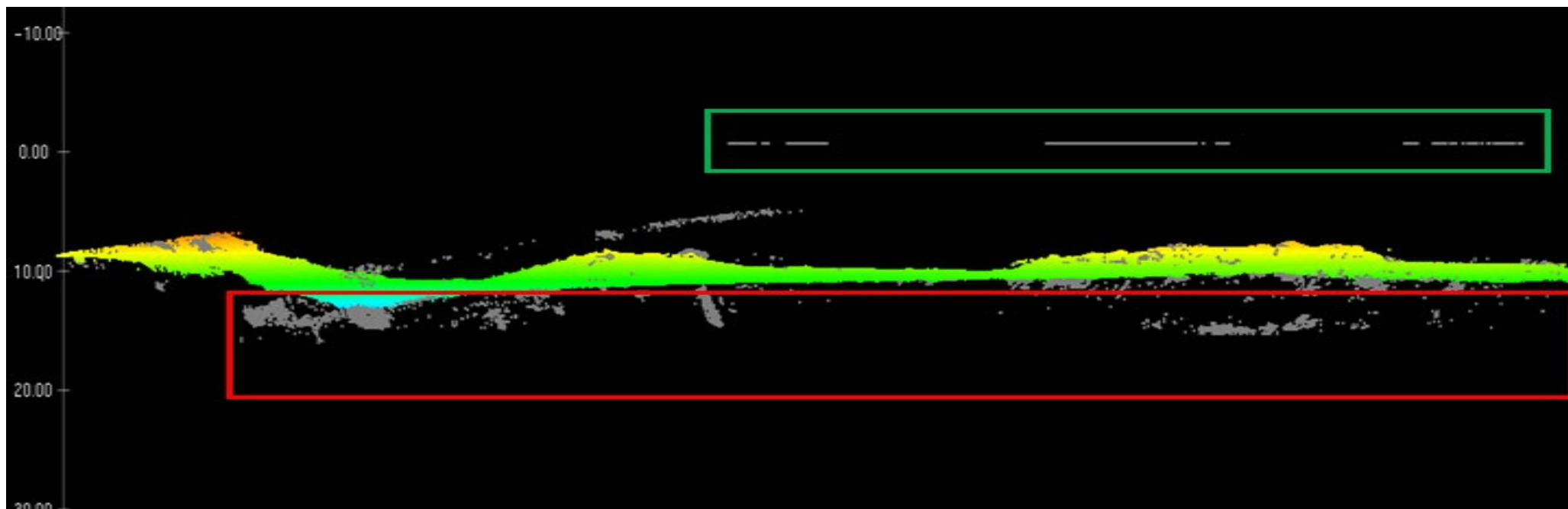
Log Viewer

TPU Analysis



Performance / Accuracy

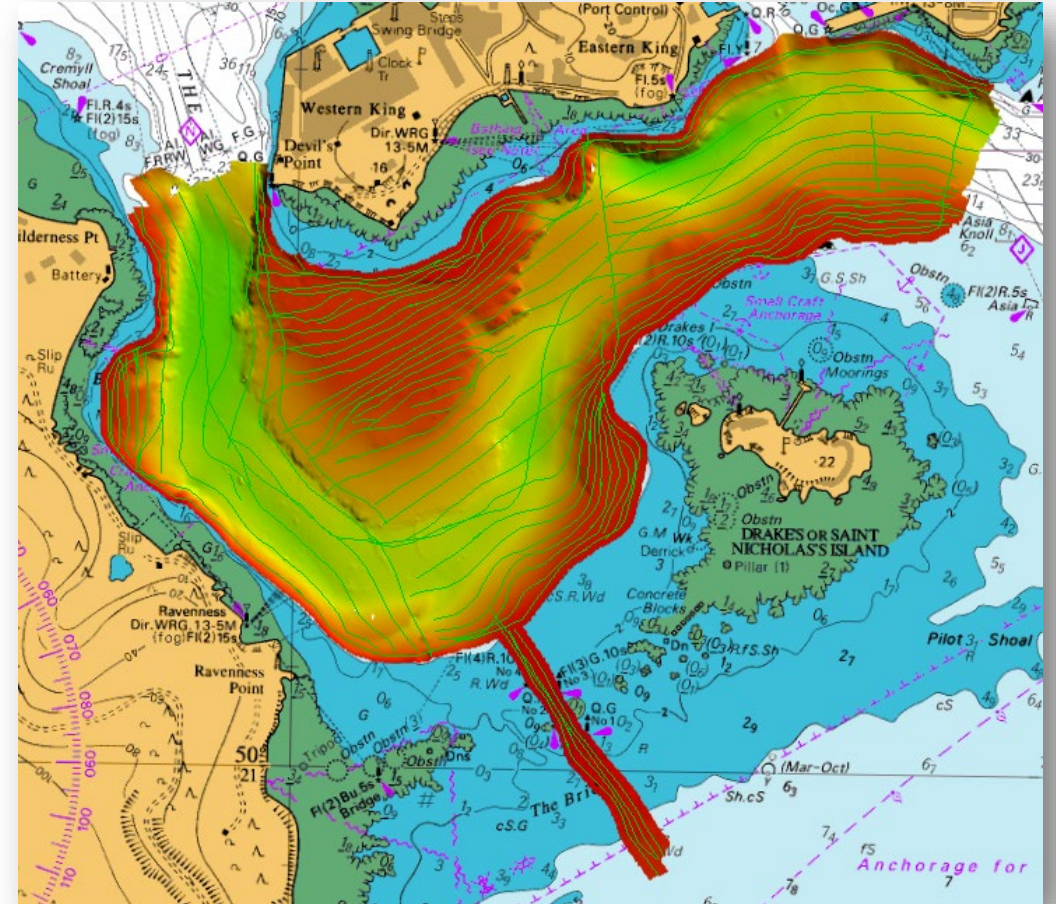
- > 97% “real” points retained
- ~95% noisy points classified



Reducing Processing Times

