Arizona Aquifer Recharge Suitability Analysis

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Abstract 4

- Aquifer recharge can be either passive or active, and is implemented in a variety of 5
- ways. This analysis seeks to identify regions across AZ which are broadly suitable 6
- for aquifer recharge projects as a general template for more focused analysis. 7

Plain Language Summary 8

Identifying regions in AZ where surface water can be stored long-term as ground 9 water. 10

0.1 Introduction 11

0.2 Data & Methods 12

These methods and data layers are preliminary and subject to change 13

0.2.1 Elevation 14

0.2.1.1 DEM 15

Elevation and elevation derivatives from 30-m NASA SRTM. USGS 3-DEM (10m) 16

- product not suitable for full study area analysis due to (1) the large area of missing 17
- data in Mexico, and (2), the excessively high spatial resolution (massively increasing 18
- computational requirements). 19
- SRTM elevation sinks filled prior to calculating slope and aspect. 20

Should elevation be directly used in the suitability analysis? 21

- 0.2.1.2 Slope 22
- Slope derived from hydrologically conditioned (filled) 30-m SRTM layer using 23
- quadratic surface function and a fixed 30-m neighborhood. Slope measured in °. 24
- Higher slopes are less suitable because thinning is both more expensive and 25 more precipitation will end up as runoff. 26

Slope classified from 1-10 using a continuous function in ArcPro Suitability Map-27 per.

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Parameter	Setting
Function	MSSSmall
Mean multiplier	1
Sddv multiplier	2
Lower threshold	0
Value below threshold	0
Upper threshold	90
Value above threshold	0
Invert function	FALSE
Save transformed dataset	TRUE
Output	$Transformed_SRTM_slope$



Figure 1: Slope suitability mapper rescale transformation setup.

- 29 0.2.1.3 Aspect
- ³⁰ Aspect calculated as with slope. Aspect reference point at N. Pole.
- 31 Aspect has a large impact on solar radiation.
- ³² Closer to 0 or 360 is desired, low suitability scores for closeness.
- Aspect classified from 1-10 using a continuous function in ArcPro Suitability
- 34 Mapper.

Parameter	Setting
Function	Near
Mid Point	180
Point spread	0.0011049638968393428 (default)
Lower threshold	-1 (flat)
Value below threshold	0
Upper threshold	360
Value above threshold	0
Invert function	TRUE
Save transformed dataset	TRUE
Output	$Transformed_SRTM_aspect$



Figure 2: Aspect suitability mapper rescale transformation setup.

- 35 0.2.2 Precipitation
- ³⁶ PRISM normals, 800m resolution. Annual precipitation.

³⁷ Mean annual precipitation must be higher than 500mm 1990 - 2020

- Precipitation classified from 1-10 using a continuous function in ArcPro Suitabil-
- ³⁹ ity Mapper.

 $_{40}$ \qquad NOTE: The logistic growth function may also be a good choice for this dataset. See

41 Logistic Growth function

Parameter	Setting
Function	MSLarge
Mean multiplier	1.68 (approximates 500mm at x-intercept)
Sddv multiplier	1
Lower threshold	67.33789825439453 (default, minimum)
Value below threshold	0
Upper threshold	1214.5689697265625 (default, maximum)
Value above threshold	0
Invert function	FALSE
Save transformed dataset	TRUE
Output	$Transformed_PRISM_ppt_30yrnormal_800m$



Figure 3: Aspect suitability mapper rescale transformation setup.

