

A satellite view of Earth from space, showing the Western Hemisphere. The United States and Canada are visible in the upper half, with the Pacific Ocean to the west. The lower half shows the Eastern Hemisphere, including parts of Asia and Australia. The image is centered on the equator, showing the curvature of the planet and the distribution of land and water.

Ecosystem Services, part 3: Sediment Retention

The Science

- Underneath each InVEST model, there is a large literature and synthesized science
 - Here is a small excerpt related to sedimentation
- Too much content to cover here, but is in the extensive Users Guide
 - Instead, I will present a quick “stylized version” of what’s being computed.

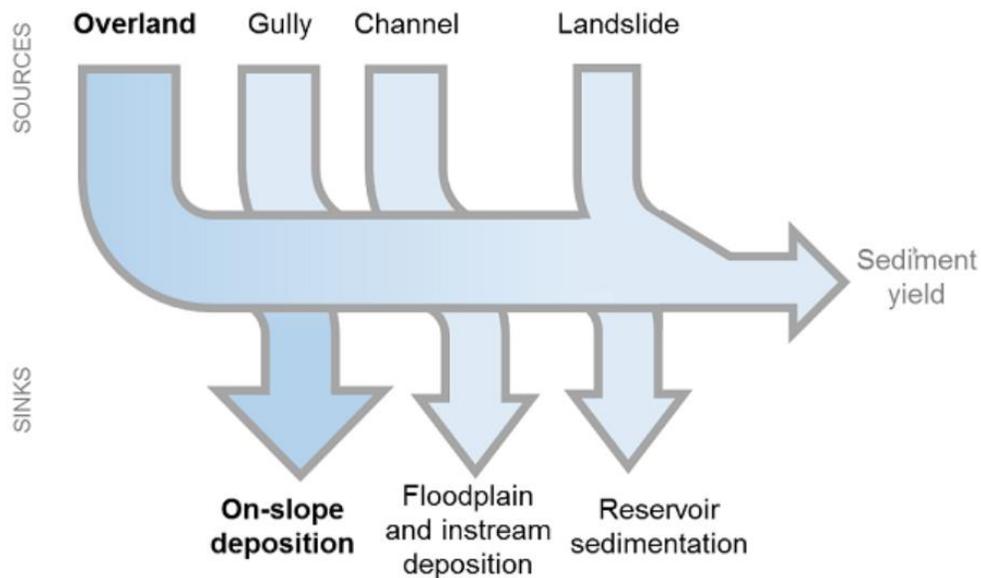


Figure 1. General catchment sediment budget. The relative size of the arrows changes depending on the environment. The InVEST model focuses on the overland sources and sinks, and does not include the others.

Annual Soil Loss

The amount of annual soil loss on pixel i , $usle_i$ (units: $tons \cdot ha^{-1}yr^{-1}$), is given by the Revised Universal Soil Loss Equation (RUSLE1 - Renard et al. 1997):

$$usle_i = R_i \cdot K_i \cdot LS_i \cdot C_i \cdot P_i, \quad (69)$$

where

- R_i is rainfall erosivity (units: $MJ \cdot mm(ha \cdot hr \cdot yr)^{-1}$),
- K_i is soil erodibility (units: $ton \cdot ha \cdot hr(MJ \cdot ha \cdot mm)^{-1}$),
- LS_i is a slope length-gradient factor (unitless)
- C_i is a cover-management factor (unitless)
- and P_i is a support practice factor (Renard et al., 1997). (cf. also in (Bhattarai and Dutta, 2006)). (unitless)

The LS_i factor is given from the method developed by Desmet and Govers (1996) for a two-dimensional surface:

$$LS_i = S_i \frac{(A_{i-in} + D^2)^{m+1} - A_{i-in}^{m+1}}{D^{m+2} \cdot x_i^m \cdot (22.13)^m} \quad (70)$$

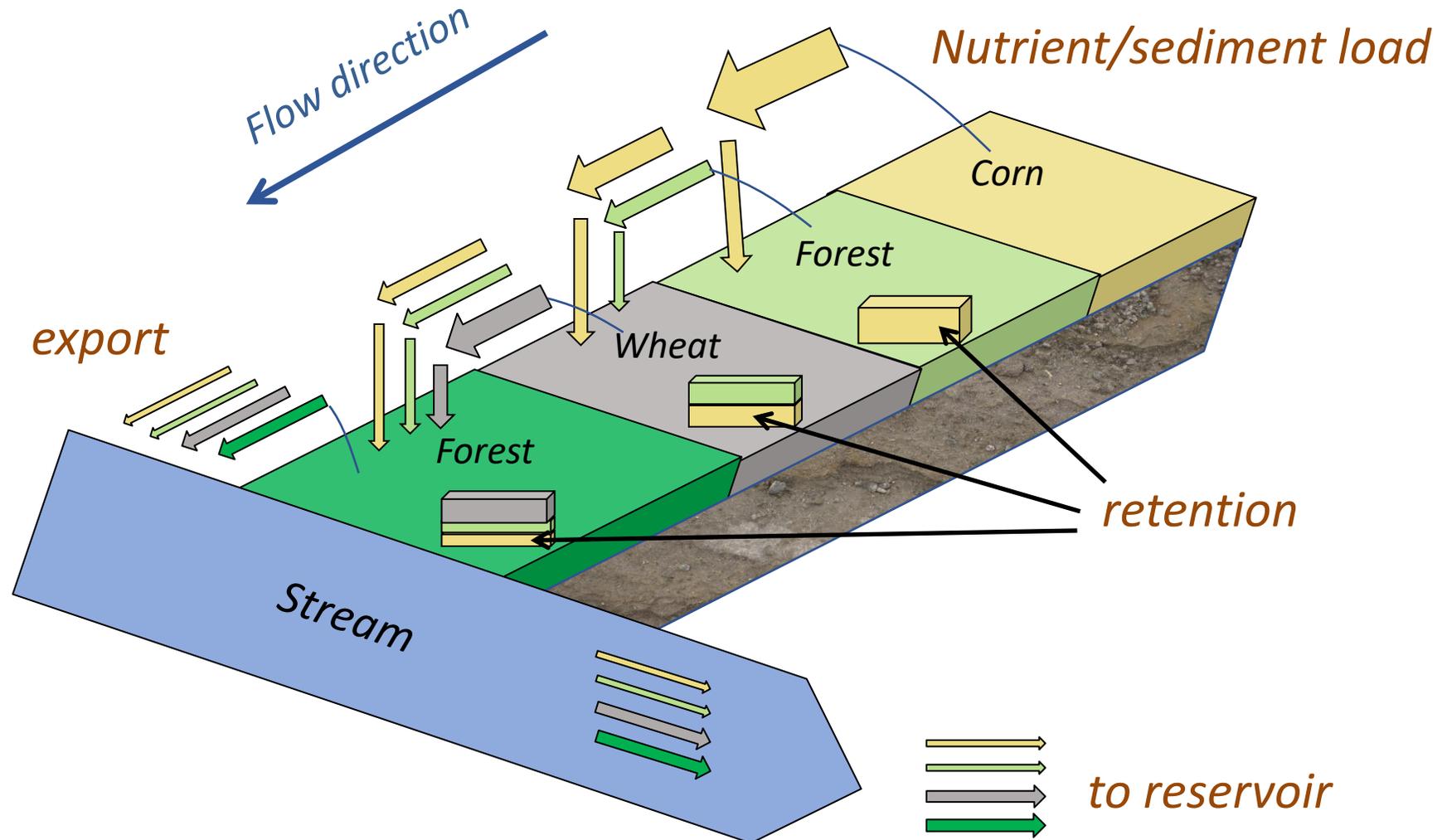
where

- S_i is the slope factor for grid cell i calculated as a function of slope. s is the percentage slope and θ is the slope in degrees (Renard et al. 1997):

