



Best practices for building web apps that visualize large datasets

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DEVELOPER SUMMIT

Overview

- Initial considerations
- What the JS API and ArcGIS platform do for you
- Optimizing your apps and data for better performance
 - Choosing the right layer type
 - Visualization Techniques
 - Scale-dependent filtering
 - Clustering
 - Data prep/processing
 - Reducing/generalizing features and attributes
 - Aggregation

Considerations before you start development

Jeremy Bartley



Considerations before you start development

- Know your audience
 - Just a few specialized users?
 - Public or private?
 - Potential to go viral?
- Devices
 - Desktop only?
 - Mobile and tablets
- Generalization
 - Choose an appropriate geometry type for scale
 - Reduce number of features
 - Reduce vertices



Behind the scenes

What the JS API and ArcGIS do for you



Feature tiles

Efficient, flexible, and scalable way to bring data to the client

New York Construction

▼ Query String Parameters

[view source](#)

[view URL encoded](#)

f: pbf

geometry: {"spatialReference":{"latestWkid":3857,"wkid":102100},"x

3.06989474,"ymin"

02691362}

maxRecordCountFac

outFields: CNSTRCT

outSR: 102100

quantizationParam

102100},"xmin":-8

0463991,"ymax":49

t","tolerance":38

resultType: tile

returnExceededLimi

spatialRel: esriSpat

where: CNSTRCT_YR

geometryType: esriGeometryEnvelope

inSR: 102100

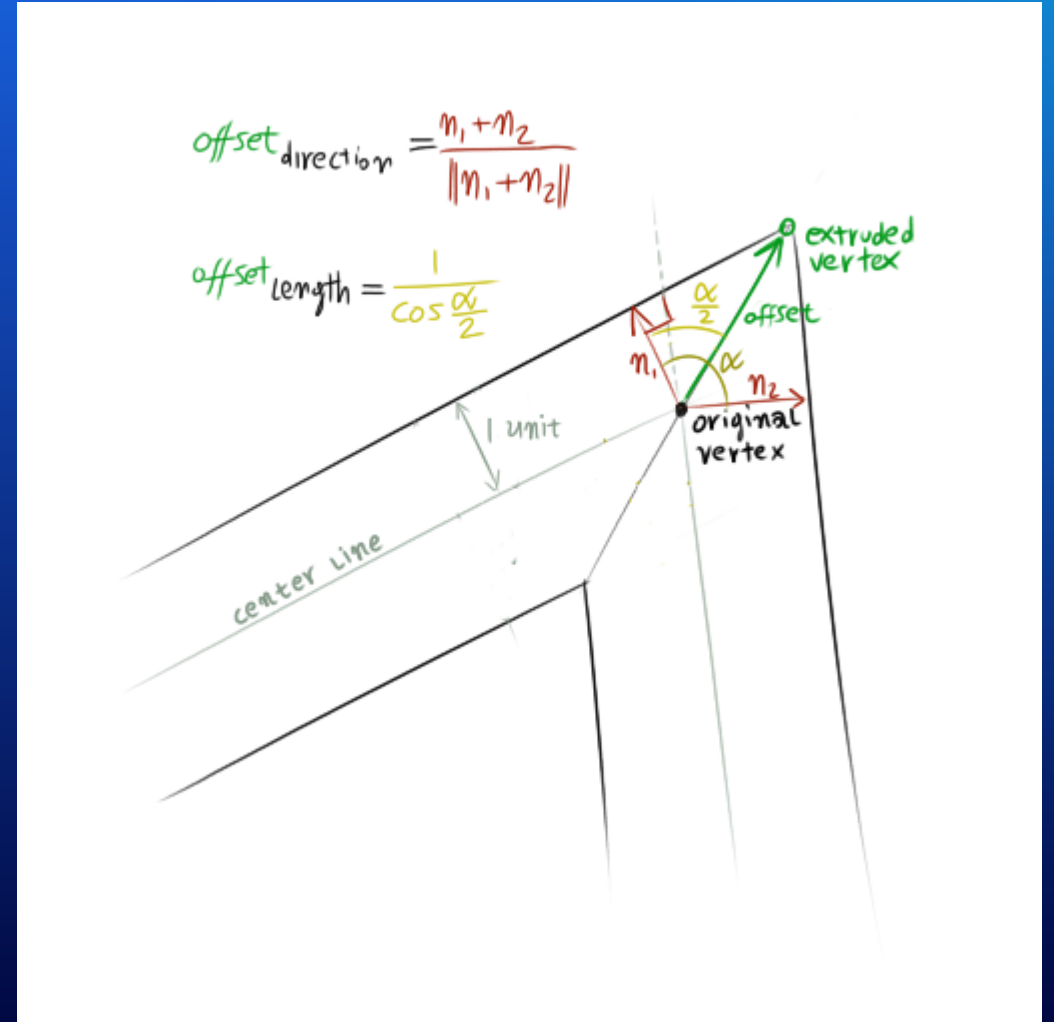
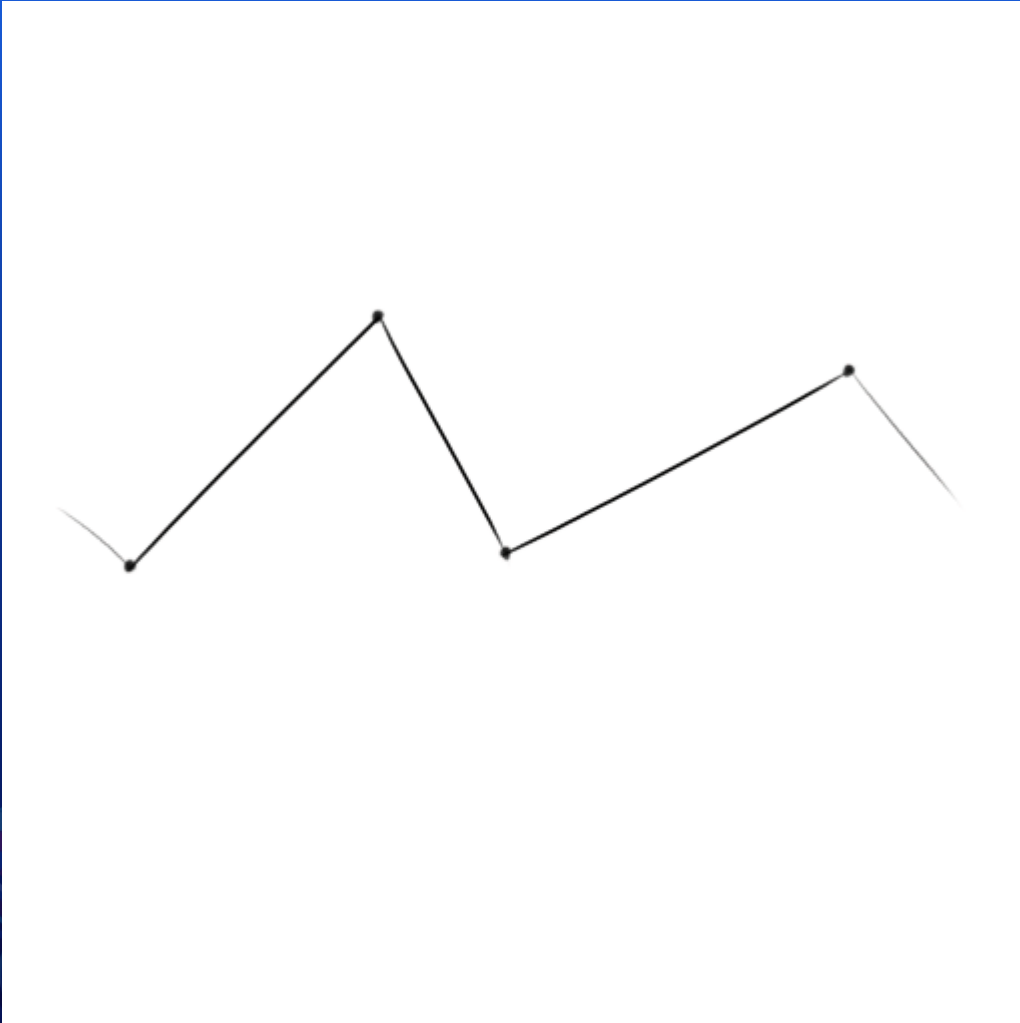
Name	Met...	St...	Pr...	Sche...	Type	Size	Time	C...	x-cache	x-esri-ftiles-ca▲	x
<input type="checkbox"/> query?f=...	GET	200	h2	https	fetch	65.2 KB	90 ms	br	Hit from cl...	true	
<input type="checkbox"/> query?f=...	GET	200	h2	https	fetch	89.6 KB	173 ms	br	Hit from cl...	true	
<input type="checkbox"/> query?f=...	GET	200	h2	https	fetch	709 B	89 ms	br	Hit from cl...	true	
<input type="checkbox"/> query?f=...	GET	200	h2	https	fetch	711 B	42 ms	br	Hit from cl...	true	
<input type="checkbox"/> query?f=...	GET	200	h2	https	fetch	710 B	100 ms	br	Hit from cl...	true	
<input type="checkbox"/> query?f=...	GET	200	h2	https	fetch	35.1 KB	57 ms	br	Hit from cl...	true	
<input type="checkbox"/> query?f=...	GET	200	h2	https	fetch	29.5 KB	79 ms	br	Hit from cl...	true	
<input type="checkbox"/> query?f=...	GET	200	h2	https	fetch	30.1 KB	245 ms	br	RefreshHit...	true	
<input type="checkbox"/> query?f=...	GET	200	h2	https	fetch	23.7 KB	230 ms	br	Miss from ...	true	
<input type="checkbox"/> query?f=...	GET	200	h2	https	fetch	50.2 KB	382 ms	br	Miss from ...	true	