42 0.2.3 Vegetation Characteristics

- 43 0.2.3.1 NLCD 2021 Total Canopy Cover
- 44 0.2.3.2 Landfire
- 45 0.2.4 Soil Hydrology
- 46 AZ_Soil_Hydric_Group data layer
- 47 Classification Schema

	Count		
Class	(pixels)	Text	Value
А	62559472	Group A soils consist of deep, well drained	10
		sands or gravelly sands with high	
		infiltration and low runoff rates.	
В	76665198	Group B soils consist of deep well drained	8
		soils with a moderately fine to moderately	
		coarse texture and a moderate rate of	
~		infiltration and runoff.	
С	88491710	Group C consists of soils with a layer that	5
		impedes the downward movement of water	
		or fine textured soils and a slow rate of	
_		infiltration.	
D	155095790	Group D consists of soils with a very slow	2
		infiltration rate and high runoff potential.	
		This group is composed of clays that have	
		a high shrink-swell potential, soils with a	
		high water table, soils that have a clay	
		pan or clay layer at or near the surface,	
		and soils that are shallow over nearly	
		impervious material.	
A/D	43192	Group A/D soils naturally have a very	7
		slow infiltration rate due to a high water	
		table but will have high infiltration and	
		low runoff rates if drained.	
B/D	18456	Group B/D soils naturally have a very	6
		slow infiltration rate due to a high water	
		table but will have a moderate rate of	
		infiltration and runoff if drained.	

Class	Count (pixels)	Text	Value
C/D	217771	Group C/D soils naturally have a very slow infiltration rate due to a high water table but will have a slow rate of infiltration if drained.	3

48 Transformed dataset Transformed_AZ_Soil_Hydric_Group

- ⁵⁰ There are 2 data layers which represent depth to bedrock and it is not
- ⁵¹ clear which data layer is preferred!
- AZ_BedrockDepth_cm.tif

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55

- -218 m resolution
 - UTM 12N, NAVD88 depth (m) positive down
 - -0 108,273 cm



Figure 4: AZ_BedrockDepth_cm.tif with histogram.

- Depth to Bedrock WTA
- 57 Classified

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- 58 30 m resolution
 - UTM 12N, NAVD88 height (m) positive up
 - * vertical datum is incorrect. Should be depth (m) positive down

 $_{49}$ 0.2.5 Depth to Bedrock

-0 - 269 cm- Extremely skewed distribution clustering around 200 cm



Figure 5: Depth to Bedrock WTA, DEP2BEDRS_WTA layer with histogram

63 0.2.5.1 Soil vs. Subsurface Geology Weighting Layers

To quantify the differential importance of soils vs. subsurface geology layers for determining suitability two related data layers had to be calculated.

⁶⁶ The logic assumes that there are two uniform subsurface layers, soil, and subsur-

⁶⁷ face geology (i.e. geology). However, the weighted importance of these layers is not

⁶⁸ uniform across space. Where the bedrock is close to the surface, we assume that

⁶⁹ the soil is the most important layer for ground water storage. Inversely, when the

⁷⁰ bedrock is extremely deep, we assume that the geology is the more important layer.

71 Our soil layer is measured at a depth of 200cm (2m), and we assume a uniform soil

 $_{72}$ depth across the state. Therefore, the depth to be drock was divided by 200 to get a

depth to bedrock (dtb) in soil units. The first "soil depth" was ascribed to the soil

⁷⁴ layer, and varies from 0 to 1, while the remaining "soil depth" were attributed to the

⁷⁵ geology layer, with a range from 0 to 541. Ergo, where the bedrock is deepest, the

₇₆ geology layer is 541 time more influential than the soils layer.



Figure 6: Simple diagram of logic underlying the soil vs. subsurface geology weighting layers.

 π These layers were created in a custom R script using the following raster math, with

⁷⁸ their resulting outputs.

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```
0.2.5.1.1 Soils
```{r}
Where depth to bedrock (dtb) = 0cm, soil multiplier = 0 (no soil)
Where depth to dtb >= 200cm, soil multiplier = 1 (Full depth of soil)
Intermediate depths = linear
soilMultiplier = masked
soilMultiplier[soilMultiplier > 200] = 200 # Fix upper limit of soil depth = 200 cm
soilMultiplier = soilMultiplier/200
...
```



Figure 7: Soils multiplier layer.

80 0.2.5.1.2 Geology

```{r}
Where dtb < 200cm, geology multiplier = 0 (soil only)
Where dtb >= 200cm, geology multiplier = dtb/200 (in units of relative soil depth)
geologyMultiplier = masked
geologyMultiplier[geologyMultiplier < 200] = 0
geologyMultiplier = geologyMultiplier/200
```</pre>



Figure 8: Geology multiplier layer.