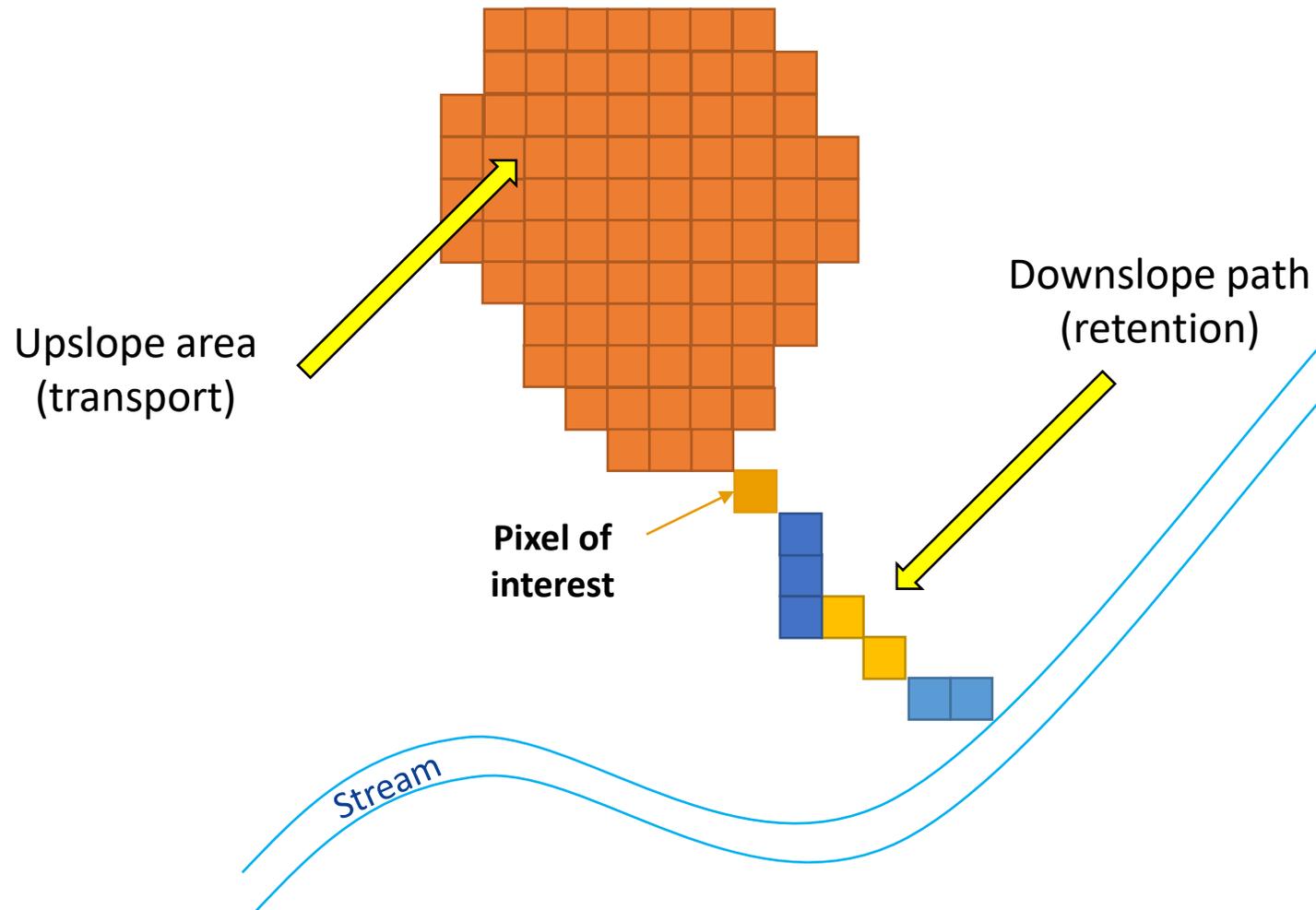
$$S = \begin{cases} 10.8 \cdot \sin(\theta) + 0.03, & \text{where } s < 9\% \\ 16.8 \cdot \sin(\theta) - 0.50, & \text{where } s \geq 9\% \end{cases}$$

- A_{i-in} is the contributing area (m^2) at the inlet of a grid cell which is computed from the Multiple-Flow Direction method
- D is the grid cell linear dimension (m)
- x_i is the mean of aspect weighted by proportional outflow from grid cell i determined by a Multiple-Flow Direction algorithm. It is calculated by

Sedimentation on a *very* simple LULC map



Transport/retention



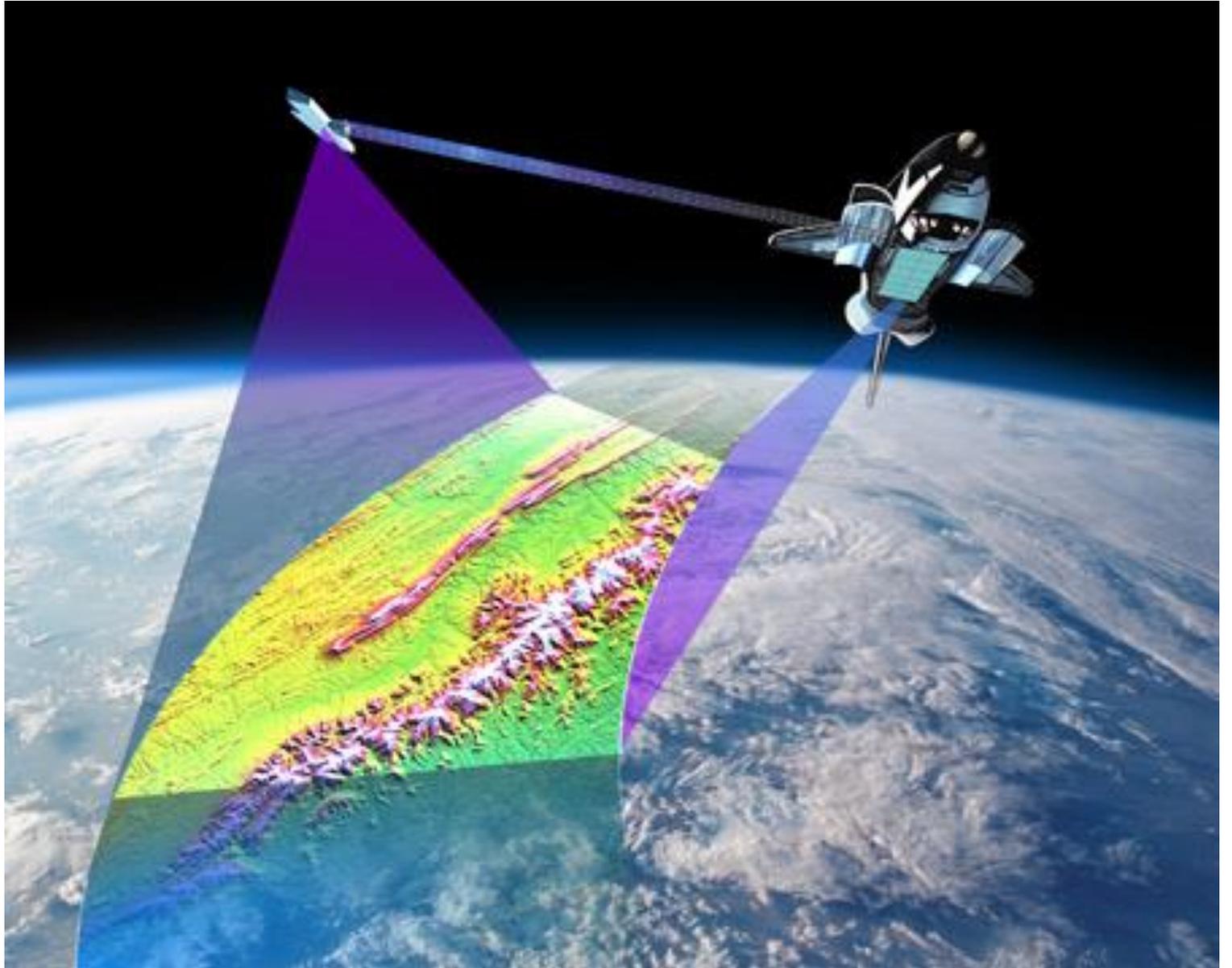
This is calculated for EACH pixel on the landscape