Hit from cloudfront

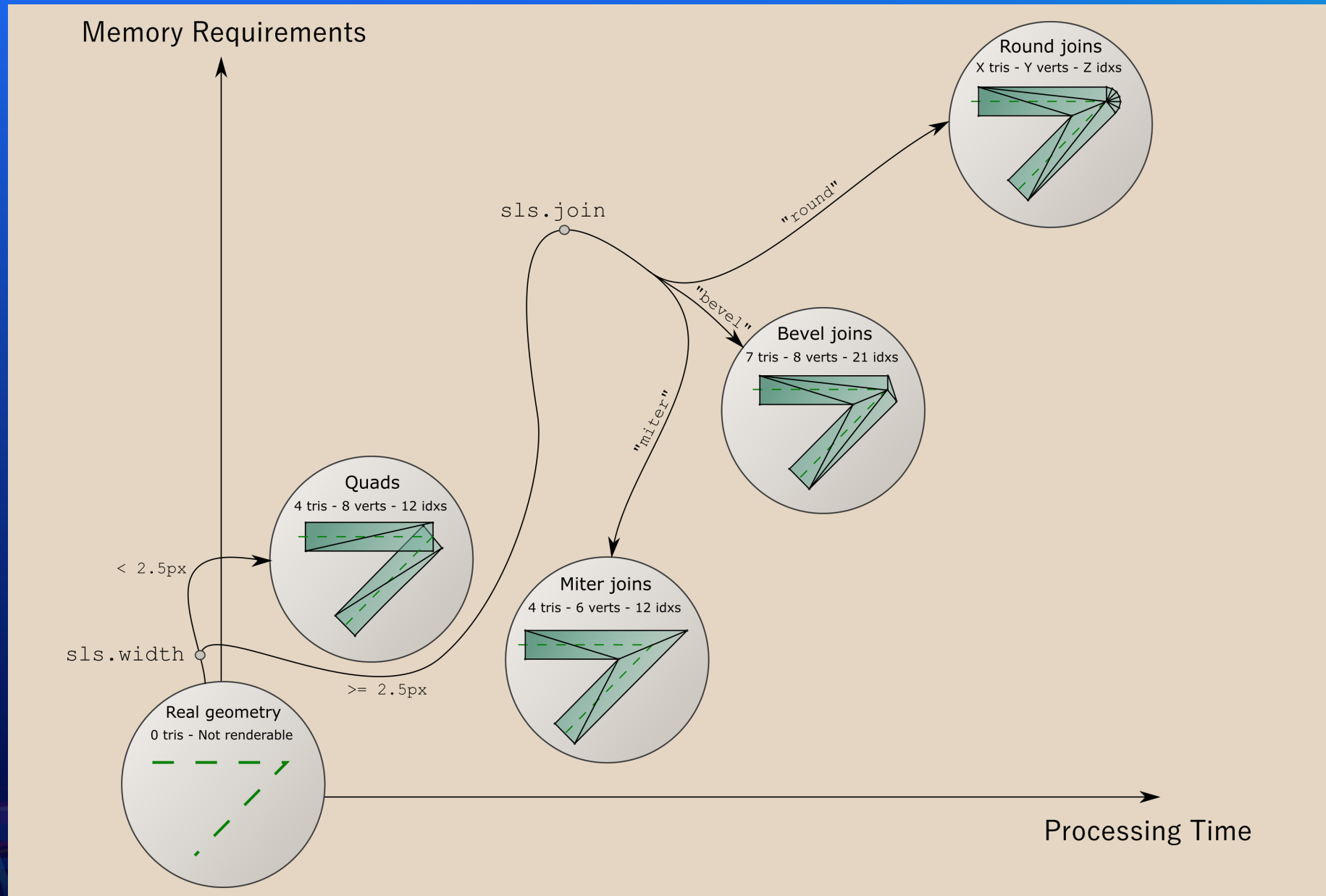
Data structure returned from feature tile query is highly efficient

```
▼ transform: {originPosition: "upperLeft", scale: [38.21851414257816, 38.21851414257816],  
  originPosition: "upperLeft"  
  ► scale: [38.21851414257816, 38.21851414257816]  
  ► translate: [-8257645.0397049915, 4970241.327216988]  
  ► fields: [{name: "CNSTRCT_YR", type: "esriFieldTypeInteger", alias: "CNSTRCT_YR"}]  
▼ features: [{attributes: {CNSTRCT_YR: 1925, OBJECTID_1: 42064}, geometry: {rings: [[[166, 392], [0, 1], [-1, -1], [1, 0]]]}},  
  ...]  
▼ [0 ... 99]  
  ▼ 0: {attributes: {CNSTRCT_YR: 1925, OBJECTID_1: 42064}, geometry: {rings: [[[166, 392], [0, 1], [-1, -1], [1, 0]]]}}  
    ► attributes: {CNSTRCT_YR: 1925, OBJECTID_1: 42064}  
    ▼ geometry: {rings: [[[166, 392], [0, 1], [-1, -1], [1, 0]]]}  
      ▼ rings: [[[166, 392], [0, 1], [-1, -1], [1, 0]]]  
        ▼ 0: [[166, 392], [0, 1], [-1, -1], [1, 0]]  
          ► 0: [166, 392]  
          ► 1: [0, 1]  
          ► 2: [-1, -1]  
          ► 3: [1, 0]  
        ► 1: {attributes: {CNSTRCT_YR: 1950, OBJECTID_1: 42080}, geometry: {rings: [[[166, 392], [0, 1], [-1, -1], [1, 0]]]}}  
        ...  
        ► 99: {attributes: {CNSTRCT_YR: 1925, OBJECTID_1: 42064}, geometry: {rings: [[[166, 392], [0, 1], [-1, -1], [1, 0]]]}}
```


