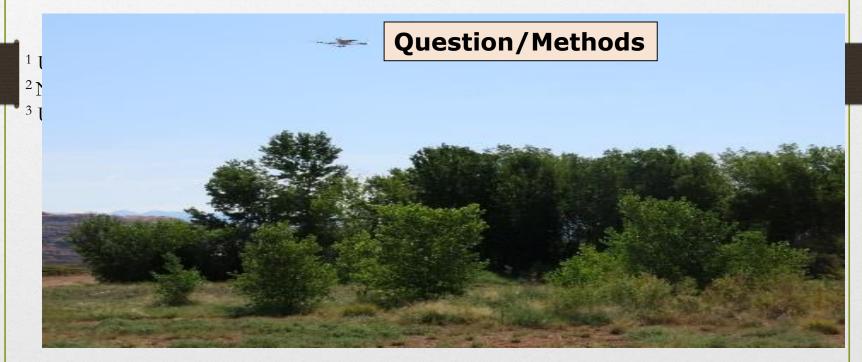
# Remote Sensing Estimates of Evapotranspiration at a Southwestern Uranium Mill Tailings Site

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## Rationale for our study

The U.S. Department of Energy (DOE) Office of Legacy Management (LM) uses mathematical models and monitoring well data to understand and predict groundwater (GW) flow at former uranium processing sites.







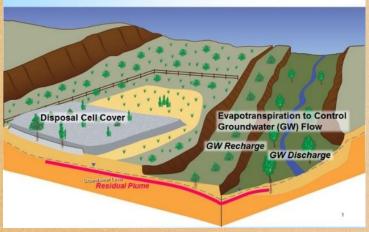


GW elevation varies seasonally and spatially where Tamarisk and other phreatophytes grow. Our hypothesis is that our high resolution maps will show how GW elevation and flow patterns respond to changes in tamarisk biocontrol and health. Results may improve modeling of GW flow and contaminant transport, leading to improvements in GW remediation.

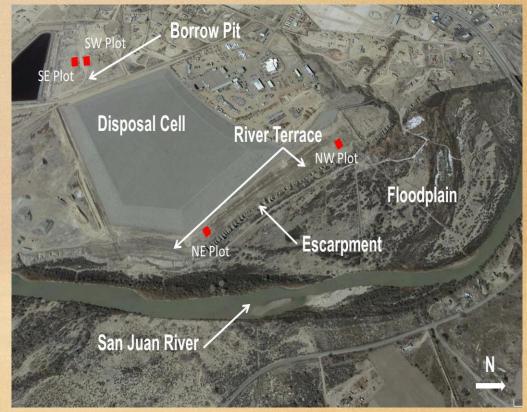
# Shiprock, NM Uranium Mill Site



# Ecological Engineering Remedies



Contaminated groundwater at the Shiprock site occurs in a terrace and a floodplain of the San Juan River that are separated by an escarpment. A disposal cell for mill tailings is located on the terrace.

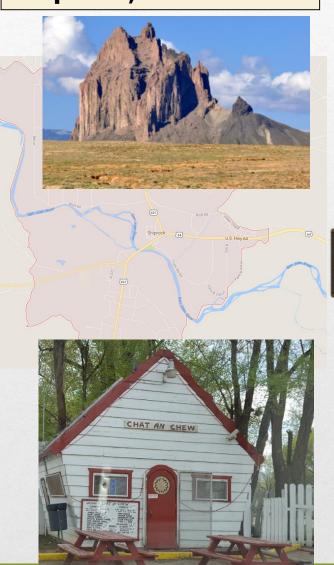


GOAL: to document long-term trends and relationships of ET and GW elevation at Cold War legacy waste sites (Uranium Mill Tailings Radiation Control Act of 1978 (UMTRCA). We focused our research on the Shiprock, NM UMTRCA site.