Shallow Survey 2015 Demo Dataset

- *Collected using Teledyne Seabat T20P*
- *Approx 175M soundings*
- *44 line km of survey*
- *Roughly 9 ½ hours online survey time*



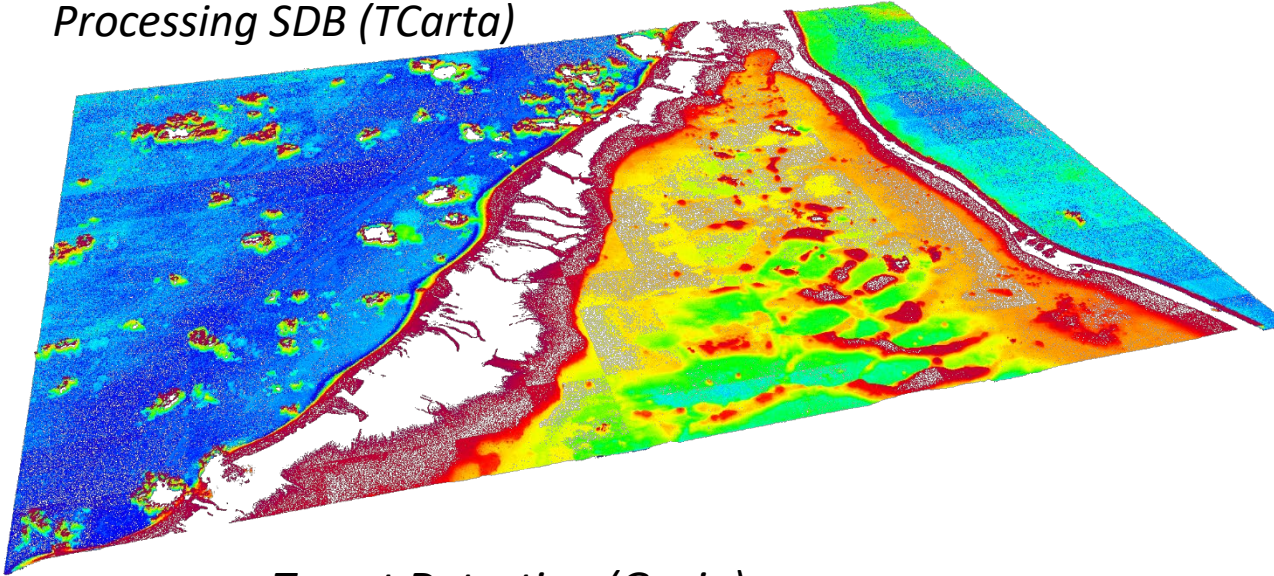
Time Trials

- Time trials (N=1, HH:MM)