Efficiently process and prepare features to be drawn on the graphics card



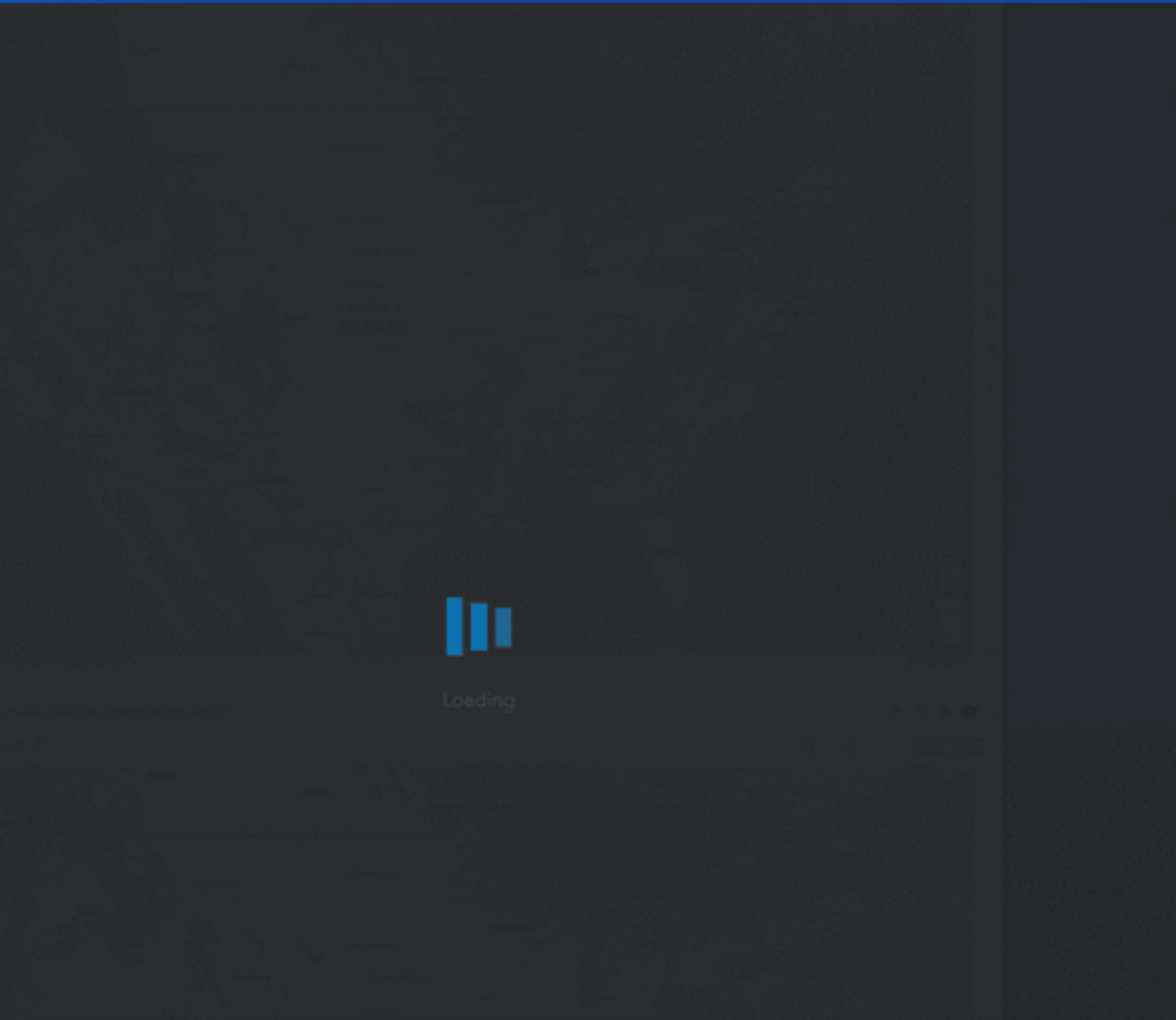
Line optimizations: balancing display quality with overall performance



PERFORMANCE

Initial load, visualizing large datasets
Continuous performance
enhancements

11





Different types of layers

Use the right layer for the job

Different layer types

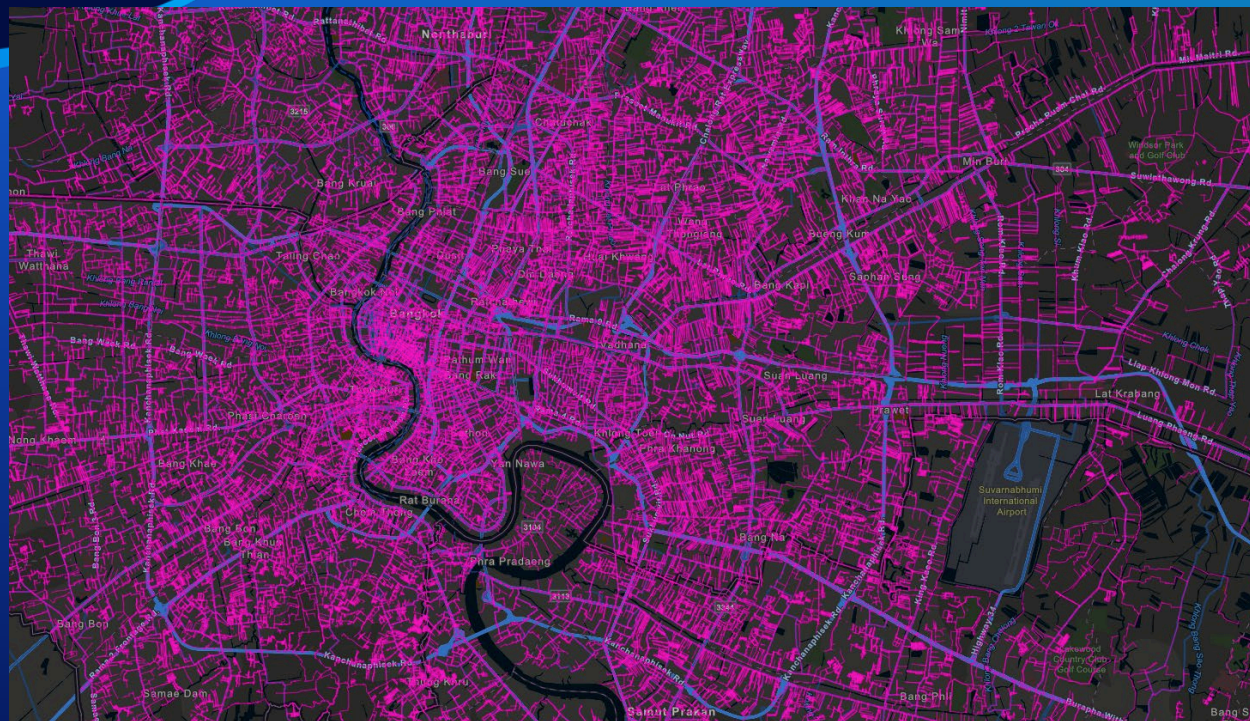
- **Feature Layers**
 - In almost all cases best layer for you to use
 - Built on the notion of shareable queries across users, across apps
 - Performance gets better as layer is used
 - Little to no effort to manage
 - Works great for interactive apps
- **Raster Tiled Layers**
 - Pregenerate raster tiles of data
 - Performance will be best of any layer type
 - Can still do popups and legends
 - Visualization cannot be controlled after built
- **Vector Tiled Layer**
 - Pregenerate vector tiles
 - Tiles include graphics and whatever attributes you included
 - Labels are dynamic
 - No legend, no popups

...Feature Layer is the best all around layer type

The background is a blue gradient with abstract, colorful geometric shapes and patterns in the lower-left and bottom-right corners. These shapes include various shades of blue, red, yellow, and green, some resembling molecular structures or data visualizations.