Because contaminant transport appeared to vary seasonally & annually in response to changes in riparian ecosystems dominated by tamarisk at these Cold War legacy waste sites, the effect of tamarisk green-up and defoliation due to the leaf beetle, *Diorhabda*, are particularly relevant. These sites are adjacent to major western rivers.

We are now developing an empirical approach for estimating the effects of changes in tamarisk populations on water resources at these uranium mill tailings sites.

## **Shiprock, New Mexico**



#### **Research Goal**

Understanding how much available water is used in various ecosystems can aid natural resource managers and decision makers.

LM office of DOE is responsible for remediation and monitoring of GW contaminated by uranium milling during the Cold War. We collaborated to acquire multiple levels of remotely sensed imagery over the Shiprock NM uranium tailings site to assess landscape-scale changes in ET, the effect of ET on GW recharge and discharge, and effect of ET on phytoremediation. We studied effects of changes in riparian plant communities dominated by tamarisk (*Tamarix* spp.) and measured the impact of the northern beetle, *Diorhabda carinulata*, on water resources.

Terrace



Fractures

Bedrock Discharge?

Mancos Shale

Floodplain

Recharge from Precipitation

River Losses and Gains

Bedrock Discharge?

Fractures

Figure 13. Cross-Section View of the Groundwater Conceptual Model for Baseline (nonpumping) Conditions

We used a drone flown by USGS in conjunction with DOE to acquire the high resolution spectral data (8 cm pixels) needed to estimate spatial and temporal variability in ET at the Shiprock site in NM adjacent to the San Juan River. The UAV (drone) imagery allowed us to map species composition and scale to Sentinal, Landsat and MODIS imagery so that we could monitor changes in tamarisk phenology, fractional greenness and ET.



**Uranium mill tailings site** 



400 ft AGL ~ 8 cm res.



UAS assembly and imagery



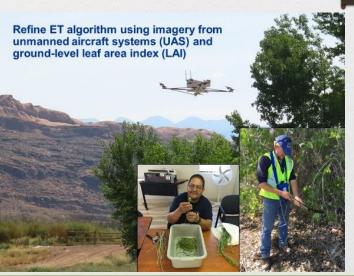
Tamarix in summer: impact of the Diorhabda beetle

Ground-based measurements focused on characterizing plant composition, including endangered plant species and invasive plant species. We measured leaf area index (LAI) and sampled biomass on tamarisk, cottonwood (*Populus* spp.), and willow (*Salix* spp.) and over a dozen other species within the UAS acquisition areas to scale leaf area to LAI of whole trees.

UAS cameras included a Sony Alpha A5100 for species-level vegetation mapping and a MicaSense Red Edge five-band multispectral camera to map NDVI and EVI. The VIs were used in an algorithm to predict reach-level ET.





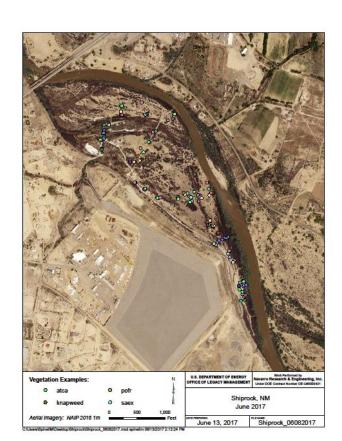


Allometric measurements of plant leaf area or LAI measurements for specific plant species were acquired. In order to estimate water used and ET rates for plant associations and vegetation map units, we characterized and mapped vegetation zones by:

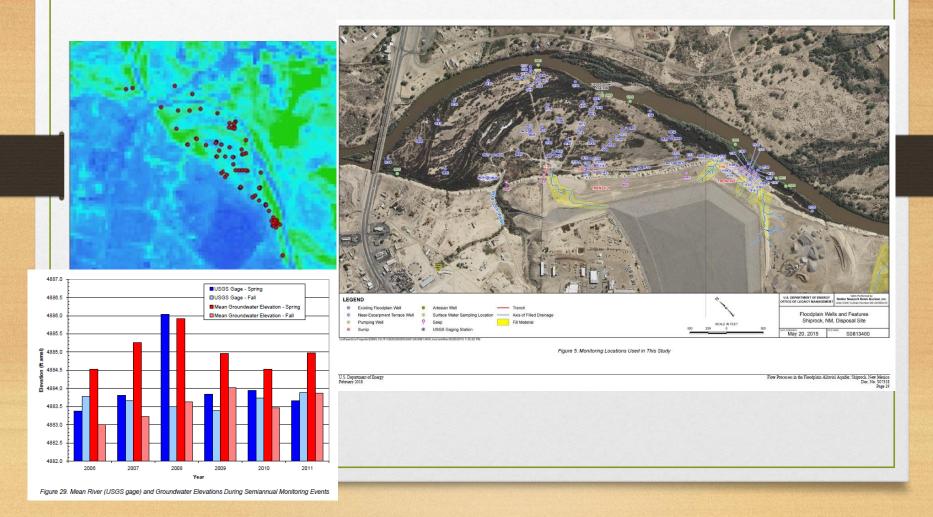
- (1) identifying plant species within the entire region of interest (ROI),
- (2) estimating changes in the abundance,
- (3) defining separate plant associations, and
- (4) delineating boundaries between plant associations.

A map of discrete vegetation/ET zones can be created by interpreting and field-checking boundaries between plant associations on high resolution UAV imagery.

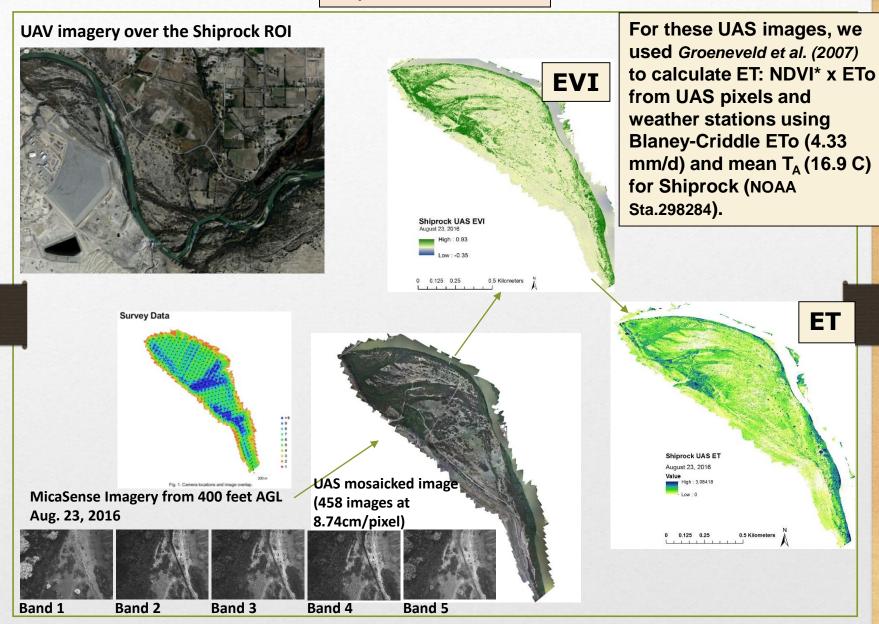
GPS points are shown for ground-truth of the dominant species for vegetation mapping.