Per pixel:
 $SedimentExport (ton/yr) = USLE \times SDR$

Total export (ton/yr) =
 $\sum_{pixel} SedimentExport$

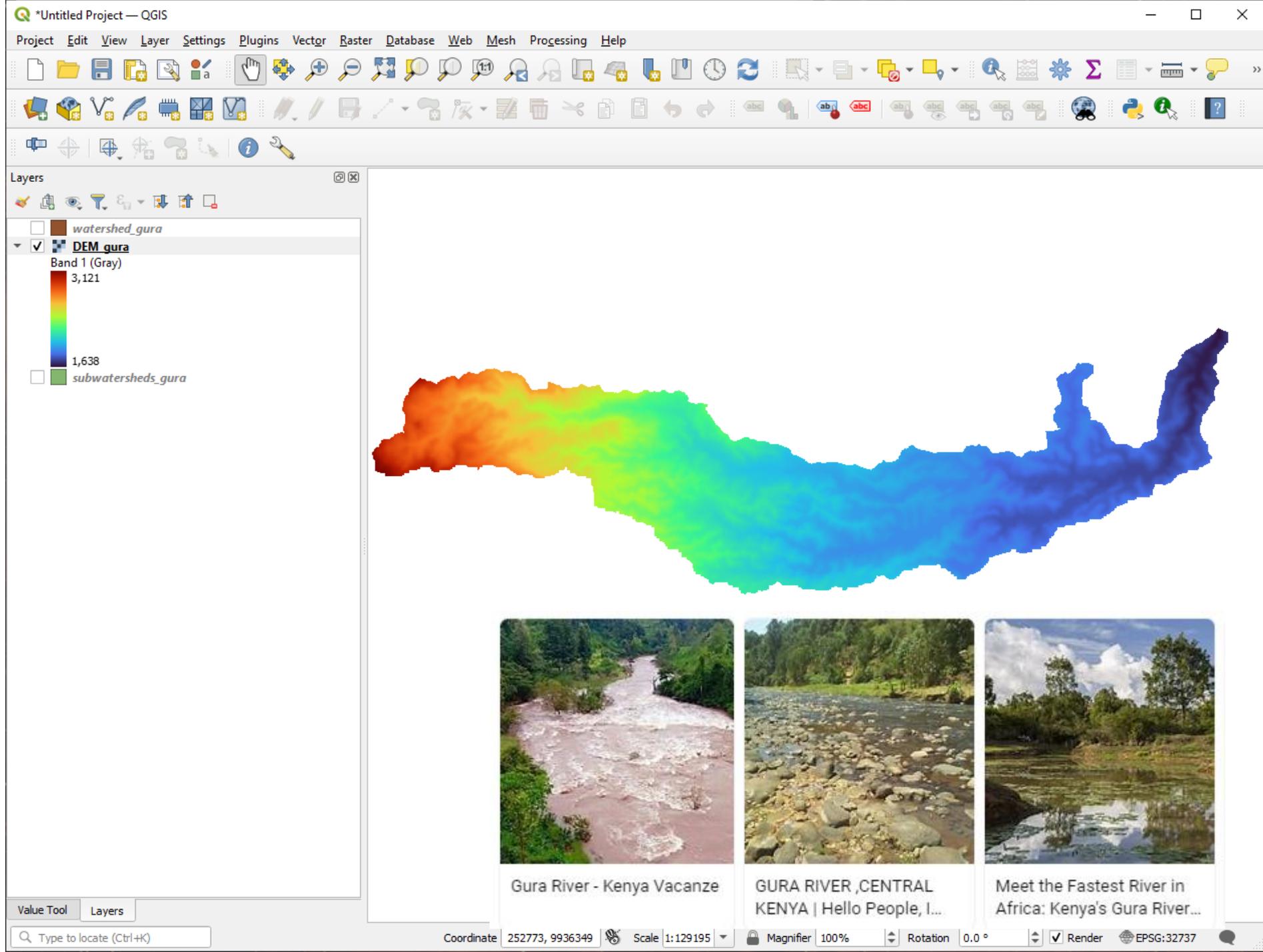
Hydrological routing depends on the topography of the area

- DEM: Digital Elevation model
- Literally from the Space Shuttle!
 - Basically shoots lasers at the same spot from two different directions to get a very precise elevation measurement.



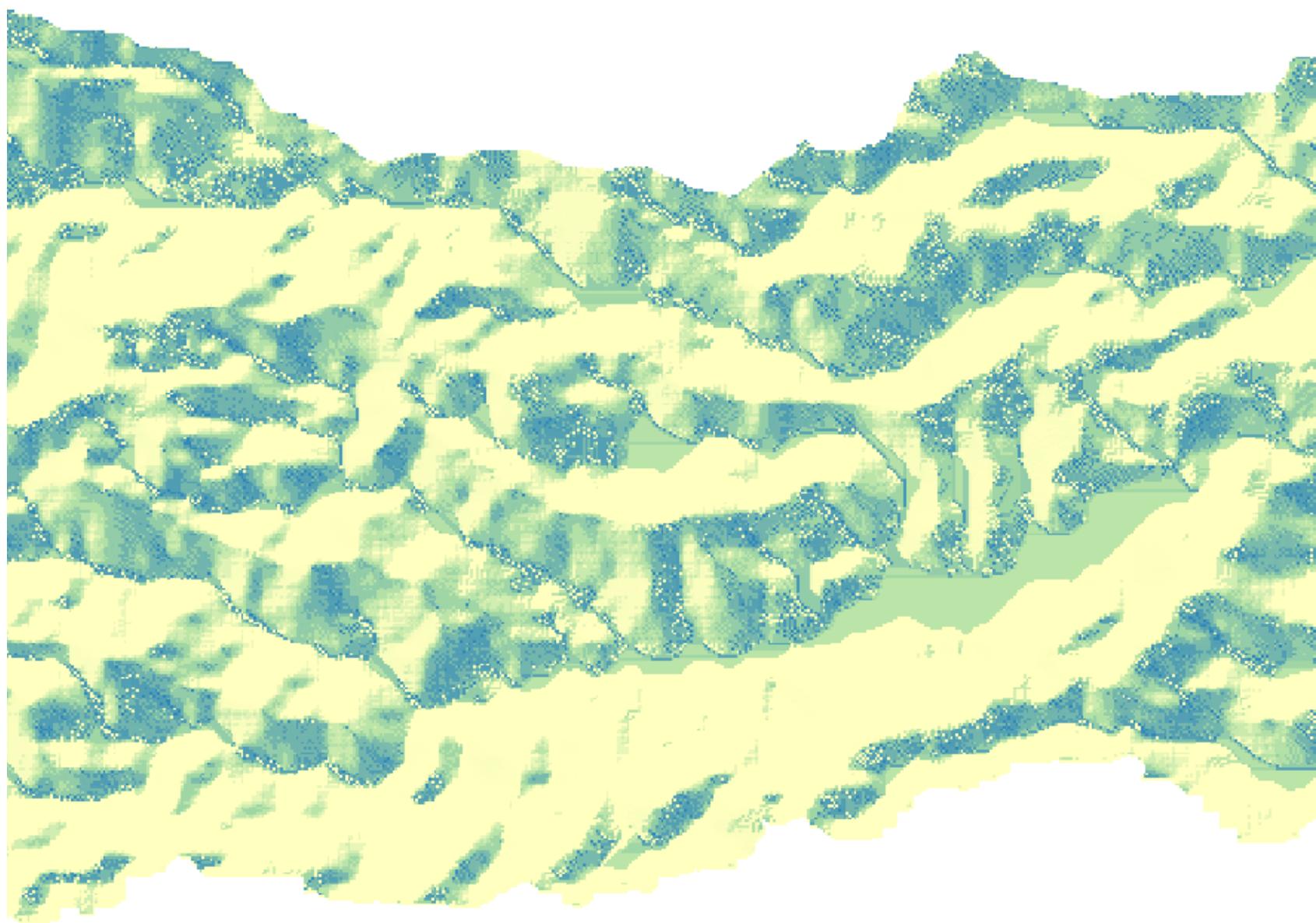
DEM of Gura

- The Gura is a critically important river in Kenya



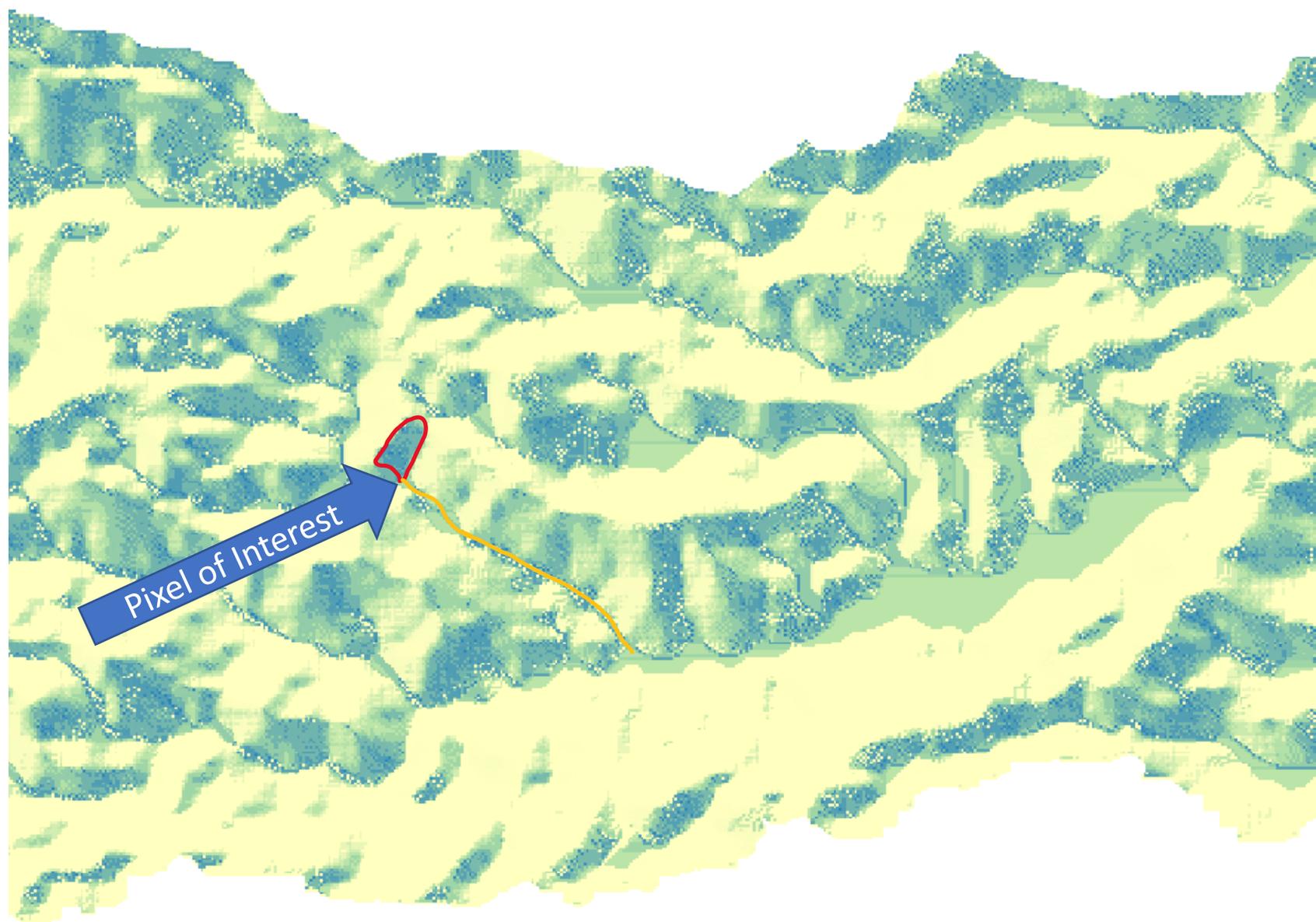
Flow direction

- Calculated from the DEM.
 - Color indicates which direction (in degrees) the water is flowing.