Visualization techniques

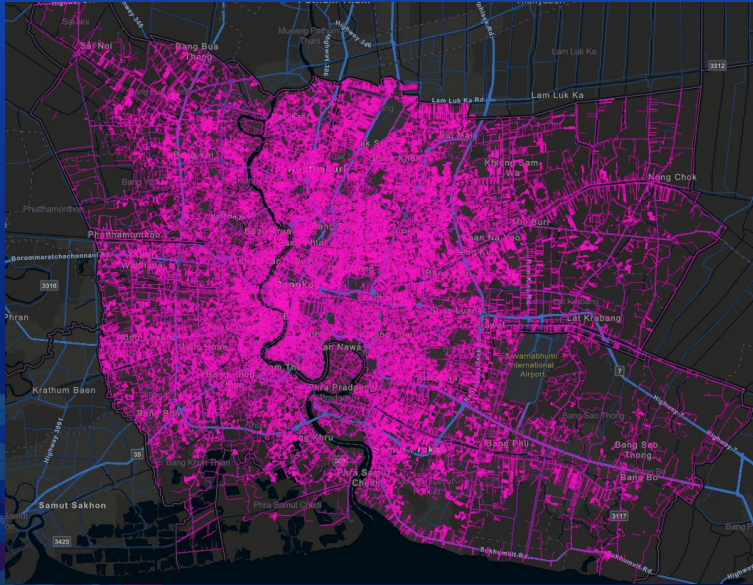
Scale-dependent filtering



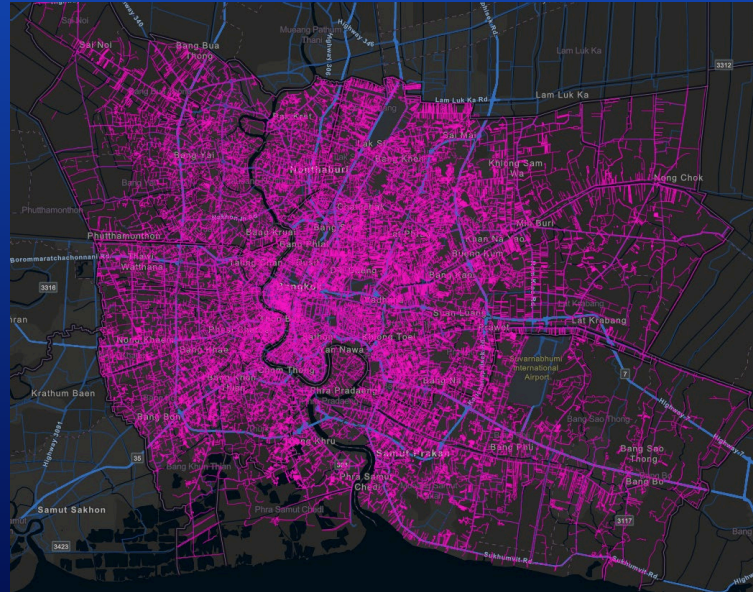
Water distribution pipes

Filter by scale using attributes

- No filter
 - 17.7 MB (uncompressed)
 - ~7s (desktop on fast network)
- Filter: pipe_size ≥ 150
 - 14.7 MB (uncompressed)
 - ~5s (desktop on fast network)
- Filter: pipe_size ≥ 300
 - 11.2 MB (uncompressed)
 - ~3s (desktop on fast network)



550,578 features

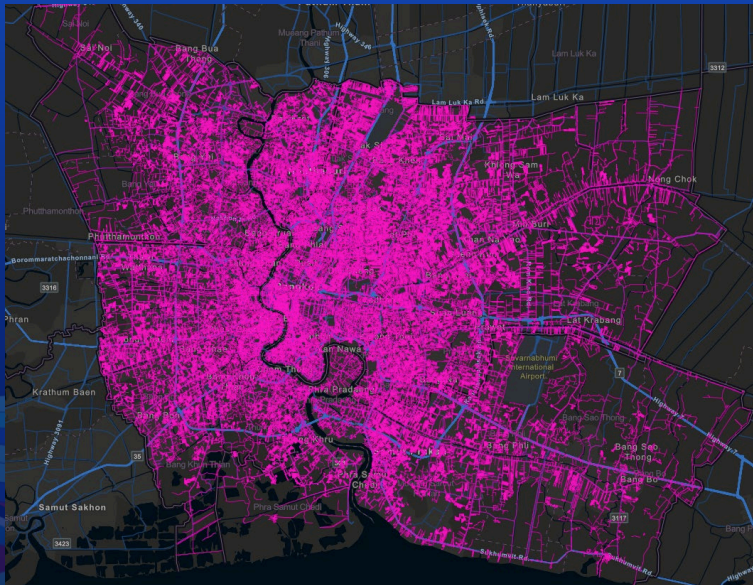


358,921 features

Still 107,256 features!

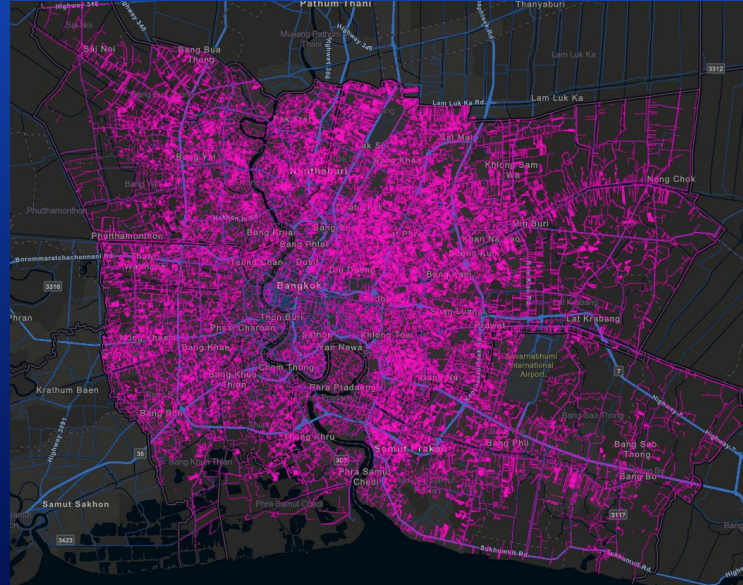
Filter by scale using view resolution

- No filter
- 17.7 MB (uncompressed)
- ~7S (desktop on fast network)