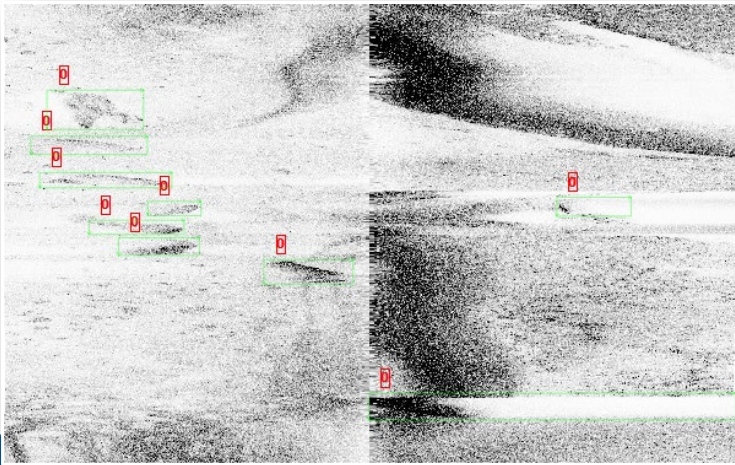
Workflow	Automatic	Manual	Total	Acquisition/Processing
Manual	00:00	05:52	05:52	1h/36m
Terrain Model Filtering	00:29	02:30	02:59	1h/20m
AI Noise Classifier	00:20	00:35	00:55	1h/6m

Other CARIS AI Initiatives

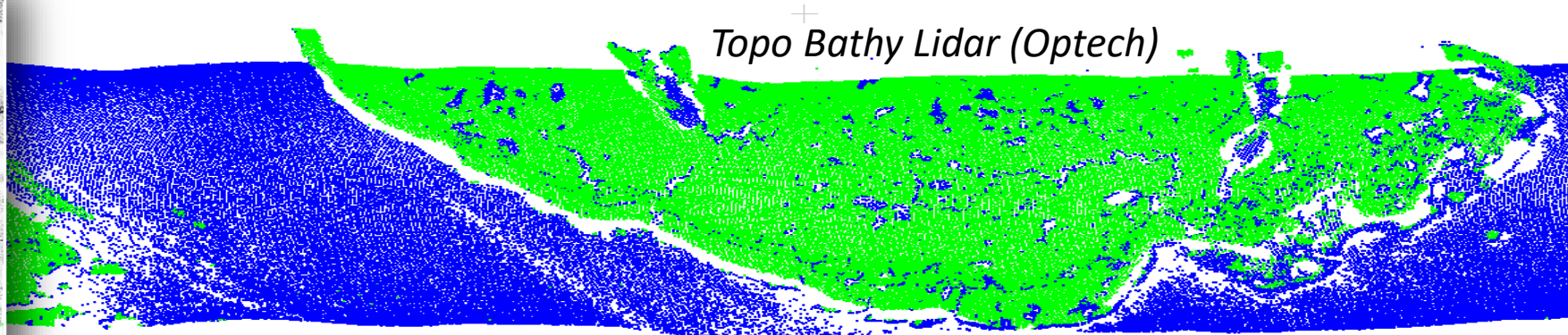
Processing SDB (TCarta)



Target Detection (Gavia)



Intruder Detection (Blueview)



Topo Bathy Lidar (Optech)

Mapping the Gaps

- Option to apply AI when contributing bathy data (e.g. DCDB website)
- Run data through Cloud based AI algorithm for noise removal
 - Providing data processing consistency
- Streamline data integration into regional and / or GEBCO grid
- Potential to use AI to make legacy data consistent
- Develop a “community” to further train the AI algorithm
 - Incentivize

Thank You
Questions?

@hydrohogg