SDR calculation for one pixel of interest

- Red: Upslope
area
- Yellow:
downslope path
- Calculate this for
ALL the pixels.



Running the InVEST SDR model

- Hit the “home” button to go back to the model selection screen.
- Select the Sediment Delivery Ratio model

The screenshot shows the InVEST software interface. At the top, there is a menu bar with 'File', 'Edit', 'View', 'Window', and 'About'. Below the menu bar is the InVEST logo and a home button. On the right side, there is a settings gear icon and a text prompt: 'Set up a model from a sample datastack file (.json) or from an InVEST model's logfile (.txt):' with an 'Open' button.

Annual Water Yield	Nutrient Delivery Ratio
Carbon Storage and Sequestration	RouteDEM
Coastal Blue Carbon Preprocessor	Scenario Generator: Proximity Based
Coastal Blue Carbon	Scenic Quality
Coastal Vulnerability	Seasonal Water Yield
Crop Pollination	Sediment Delivery Ratio
Crop Production: Percentile	Urban Cooling
Crop Production: Regression	Urban Flood Risk Mitigation
Delineatelt	Urban Stormwater Retention
Forest Carbon Edge Effect	Visitation: Recreation and Tourism
GLOBIO	Wave Energy Production
Habitat Quality	Wind Energy Production
Habitat Risk Assessment	

- Start by setting the Workspace folder

invest-workbench
File Edit View Window About

InVEST

Sediment Delivery Ratio x

Setup >

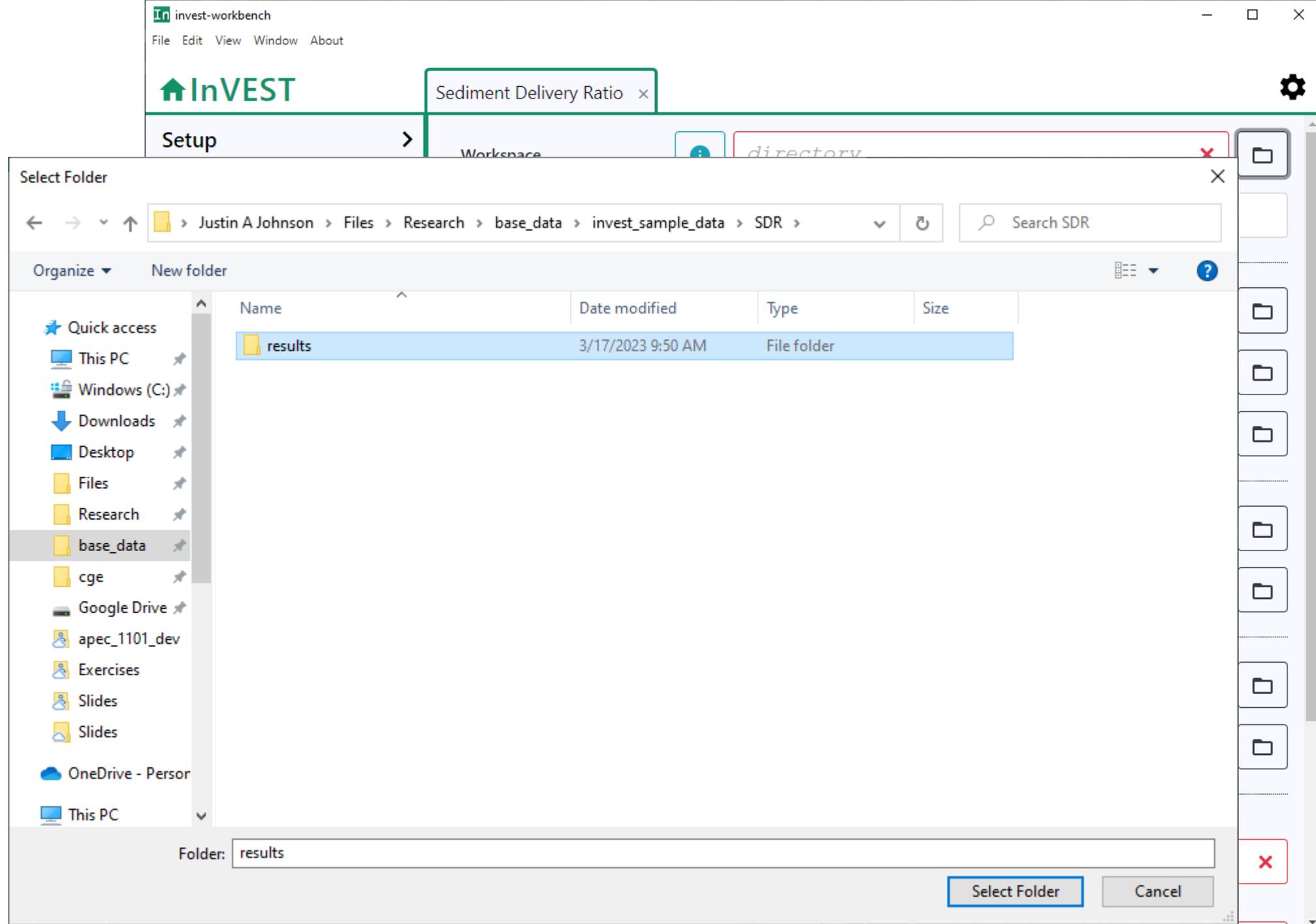
Log >

- Load parameters from file
- Save to JSON
- Save to Python script
- Save datastack
- [User's Guide](#)
- [Frequently Asked Questions](#)

Run

Workspace	<input type="text" value="directory"/>	<input type="button" value="x"/>	<input type="button" value="📁"/>
File Suffix (optional)	<input type="text" value="text"/>		
Digital Elevation Model	<input type="text" value="raster"/>	<input type="button" value="x"/>	<input type="button" value="📁"/>
Erosivity	<input type="text" value="raster"/>	<input type="button" value="x"/>	<input type="button" value="📁"/>
Soil Erodibility	<input type="text" value="raster"/>	<input type="button" value="x"/>	<input type="button" value="📁"/>
Land Use/Land Cover	<input type="text" value="raster"/>	<input type="button" value="x"/>	<input type="button" value="📁"/>
Biophysical Table	<input type="text" value="csv"/>	<input type="button" value="x"/>	<input type="button" value="📁"/>
Watersheds	<input type="text" value="vector"/>	<input type="button" value="x"/>	<input type="button" value="📁"/>
Drainages (optional)	<input type="text" value="raster"/>		<input type="button" value="📁"/>
Threshold Flow Accumulation (number of pixels)	<input type="text" value="number"/>	<input type="button" value="x"/>	

- Start by setting the Workspace folder
- Create a new folder in the SDR model called results.
- Select this folder as your Workspace



- Input the first five inputs.
- You can probably guess which is which by the file name.
 - Refer to the User's Guide link if you can't.

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File Edit View Window About

InVEST Sediment Delivery Ratio

Setup

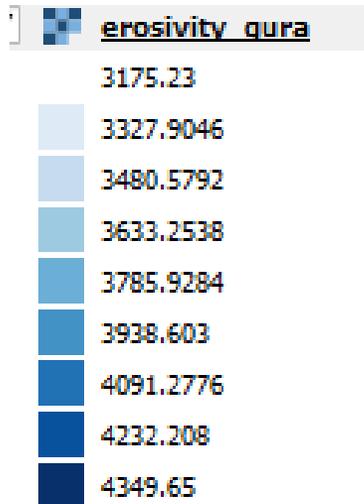
- Log
- Load parameters from file
- Save to JSON
- Save to Python script
- Save datastack
- [User's Guide](#)
- [Frequently Asked Questions](#)

Run

Workspace	<input type="text" value="C:\Users\jajohns\Files\Research\base_"/>
File Suffix (optional)	<input type="text" value="text"/>
Digital Elevation Model	<input type="text" value="raster"/>
Erosivity	<input type="text" value="raster"/>
Soil Erodibility	<input type="text" value="raster"/>
Land Use/Land Cover	<input type="text" value="raster"/>
Biophysical Table	<input type="text" value="csv"/>
Watersheds	<input type="text" value="vector"/>
Drainages (optional)	<input type="text" value="raster"/>
Threshold Flow Accumulation (number of pixels)	<input type="text" value="number"/>

Erosivity

- Map of rainfall erosivity, reflecting the intensity and duration of rainfall in the area of interest.