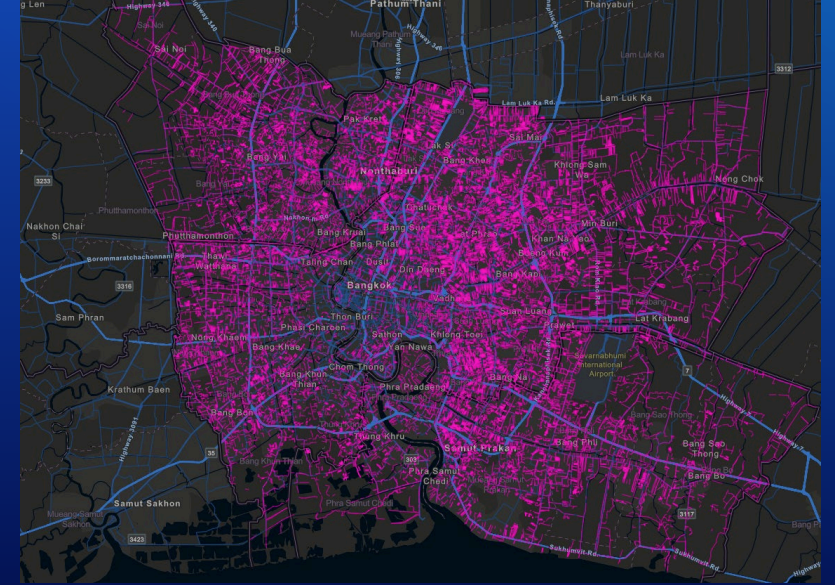
550,578 features

- $\text{view.resolution} * 2$
- 11.2 MB (uncompressed)
- ~3S (desktop on fast network)



Only 62,313 features!

- $\text{view.resolution} * 3$
- 10.5 MB (uncompressed)
- ~2.8S (desktop on fast network)



30,316 features!



Visualization techniques

Clustering



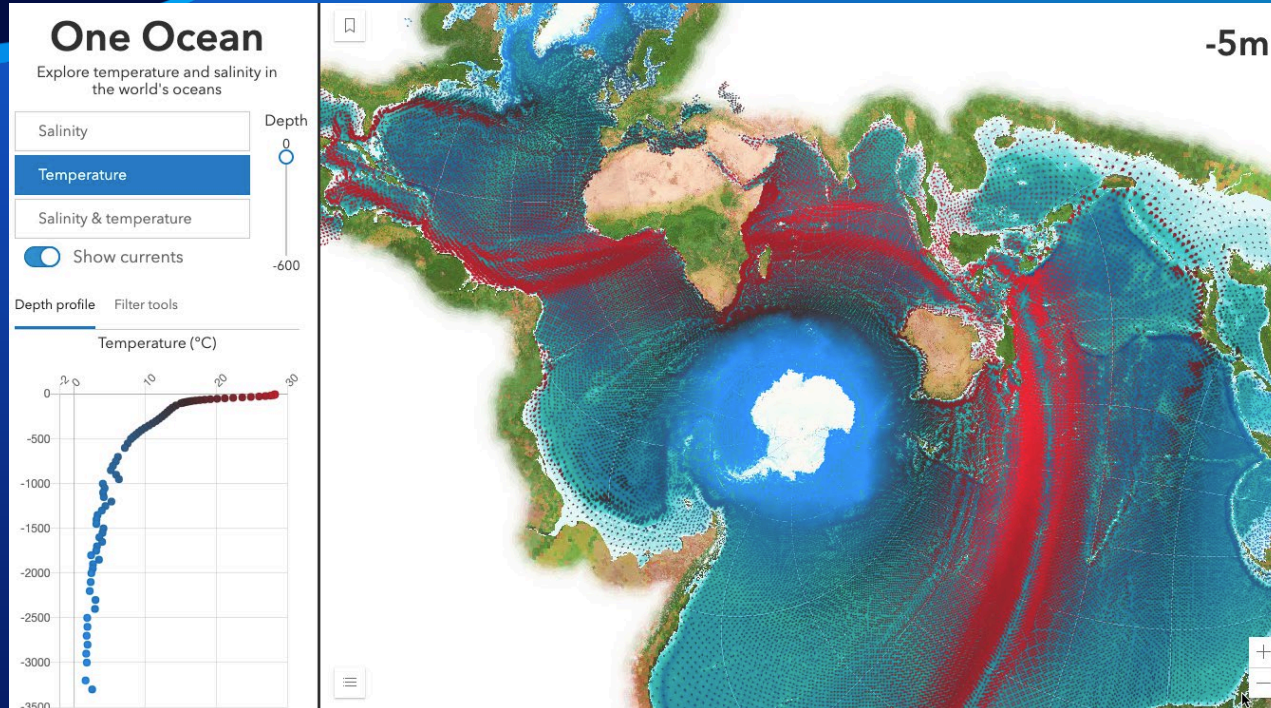
Data prep and processing

Working with different geometry types



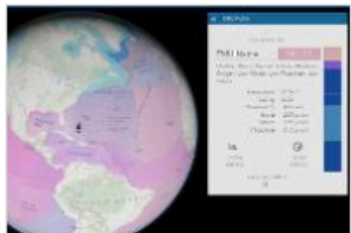
Data prep and processing

Thinning geometries and attributes



One Ocean

Kristian Ekenes



Ecological Marine Units V1, Global Oceans

Project Package

Created: Oct 2013

Living Atlas

Description

Ecological Marine Units (EMUs) for the entire world are encouraged to download and explore the data within this [Group](#) are available for download.

A group on [GeoNet](#) is available for user comments.

Terms of Use

Freely available for use!

Comments (1)



Sort by

New



Credits (Attribution)

Open in ArcGIS Pro

Download

Details

Size: 4,027 MB



Details

Size: 4,027 MB



Owner



esri_oceans

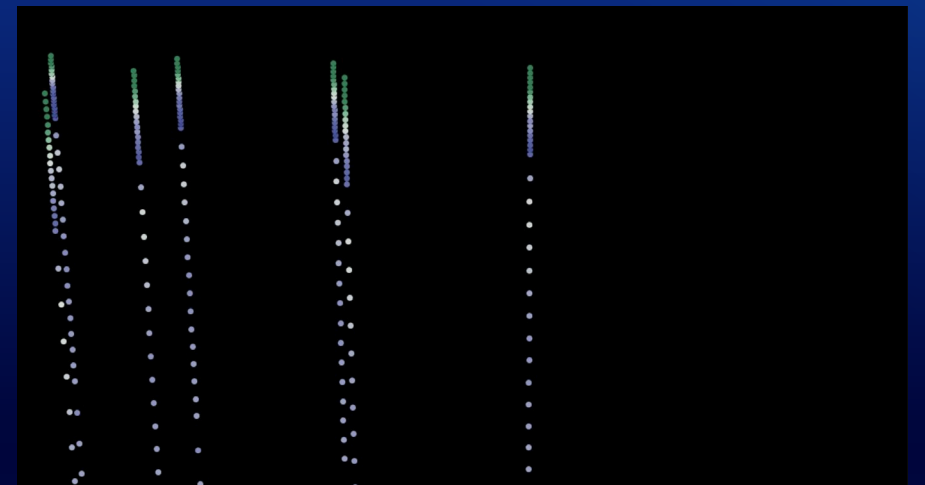
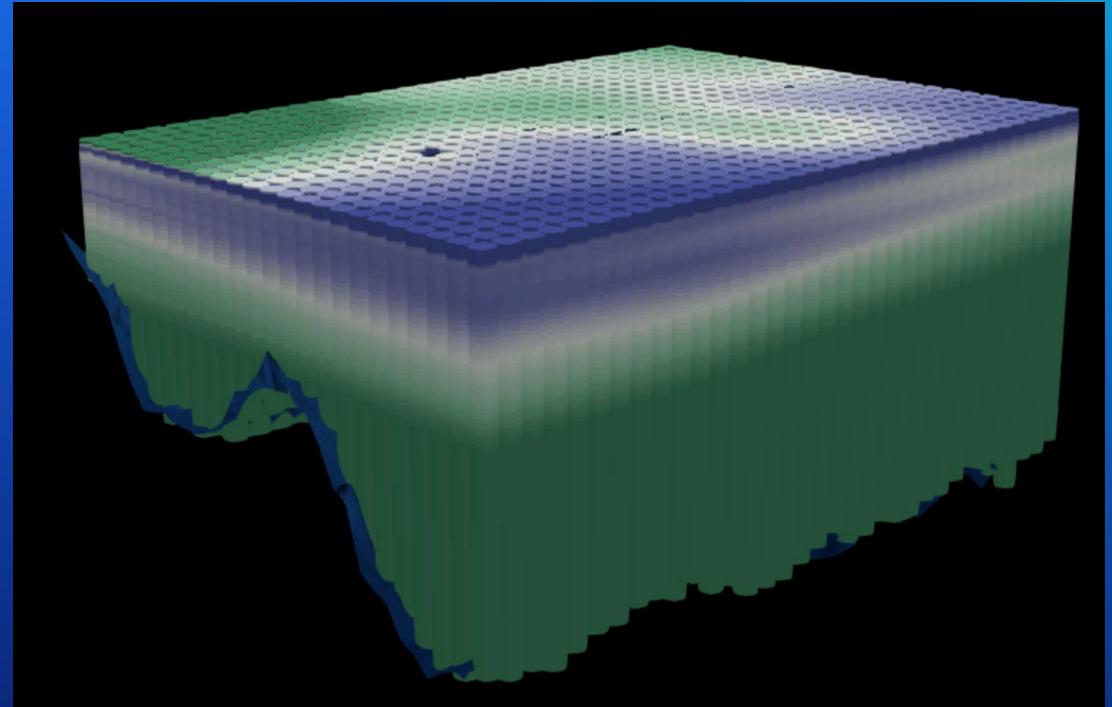
Tags