## 81 0.2.6 Other Data Layers for Consideration

82 0.2.6.1 Global Hydrologic Curve Number(GCN250)

## https://gee-community-catalog.org/projects/gcn250/?h=hydrologic

The GCN250 is a globally consistent, gridded dataset defining CNs at the 84 250 m spatial resolution from new global land cover (300 m) and soils data 85 (250 m). GCN250 represents runoff for a combination of the European 86 space agency global land cover dataset for 2015 (ESA CCI-LC) resampled 87 to 250 m and geo-registered with the hydrologic soil group global data prod-88 uct (HYSOGs250m) released in 2018. The potential application of this 89 90 data includes hydrologic design, land management applications, flood risk assessment, and groundwater recharge modeling. The CN values vary 91 depending on antecedent runoff conditions (ARC), which is affected by the 92

| 93  | rainfall intensity and duration, total rainfall, soil moisture conditions, cover        |
|-----|-----------------------------------------------------------------------------------------|
| 94  | density, stage of growth, and temperature[.] emphasis mine                              |
| 95  | 0.2.6.2 Soil Properties 800m                                                            |
| 96  | https://gee-community-catalog.org/projects/soilprop/?h=                                 |
|     |                                                                                         |
| 97  | The data shown here were obtained by aggregating current USDA-NCSS soil                 |
| 98  | survey data (SSURGO back-filled with STATSGO where SSURGO is not                        |
| 99  | available) within 800m <sup>2</sup> grid cells. This data aggregation technique results |
| 100 | in maps that may not match the original data at any given point, and is in-             |
| 101 | tended to depict regional trends in soil properties at the statewide                    |
| 102 | scale. emphasis mine                                                                    |
| 103 | • Pros:                                                                                 |
| 104 | - Lots of relevant data layers, such as:                                                |
| 105 | * Avail. Water Holding Capacity                                                         |
| 106 | * Drainage Class                                                                        |
| 107 | * Sat. Hyd. Conductivity                                                                |
| 108 | * Depth to Restrictive Layer                                                            |
| 109 | * Hydrologic Group                                                                      |
| 110 | * Son Depti                                                                             |
| 111 | · Cons:                                                                                 |
| 112 | - 800m resolution                                                                       |
| 114 | - Large data gaps (laver dependent)                                                     |
| 115 | 0.2.6.2.1 Alternative layers                                                            |
| 116 | gNATSGO (gridded National Soil Survey Geographic Database)                              |
| 117 | • Pros:                                                                                 |
| 118 | – Authoritative                                                                         |
| 119 | – Source layer for value added products (including Soil Properties 800m)                |
| 120 | -10m resolution                                                                         |
| 121 | • Cons:                                                                                 |
| 122 | – Large data gaps across AZ                                                             |
| 123 | -10m resolution                                                                         |
| 124 | Polaris 30m Probabilistic Soil Properties US                                            |
| 125 | • Pros:                                                                                 |
| 126 | <ul> <li>Continuous data availability (no gaps)</li> </ul>                              |
| 127 | - 30m resolution                                                                        |
| 128 | • Cons:                                                                                 |
| 129 | – Fewer data layers                                                                     |
| 130 | - Probabilistic model (increased uncertainty)                                           |
| 131 | 0.2.6.3 Leaf Area Index (LAI)                                                           |
| 132 | Leaf Area Index (LAI) can be calculated from Landsat data (30 m resolution), as a       |
| 133 | proxy of land cover. LAI is a unitless index value which is calculated as a function of |
| 134 | the Enhanced Vegetation Index (ENVI) and typically ranges from 0 to 3.5 ( $citation$    |
| 135 | needed). LAI can be calculated efficiently over a large spatial scale in Google Earth   |
| 136 | Engine (GEE) using the Javascript API, however LAI will vary seasonally, with           |
| 137 | updated Landsat data available every 8-days. Additionally, due to our large study       |
| 138 | area, as well as the logistics of Landsat orbital paths, it takes 6 days to photograph  |
| 139 | the entire study area. Therefore, any LAI analysis on this scale will necessarily be a  |