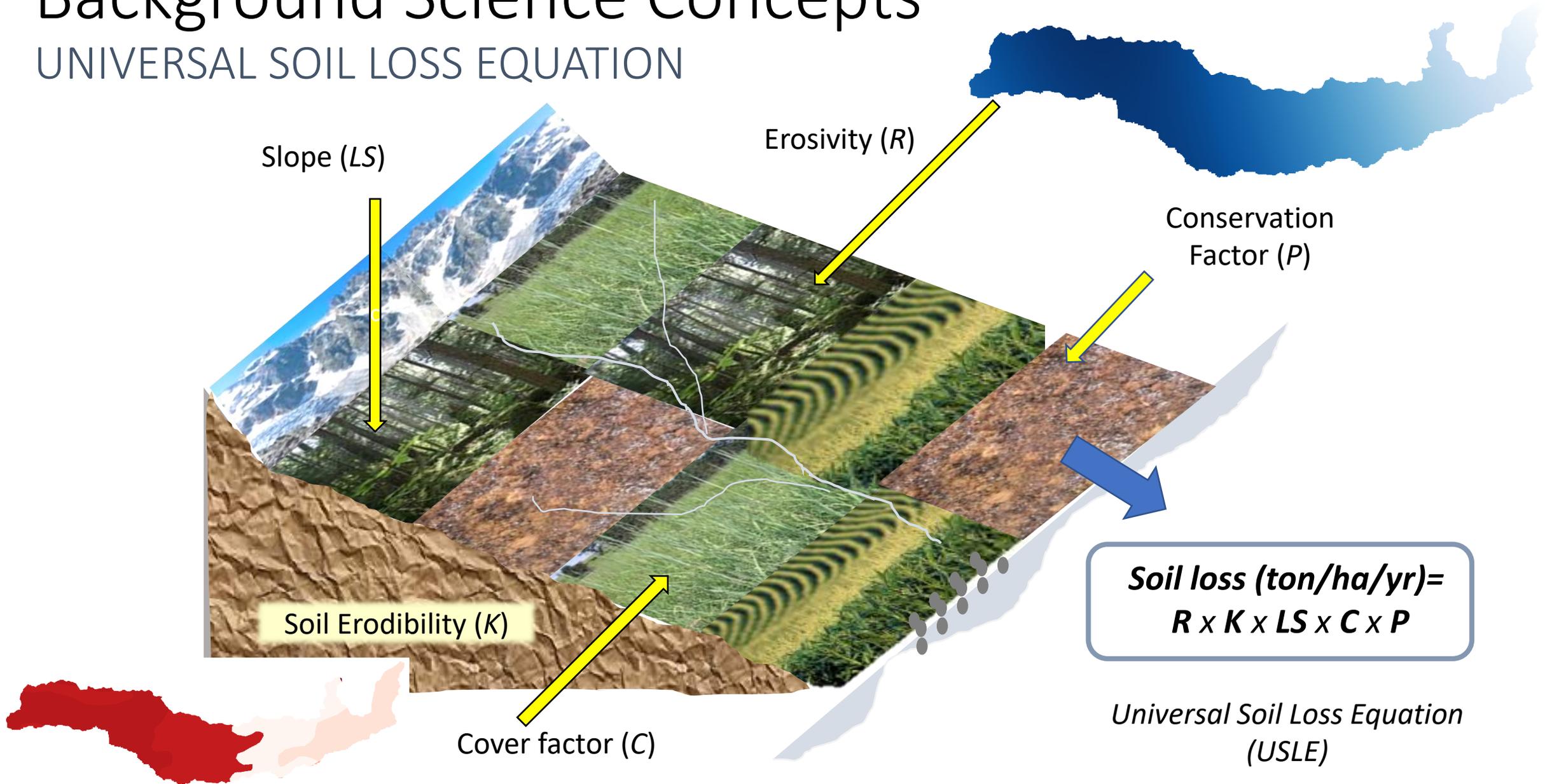
Soil Erodibility

- Map of soil erodibility, the susceptibility of soil particles to detachment and transport by rainfall and runoff.



Background Science Concepts

UNIVERSAL SOIL LOSS EQUATION



- Now enter the Watersheds input.
- We have two options.
 - “watershed_gura.shp”
 - “subwatershed_gura.shp”
- Notice that we have a new file type (.shp)
 - This is a Vector file, also called a Shapefile
 - Or sometimes Area of Interest (AOI) or just a Polygon.
- You can also add this to QGIS if you’d like to look at it.
- For now, select “watershed_gura.shp”

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File Edit View Window About

InVEST Sediment Delivery Ratio x

Setup >

Log >

- ▢ Load parameters from file
- ▢ Save to JSON
- ▢ Save to Python script
- ▢ Save datastack
- [User's Guide](#)
- [Frequently Asked Questions](#)

Workspace

File Suffix (optional)

Digital Elevation Model

Erosivity

Soil Erodibility

Land Use/Land Cover

Biophysical Table

Watersheds

Drainages (optional)

Threshold Flow Accumulation (number of pixels)

Run

- Next, input the following “model parameters”
- Each of these values has important scientific context from Hydrology.
- For now, however, we are going to set them according to the Default Values reported in the InVEST User’s Guide

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File Edit View Window About

InVEST

Sediment Delivery Ratio x

Setup >

Log >

- Load parameters from file
- Save to JSON
- Save to Python script
- Save datastack
- [User's Guide](#)
- [Frequently Asked Questions](#)

Soil Erodibility	<input type="text" value="C:\Users\jajohns\Files\Research\bas"/>	✓
Land Use/Land Cover	<input type="text" value="C:\Users\jajohns\Files\Research\bas"/>	✓
Biophysical Table	<input type="text" value="C:\Users\jajohns\Files\Research\bas"/>	✓
Watersheds	<input type="text" value="C:\Users\jajohns\Files\Research\bas"/>	✓
Drainages (optional)	<input type="text" value="raster"/>	✓
Threshold Flow Accumulation (number of pixels)	<input type="text" value="1000"/>	✓
Borselli K Parameter	<input type="text" value="2"/>	✓
Maximum SDR Value	<input type="text" value=".8"/>	✓
Borselli IC0 Parameter	<input type="text" value=".5"/>	✓
Maximum L Value	<input type="text" value="122"/>	✓

Run

- Next, input the following “model parameters”
- Each of these values has important scientific context from Hydrology.
- For now, however, we are going to set them according to the Default Values reported in the InVEST User’s Guide
 - Access the Users Guide with the info icon.
- One of the key reasons for InVEST’s success is the thorough documentation it provides.