[Global Oceans](#), [EMU](#), [USGS](#), [NOAA](#), [Esri](#), [Project Package](#), [ppkx](#), [2D](#), [ArcGIS Pro](#), [3D](#), [Oceans](#), [Ocean](#), [Marine](#), [esri_oceans](#), [esri_marine](#), [Oceans3](#)

Goal: get the total download as small as possible

Know your data!

- 52 million points!
- > 4 GB of data
- Points at every $\frac{1}{4}$ degree of lat/lon
- Up to 102 points stacked at each location (from surface to ~5,000m depth)
- 12 attributes per point (temperature, salinity, phosphate, silicates, EMU cluster, etc.)



Goal: get the total download as small as possible

Step 1: Generalization

One point per x,y location

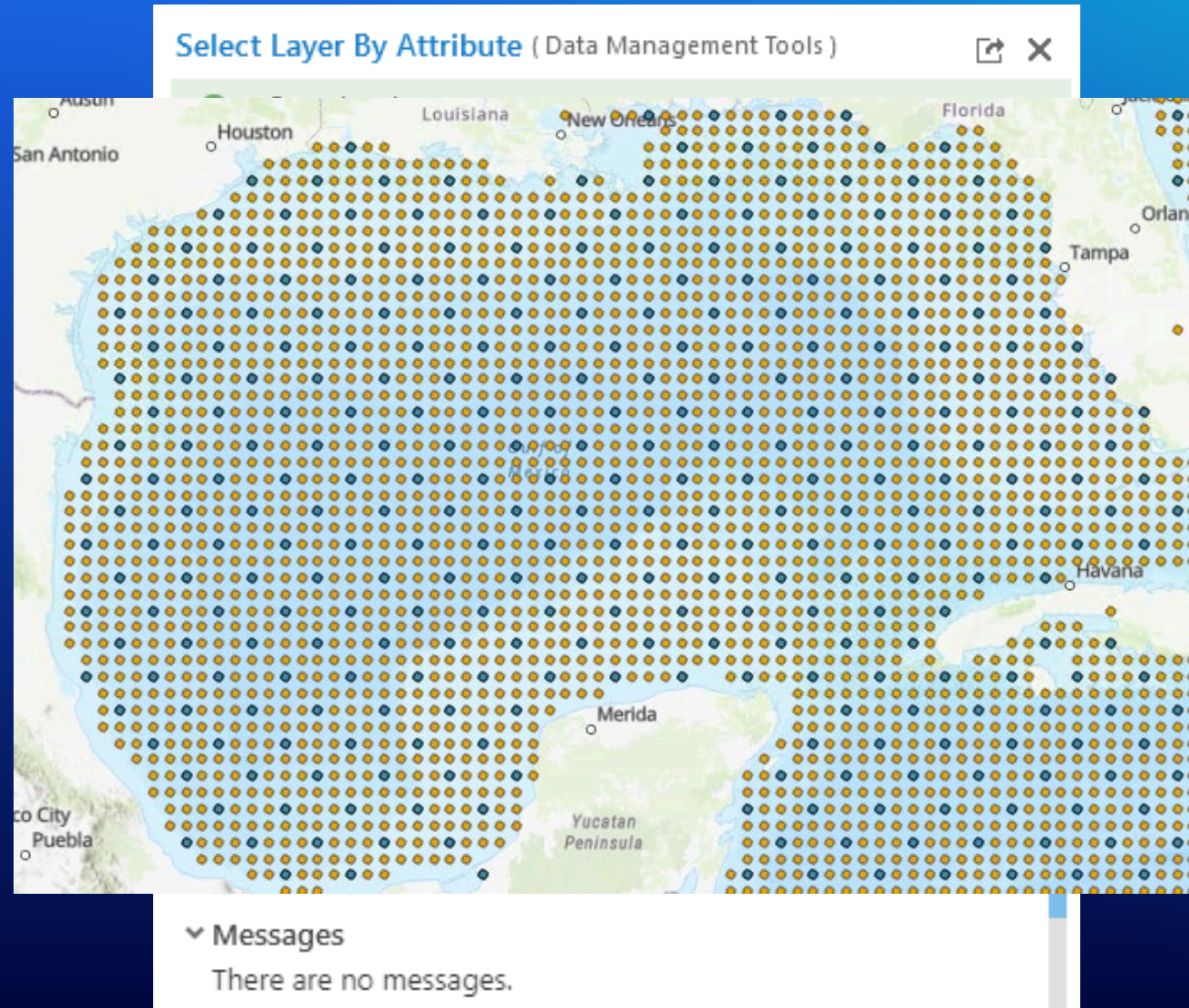
- Flatten the table
 - spatial join or
 - table pivot
- Reduced number of points to 677,109 features. Data is now one row per x,y location with fields for each attribute at each depth level.
- New problem – Now we have 1,224 fields.