mosaic image, over roughly a week. For these reasons, a single LAI image should be 140

of

- viewed with some skepticism, and a seasonal mean or median LAI mosaic image may
   be more desireable as a proxy for land cover.
- <sup>143</sup> Code is available for calculating LAI from Landsat 8/9 imagery in my personal GEE
- scripts folder, which could be easily modified for purpose. Due to the large number
- of Landsat images involved the study period must be narrowed prior to analysis
- (i.e. July LAI, Winter LAI, etc.). Additional post-processing of LAI images may be

```
¹⁴⁷ required outside of GEE.
```

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```

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0.2.6.3.1 Google Earth Engine LAI Javascript Code
```

```
var studyArea = ee.FeatureCollection("projects/ee-travisz09/assets/ATUR/WBDHU8_OuterBoundary_Pr
landsat9 = ee.ImageCollection("LANDSAT/LC09/C02/T1_T0A");
```

```
// Map setup
Map.centerObject(studyArea, 6);
Map.addLayer(studyArea, {}, 'Study Area', false);
// Paint study area outline
var empty = ee.Image().byte(); // An empty layer to paint on
var studyAreaOutline = empty.paint(studyArea, 'black', 2);
Map.addLayer(studyAreaOutline, {}, 'Study Area (outline)');
// Study period
var startDate = ee.Date('2023-01-01');
var endDate = ee.Date('2024-01-01'); // Exclusive end date
var timeDif = endDate.difference(startDate, 'day');
// var interval = 8; // days
// print(timeDif);
// Landsat 8/9
var cloudFilter = 10 // 10% max cloud cover
var landsat = ee.ImageCollection('LANDSAT/LC08/C02/T1_L2')
 .merge(ee.ImageCollection('LANDSAT/LC09/C02/T1_L2')) // Combine Lst-9 and Lst-8
 .filterDate(startDate, endDate)
 .filterBounds(studyArea)
 .sort('system:time_start') // Sort by date
 .filter(ee.Filter.lt('CLOUD_COVER', cloudFilter));
// Lst scaling factor function
var scaleLst = function(col) {
 // Map over images in collection
 var scaled = col.map(function(img) {
 var opticalBands = img.select('SR_B.').multiply(0.0000275).add(-0.2);
 var thermalBands = img.select('ST_B.*').multiply(0.00341802).add(149.0);
 return img.addBands(opticalBands, null, true) // Overwrite unscaled bands
 .addBands(thermalBands, null, true);
 });
 return scaled;
};
// print(landsat.first()); // Check the Lst data before scaling
landsat = scaleLst(landsat); // Apply scaling factor
// print(landsat.first()); // Check Lst data after scaling
```

```
// NDVI, EVI, LAI, index function
var calcIndices = function(col) {
 var indices = col.map(function(img) {
 var ndvi = img.normalizedDifference(['SR_B5', 'SR_B4'])
 .rename('ndvi');
 var evi = img.expression(
 '2.5 * ((nir - red) / (nir + 6 * red - 7.5 * blue + 1))',
 {
 'nir': img.select('SR_B5'),
 'red': img.select('SR_B4'),
 'blue': img.select('SR_B2')
 }).rename('evi');
 var lai = evi.expression(
 '3.618 * evi - 0.118',
 {
 'evi': evi.select('evi')
 }).rename('lai');
 return img.addBands(ndvi)
 .addBands(evi)
 .addBands(lai);
 });
 return indices;
};
// Apply indices
landsat = calcIndices(landsat);
// print(landsat.first()); // sanity check
// Isolate lai bands
var lai = landsat.map(function(img) {
 return img.select('lai');
});
Map.addLayer(lai.limit(20), {
 min: 0,
 max: 3.5,
 palette: ['red', 'white', 'green']
}, 'LAI');
print(lai);
```

<sup>149</sup> 0.3 Conclusion

150 References