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File Edit View Window About

InVEST Sediment

Setup >

Log >

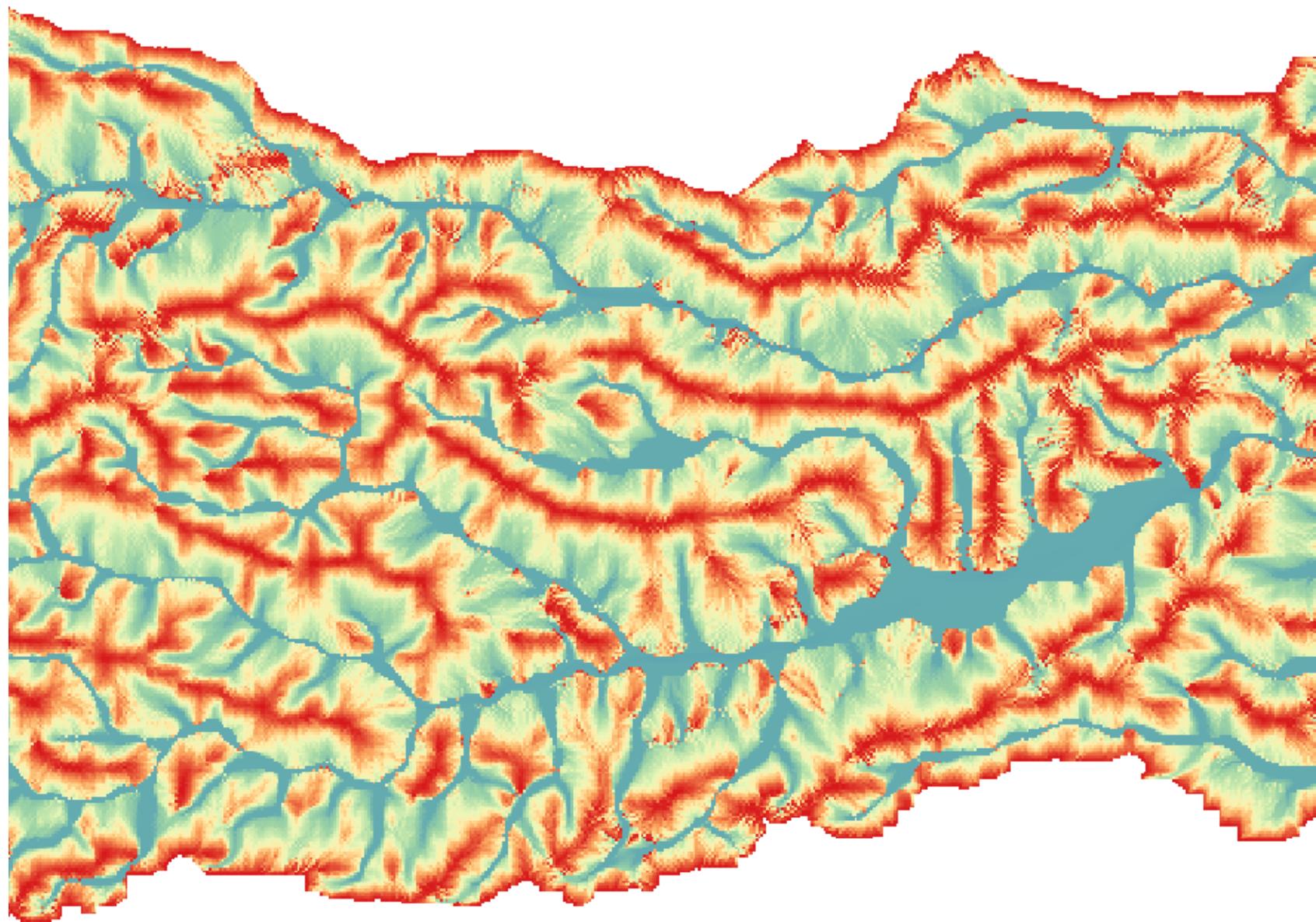
- ☐ Load parameters from file
- ☑ Save to JSON
- ☑ Save to Python script
- ☑ Save datastack
- [User's Guide](#)
- [Frequently Asked Questions](#)

Run

- **Threshold Flow Accumulation** (number, units: **number of pixels**, *required*): The number of upslope pixels that must flow into a pixel before it is classified as a stream.
This threshold directly affects the expression of hydrologic connectivity and the sediment export result: when a flow path reaches the stream, sediment trapping stops and the sediment exported is assumed to reach the catchment outlet. It is important to choose this value carefully, so modeled streams come as close to reality as possible. See [Appendix 1: Data Sources](#) and [Working with the DEM](#) for more information.
- **Borselli K Parameter** (number, units: **unitless**, *required*): Borselli k parameter.
This is k in equation (76). Default value: 2.
- **Borselli IC₀ Parameter** (number, units: **unitless**, *required*): Borselli IC₀ parameter.
This is IC_0 in equation (76). Default value: 0.5.
- **Maximum SDR Value** (ratio, *required*): The maximum SDR value that a pixel can have.
This is SDR_{max} in equation (76). This is a function of the soil texture. More specifically, it is defined as the fraction of topsoil particles finer than coarse sand (1000 μm ; Vigiak et al. 2012). This parameter can be used for calibration in advanced studies. Its default value is 0.8.
- **Maximum L Value** (number, units: **unitless**, *required*): The maximum allowed value of the slope length parameter (L) in the LS factor.
Values of L that exceed this are thresholded to this value. Its default value is 122 but reasonable values in literature place it anywhere between 122-333 see Desmet and Govers, 1996 and Renard et al., 1997.

One key parameter: Flow accumulation

- Determines how much water must flow before we define it as a stream
- Here, red values show where little water has accumulated yet, but as it goes downhill, it eventually becomes a stream (blue)



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File Edit View Window About

InVEST

Sediment Delivery Ratio x

Setup >

Log >

- Load parameters from file
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- Save datastack
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- [Frequently Asked Questions](#)