<input type="checkbox"/>	silicate	silicate_1	Single
<input type="checkbox"/>	depth_lvl	depth_lvl_1	Double
<input type="checkbox"/>	Cluster37	Cluster37_1	Integer
<input type="checkbox"/>	DistFromCluster37	DistFromCluster37_1	Double
<input type="checkbox"/>	Direction	Direction_1	Single
<input type="checkbox"/>	Velocity	Velocity_1	Single
<input type="checkbox"/>	pointid	pointid_2	Integer
<input type="checkbox"/>	temp	temp_2	Single
<input type="checkbox"/>	salinity	salinity_2	Single
<input type="checkbox"/>	dissO2	dissO2_2	Single
<input type="checkbox"/>	nitrate	nitrate_2	Single
<input type="checkbox"/>	phosphate	phosphate_2	Single
<input type="checkbox"/>	silicate	silicate_2	Single
<input type="checkbox"/>	depth_lvl	depth_lvl_2	Double
<input type="checkbox"/>	Cluster37	Cluster37_2	Integer
<input type="checkbox"/>	DistFromCluster37	DistFromCluster37_2	Double
<input type="checkbox"/>	Direction	Direction_2	Single

Goal: get the total download as small as possible

Step 2: Generalization Geometry thinning

- Thin points to every $\frac{1}{2}$ degree ($\frac{1}{4}$ degree resolution is too high for worldwide views)
- Reduced number of points to **84,711** features! A reasonable number to work with.



Goal: get the total download as small as possible



Goal: get the total download as small as possible

Step 3: Reduce columns

Attribute thinning

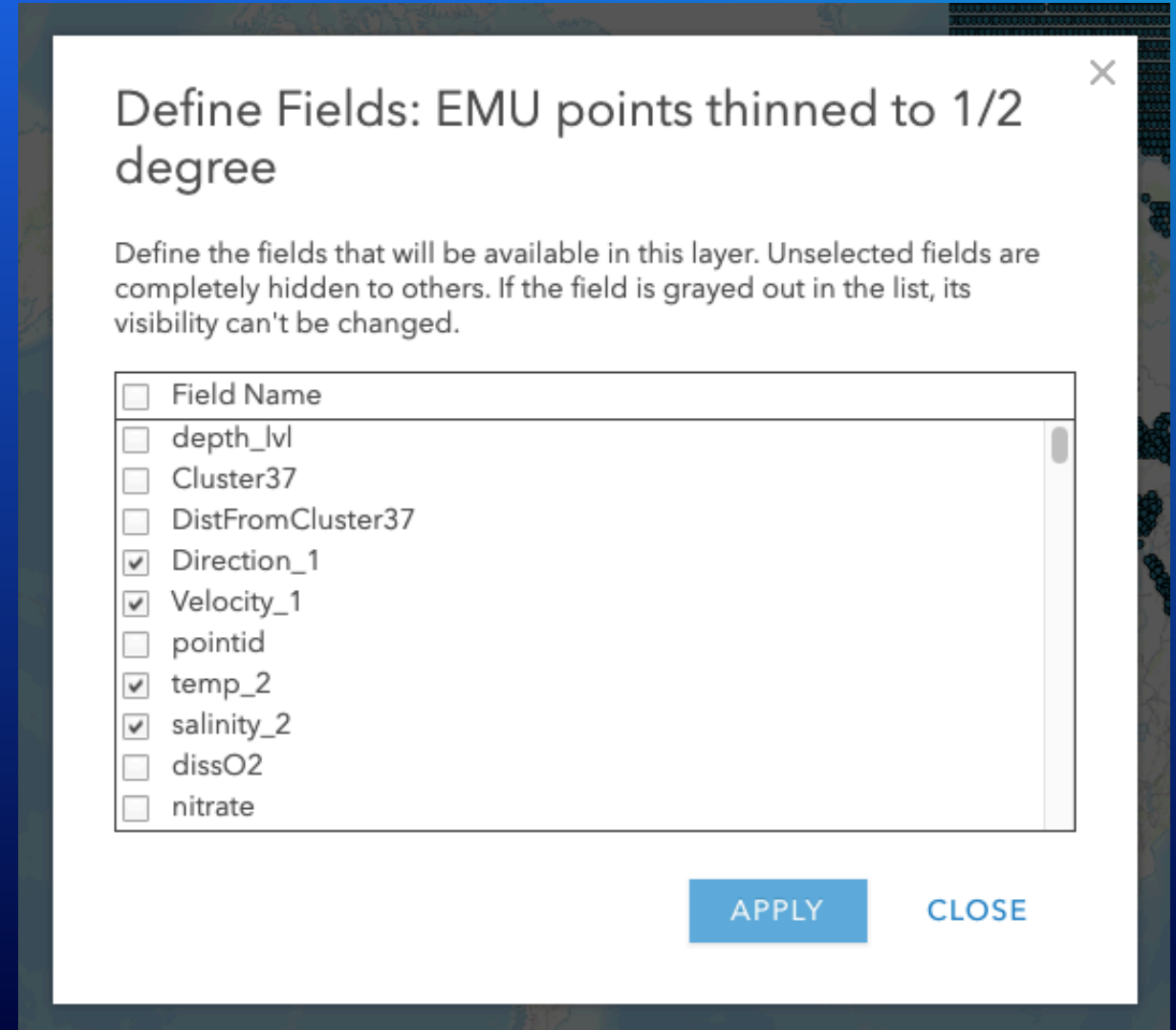
- Feature Services limit you to 1,024 fields.
- I removed ~300 fields and was able to publish the service.
- Remaining problems:
 - 960 fields is still too much data to work with on the client.
 - Setting outFields to one attribute for every depth level results in huge query string requiring the POST method (not cacheable)

<input type="checkbox"/>	Velocity	Velocity_79	Single
<input type="checkbox"/>	pointid	pointid_80	Integer
<input type="checkbox"/>	temp	temp_80	Single
<input type="checkbox"/>	salinity	salinity_80	Single
<input type="checkbox"/>	dissO2	dissO2_80	Single
<input type="checkbox"/>	nitrate	nitrate_80	Single
<input type="checkbox"/>	phosphate	phosphate_80	Single
<input type="checkbox"/>	silicate	silicate_80	Single
<input type="checkbox"/>	depth_lvl	depth_lvl_80	Double
<input type="checkbox"/>	QtrDegreeID	QtrDegreeID_80	Integer
<input type="checkbox"/>	Cluster37	Cluster37_80	Integer
<input type="checkbox"/>	DistFromCluster37	DistFromCluster37_80	Double
<input type="checkbox"/>	Direction	Direction_80	Single
<input type="checkbox"/>	Velocity	Velocity_80	Single
<input type="checkbox"/>	longitude	x_coord	Double
<input type="checkbox"/>	latitude	y_coord	Double

Goal: get the total download as small as possible

Step 3: Reduce columns Attribute thinning

- Create hosted Feature View and restrict fields to only the ones you need.
- Now we have ~300 fields (useable)
- Queries can request outFields using ["*"], which can be cached.
- Set maxAge on tiles to 1 hour.
- Now we have a manageable dataset we can work with in the browser!



Define Fields: EMU points thinned to 1/2 degree

Define the fields that will be available in this layer. Unselected fields are completely hidden to others. If the field is grayed out in the list, its visibility can't be changed.

<input type="checkbox"/> Field Name
<input type="checkbox"/> depth_lvl
<input type="checkbox"/> Cluster37
<input type="checkbox"/> DistFromCluster37
<input checked="" type="checkbox"/> Direction_1
<input checked="" type="checkbox"/> Velocity_1
<input type="checkbox"/> pointid
<input checked="" type="checkbox"/> temp_2
<input checked="" type="checkbox"/> salinity_2
<input type="checkbox"/> dissO2
<input type="checkbox"/> nitrate

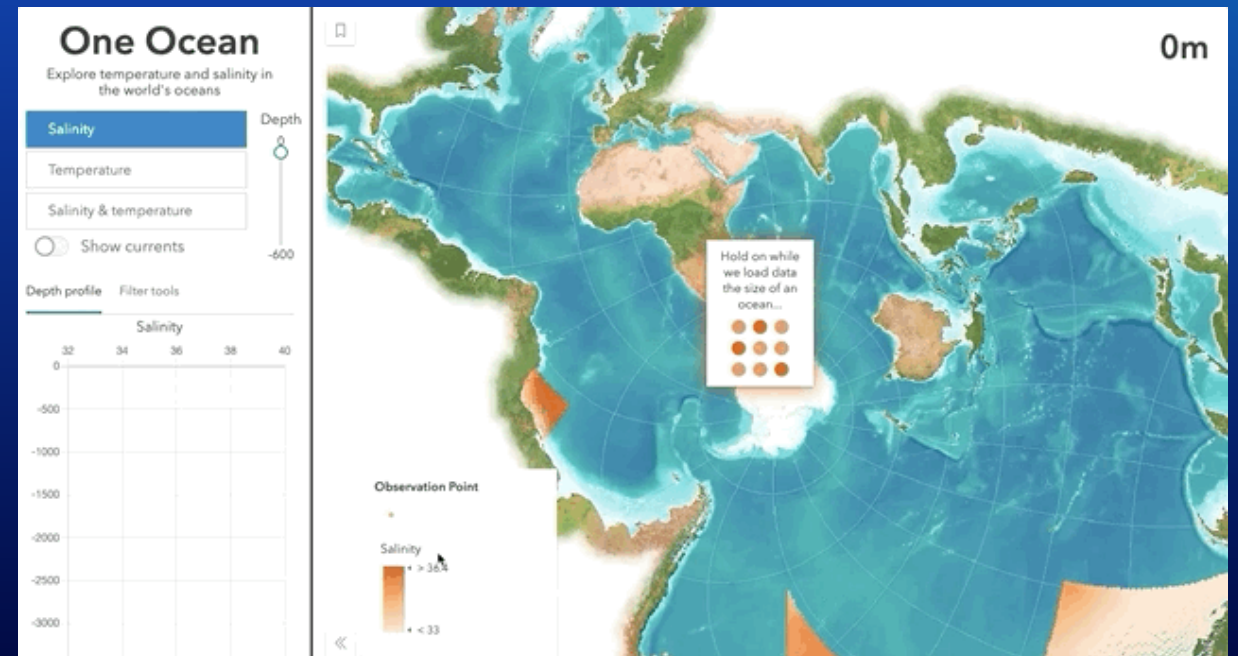
APPLY CLOSE

Goal: get the total download as small as possible

Step 4: Request data up front For client-side goodness

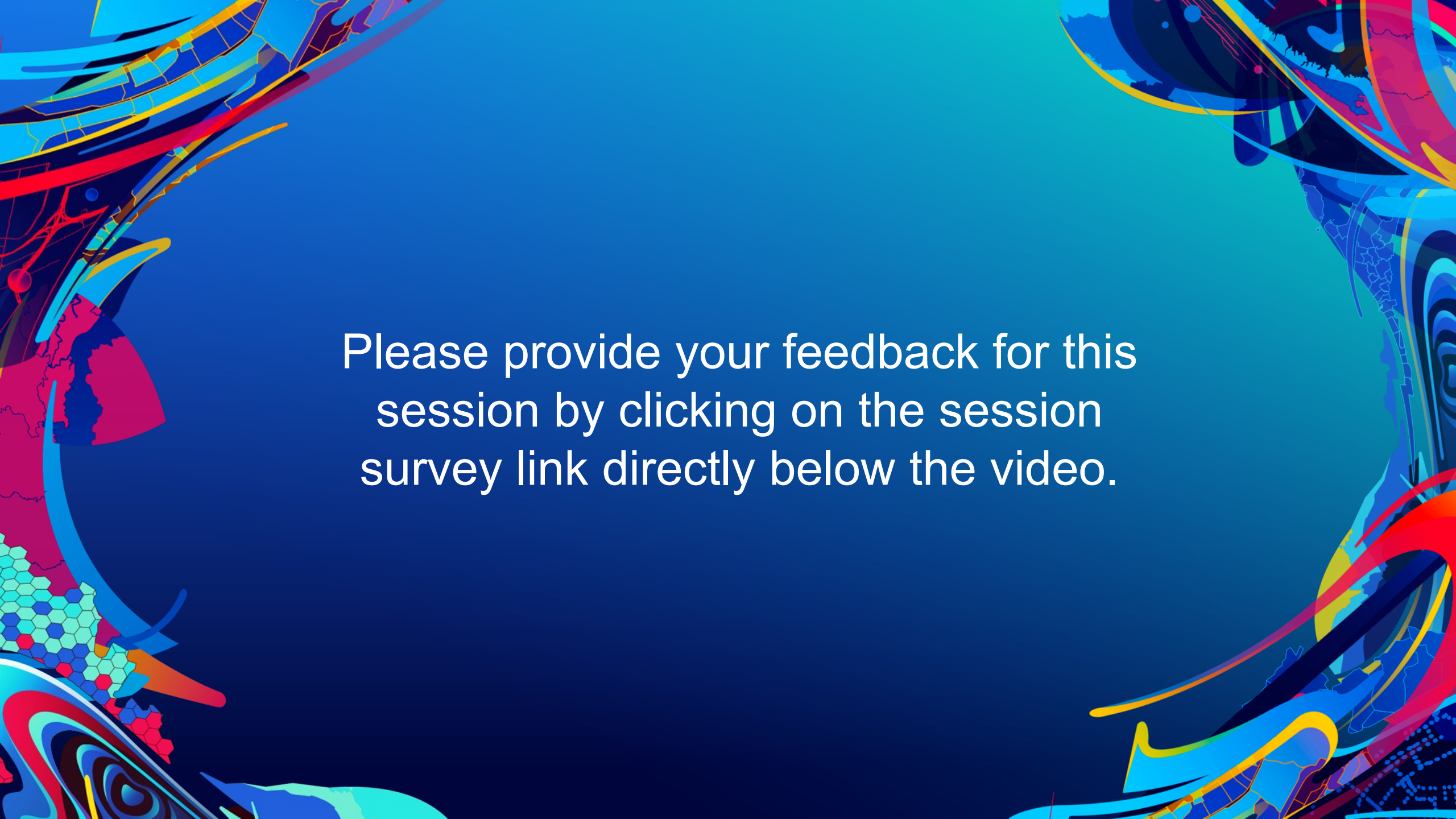
- Now we have a manageable dataset we can work with in the browser!
- Costs:
 - Still loads 280 MB of data!
 - Not useable for mobile devices
 - Initial load time is longer, but...
 - UX is a lot nicer once the data loads.

```
const emuLayer = new FeatureLayer({
  title: "Observation Point",
  portalItem: {
    id: "06de2b96a7fa42d5891c4e79e17dd347",
    portal: { ...
  },
  outFields: ["*"],
  popupEnabled: false
});
```



Conclusion

- The ArcGIS platform does a lot behind the scenes to optimize your data and apps when loading large amounts of data, but
- YOU can do more to optimize your apps and data for better performance
 - Choosing the right layer type
 - Visualization Techniques
 - Scale-dependent filtering
 - Clustering
 - Data prep/processing
 - Reducing/generalizing features and attributes
 - Aggregation

The background is a vibrant, abstract composition. It features a central area of solid blue and teal. The left and right sides are framed by complex, colorful patterns. On the left, there are swirling shapes in red, yellow, and blue, along with a section of a hexagonal grid in shades of green and blue. On the right, there are more swirling patterns in blue, red, and yellow, with some darker, more intricate designs. The overall effect is dynamic and modern.

Please provide your feedback for this session by clicking on the session survey link directly below the video.



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