Soil Erodibility ✓

Land Use/Land Cover ✓

Biophysical Table ✓

Watersheds ✓

Drainages (optional) ✓

Threshold Flow Accumulation (number of pixels) ✓

Borselli K Parameter ✓

Maximum SDR Value ✓

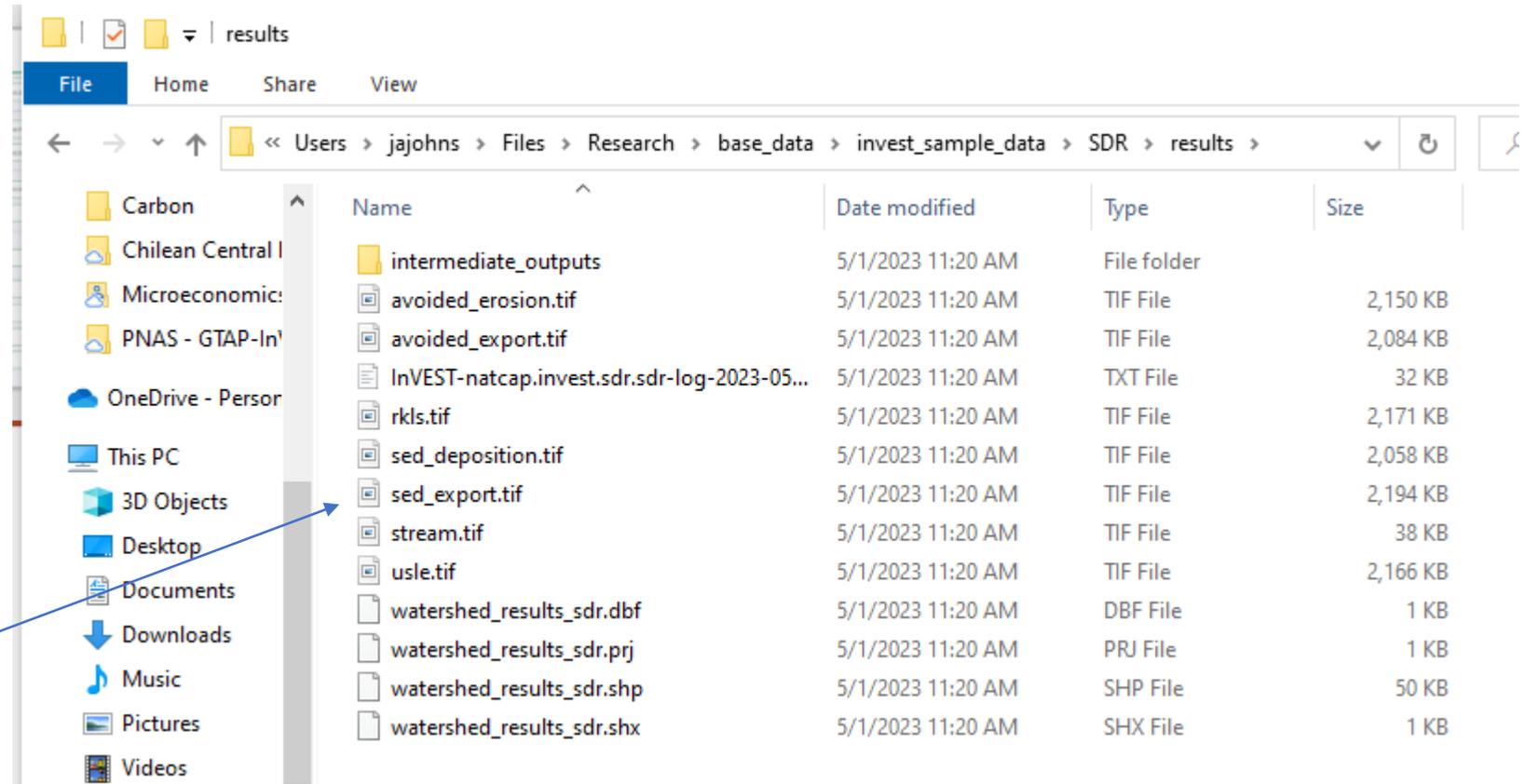
Borselli IC0 Parameter ✓

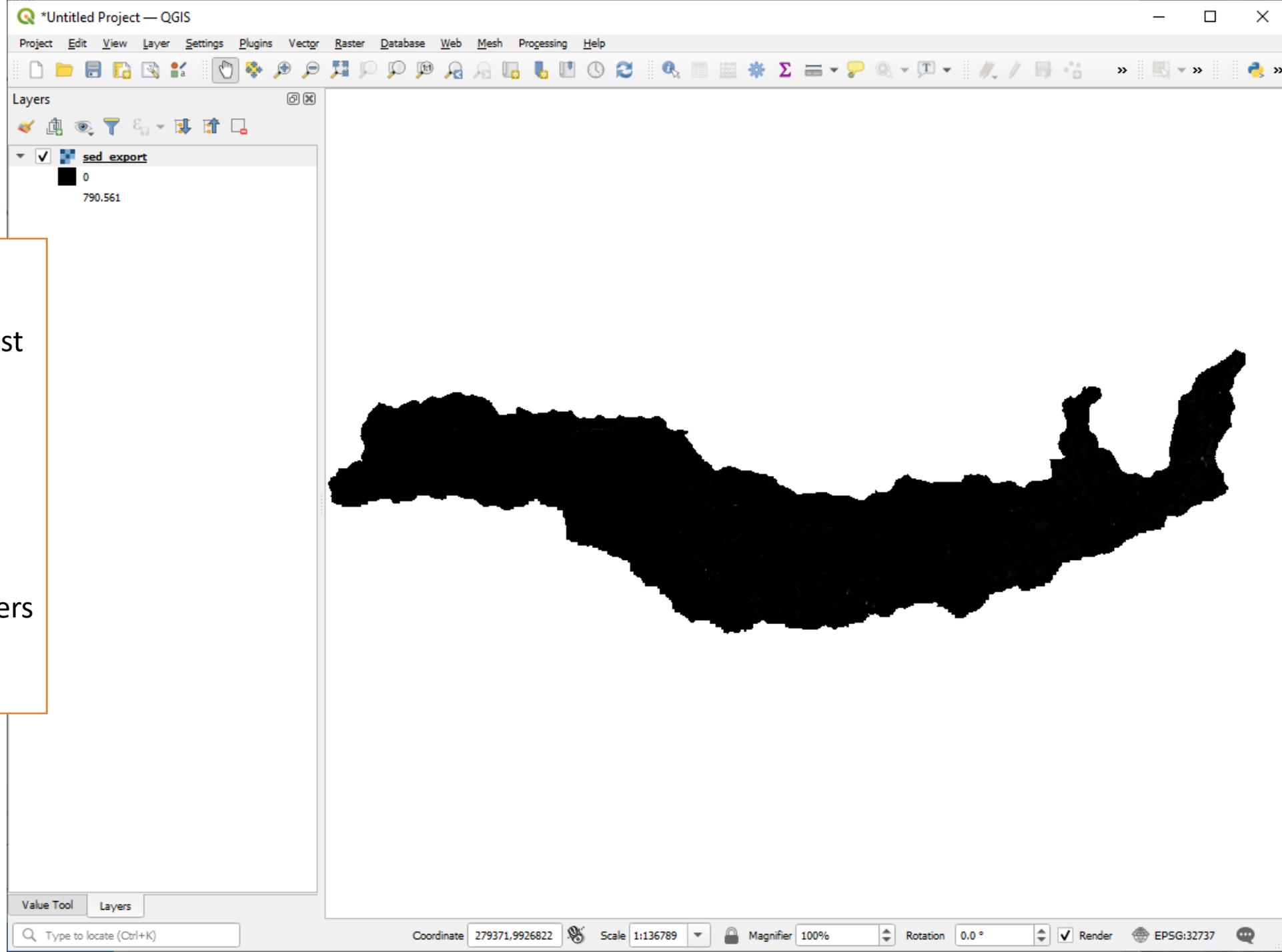
Maximum L Value ✓

Run

- Click Run!

- Click the Open Workspace button.
- There are many more results than for the carbon model. Each has its own interpretation.
- Load sed_export.tif into QGIS.





- Pretty ugly on its own.
- One challenge for interpretation is that most values are very close to zero but some spots are very high.
- Let's colorize the map to showcase this.
- Double-click on the sed_export.tif in the Layers window

- I chose a thematic Brown color ramp.
- Set the mode to Quantile.
- This makes it so each color has the same number of pixels in its range.
- Optionally, increase the number of classes to get a more detailed colorbar.

Layer Properties — sed_export — Symbology

Render type: Singleband pseudocolor

Band: Band 1 (Gray)

Min: 0 Max: 790.561

Min / Max Value Settings

Interpolation: Linear

Color ramp: [Thematic Brown color ramp]

Label unit suffix: [Empty]

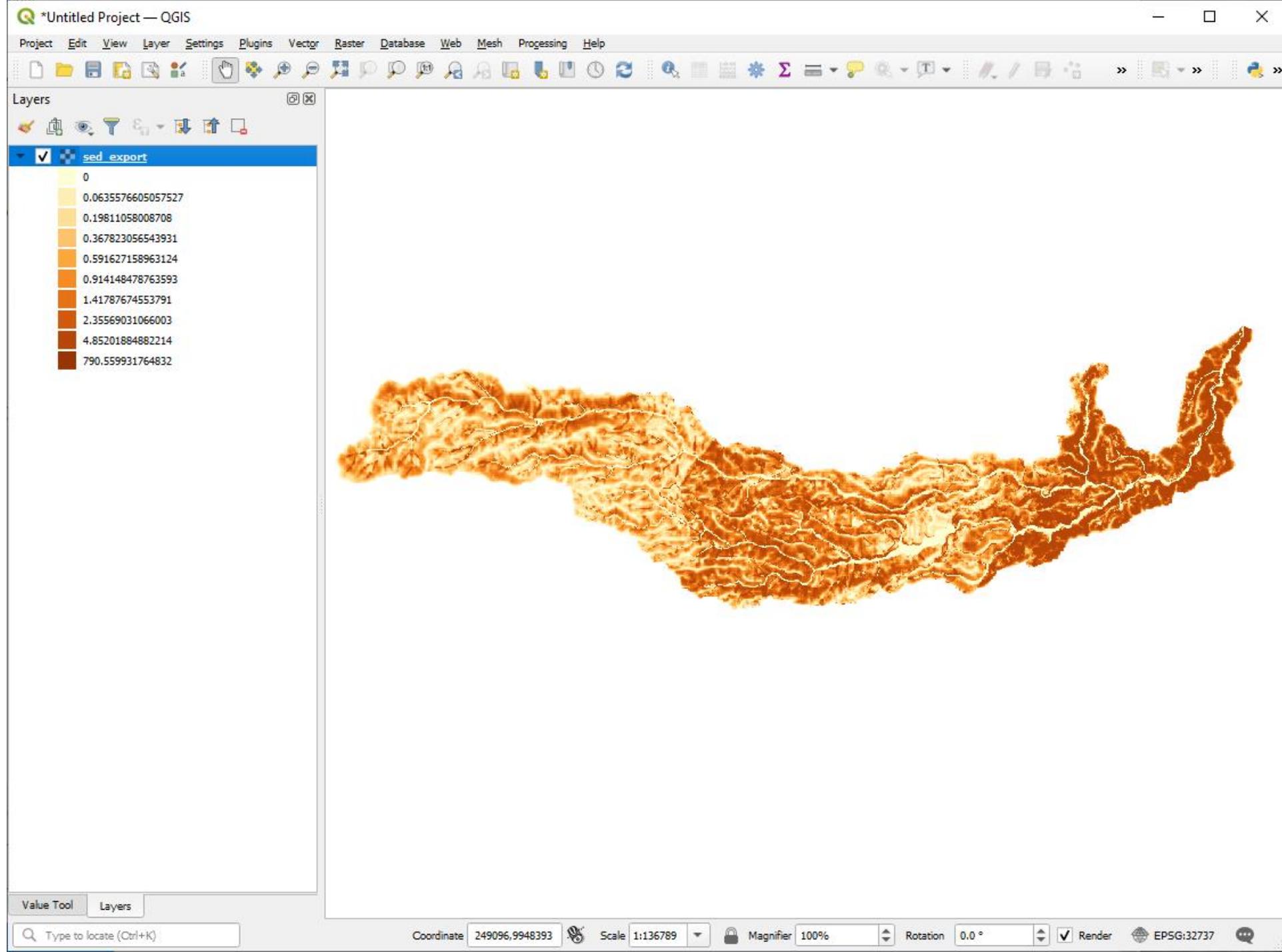
Value	Color	Label
0	[Lightest Brown]	0
0.23665086358...	[Light Brown]	0.23665086358525
0.73632225841...	[Medium-Light Brown]	0.736322258412391
2.0480441879992	[Medium Brown]	2.0480441879992
790.559931764...	[Darkest Brown]	790.559931764832

Mode: Quantile Classes: 5

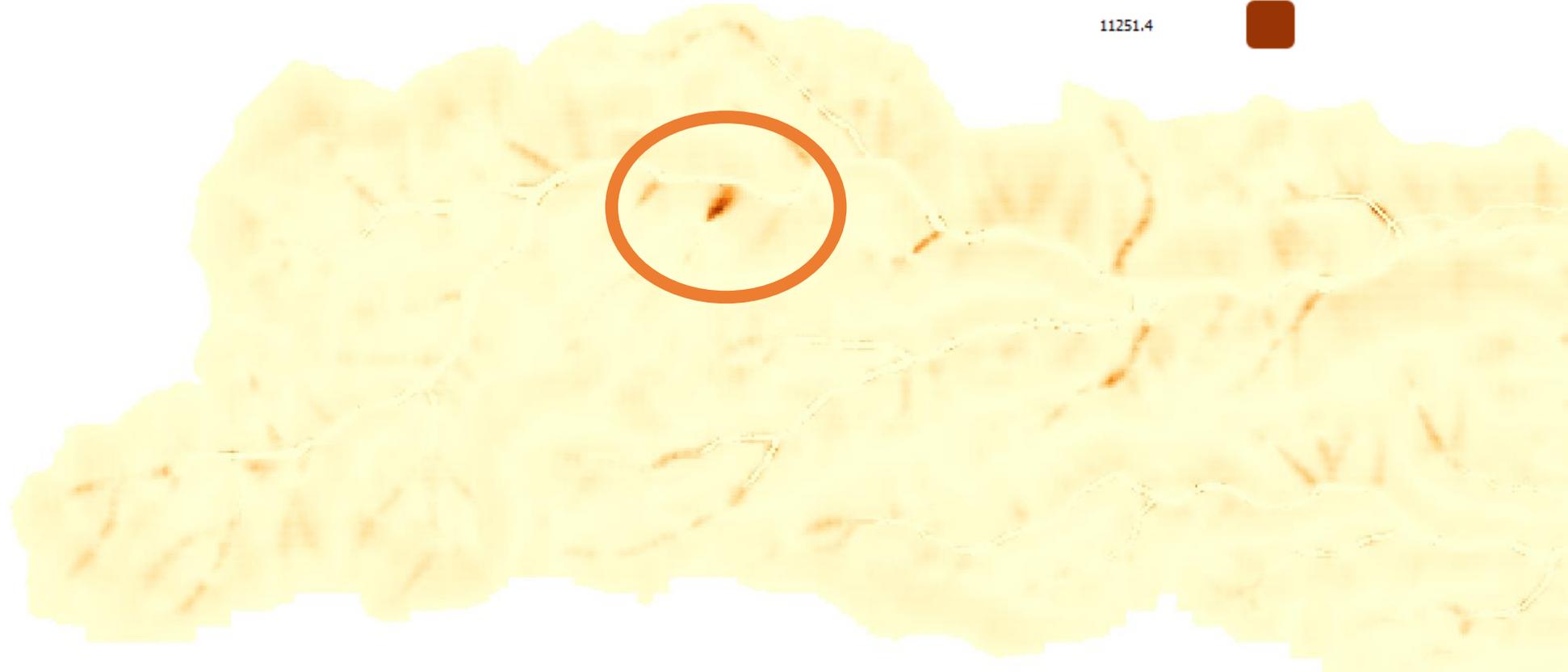
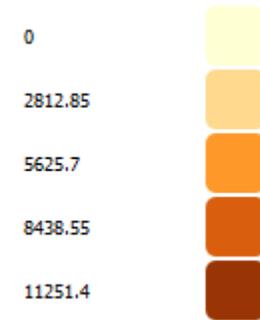
Color Rendering: Blending mode: Normal, Brightness: 0, Contrast: 0, Saturation: 0, Grayscale: Off

Buttons: Classify, Clip out of range values, OK, Cancel, Apply, Help

- Much prettier!
- This map plots the Tons of Sediment exported from each pixel into the stream network.
- This may be exactly the number you are looking to report to the policy maker.
- However, it is still not the “Ecosystem Service” itself.



Avoided Erosion (tons)



- Here I have added a new layer, `sed_retention.tif` and colorized it.
- I chose a linear colorbar. This will highlight the places that are particularly bad.
- The policy advice becomes clear here. Do not degrade this natural land in particular!

- Avoided Erosion (top)
- Avoided export (into the stream, bottom)
- Similar, but imply different optimal management strategies:
 - Preserve steep, erodible slopes versus preserve riparian vegetation along the stream



Recap

- The Sediment Delivery Model calculates both erosion and stream export
- Shows some locations can be orders-of-magnitude more important to conservation outcomes
- Foreshadow:
 - Originally, most InVEST Sediment runs focused on export (and its impact on reservoir sedimentation).
 - Valued via e.g. avoided dredging values
 - We also calculate erosion's impact on crop yield
 - Degraded soil has lower yields

Appendix

$RKLS_a$
(maximal local erosion)

$R_{a \rightarrow b}$
(Sediment eroded in a, retained in b)

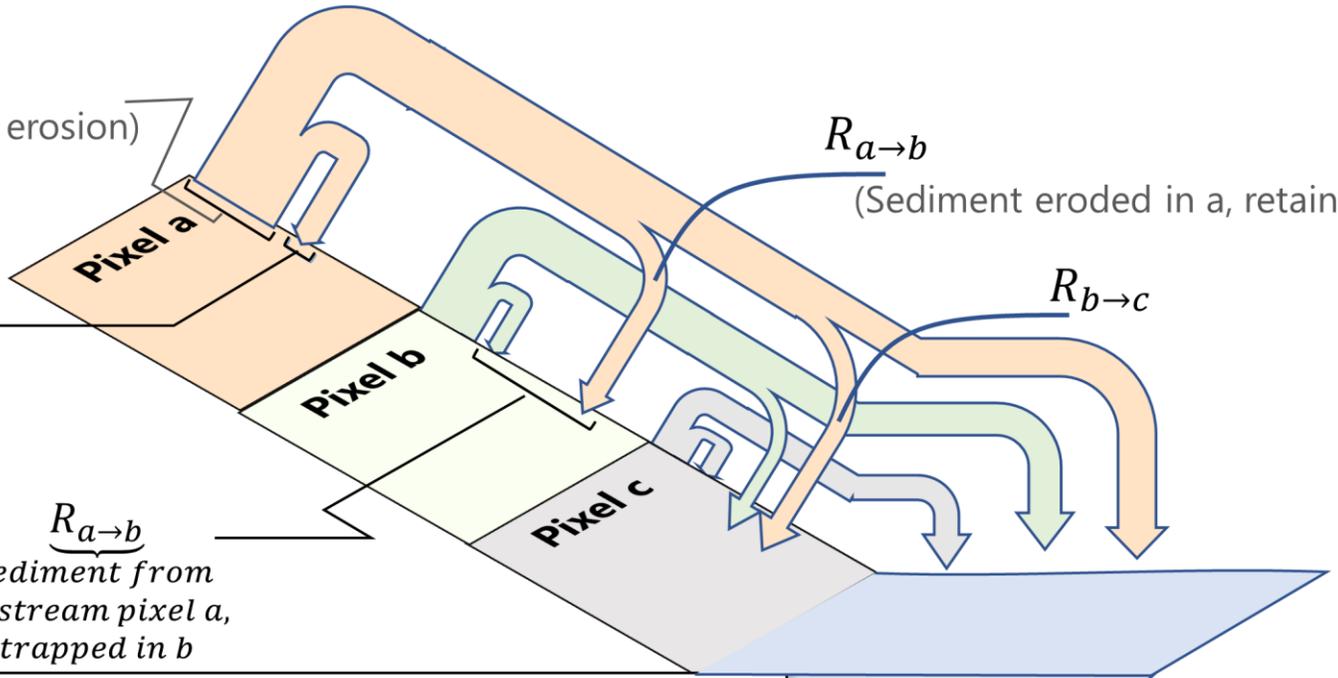
$R_{b \rightarrow c}$

Avoided EROSION (pixel a) =
 $RKLS_a - RKLSCP_a$

Avoided EXPORT (pixel b) =

$$\left[\frac{RKLS_b - RKLSCP_b}{\text{Local erosion control in pixel b}} \right] * SDR +$$

$$\underbrace{R_{a \rightarrow b}}_{\text{Sediment from upstream pixel a, trapped in b}}$$



Pixel-level sediment budget

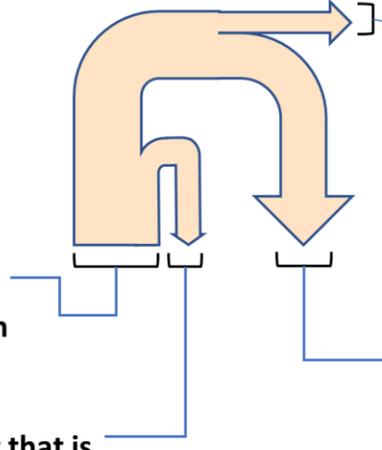
$RKLSCP_a * SDR_a$
Sediment export from pixel a to the next downslope river channels

$RKLS_a$:
Local erosion without vegetation

$$\sum_{i \in \{b, c\}} R_{a \rightarrow i}$$

$RKLS_a - RKLSCP_a$
Avoided erosion, or sediment that is eroded and retained on the pixel

Downstream retention: sediment leaving pixel a which is retained on downstream pixels b and c



Stream pixel

Concepts

VALUATION

- Very context-specific!
- Built-in replacement and avoided cost approaches for reservoir dredging or water treatment
- In InVEST: retention is calculated using a reference scenario of **bare soil**
 - $Retention = Export_{bare_soil} - Export_{current_land_use}$