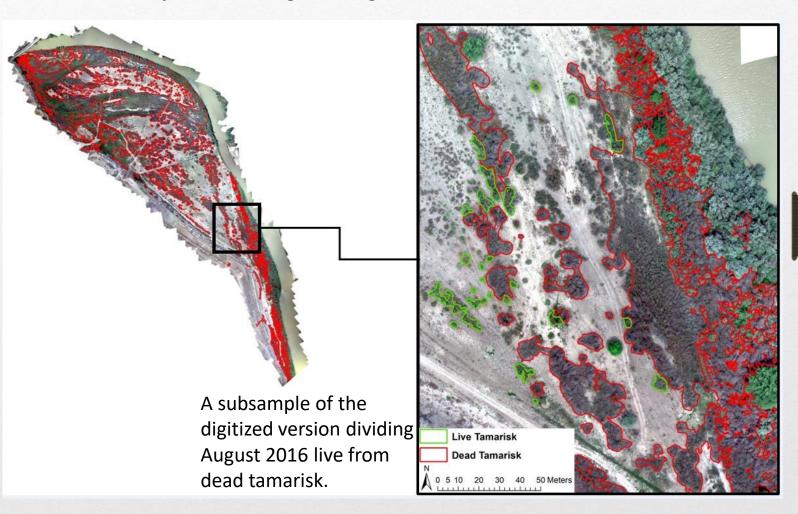
Well locations have been monitored. We are still assessing the relationships between depth to GW and ET and other factors such as distance to river and soil texture and salinity.



#### **Acquisition of UAV data**



#### We compared hand-digitized regions to classification methods



We teamed up with faculty and students at Diné College to measure LAI of phreatophytes growing on the floodplains. They measured LAI indirectly for tree species and directly for smaller shrubs.

The indirect method used a LAI-2000 instrument with a fish-eye optical sensor that detects light penetrating a tree canopy at different angles, and a mathematical model of light interception and transfer in tree canopies.

For the direct method, we harvested leaves overlying a standard ground surface area, and measured leaf area using an electronic planimeter.

#### **Shiprock Plant Species / Classes**

1 - grasses indian ricegrass Achnatherum hymenoides purple threeawn Aristida purpure arpu 1 saltgrass Distichlis spicata disp 3 foxtail barley Hordeum jubatum hoju 1 2 - shrubs/forbs Russian knapweed Acroptilon repens acre 3 burning bush Bassia scoparia basc 3 Russian thistle Salsola tragus satr 1 rubber rabbitbrush Ericameria nauseosa erna 10  broome snakeweed Gutierrezia sarothrae gusa 1 3 - phreatophyte fourwing saltbush Atriplex canescens atca 8 shrubs black greasewood Sarcobatus vermiculatus 4 - Russian olive Russian olive Elaeagnus angustifolia elan, elan-y 9 5 - Freemont cottonwood cottonwood Salix species salix 1 cottonwood Salix species salix 1 broadleaf cattail Typha latifolia tyla 1  8 - Siberian elm Siberian elm Ulmus pumila ulpu 4 9 - dead tamarisk dead tamarisk Tamarix ramosisima tara-h, tara-r 16(r), 4 (h)  11 - bare soil	Class	Common Name	Genus species	Acronym	Number
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cottonwood  6 - willow  7 - wetland  broadleaf cattail  8 - Siberian elm  9 - dead tamarisk  10 - healthy/ regreening tamarisk  cottonwood  Salix species  Salix  1  Typha latifolia  Ulmus pumila  Ulmus pumila  Ulmus pumila  tara-d  18  Tamarix ramosisima  tara-h, tara-r  16(r), 4  (h)	4 – Russian olive	Russian olive	Elaeagnus angustifolia	elan, elan-y	9
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broadleaf cattail  Typha latifolia  tyla  1  8 – Siberian elm  Siberian elm  Ulmus pumila  ulpu  4  9 – dead tamarisk  Tamarix ramosisima  tara-d  18  10 – healthy/ regreening tamarisk  Tamarix ramosisima  tara-h, tara-r  (h)	6 – willow	willow	Salix species	salix	1
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10 – healthy/ regreening tamarisk  healthy tamarisk  Tamarix ramosisima  tara-h, tara-r  (h)	8 – Siberian elm	Siberian elm	Ulmus pumila	ulpu	4
regreening tamarisk (h)	9 – dead tamarisk	dead tamarisk	Tamarix ramosisima	tara-d	18
11 – bare soil Bare 5	*	healthy tamarisk	Tamarix ramosisima	tara-h, tara-r	
	11 – bare soil			Bare	5

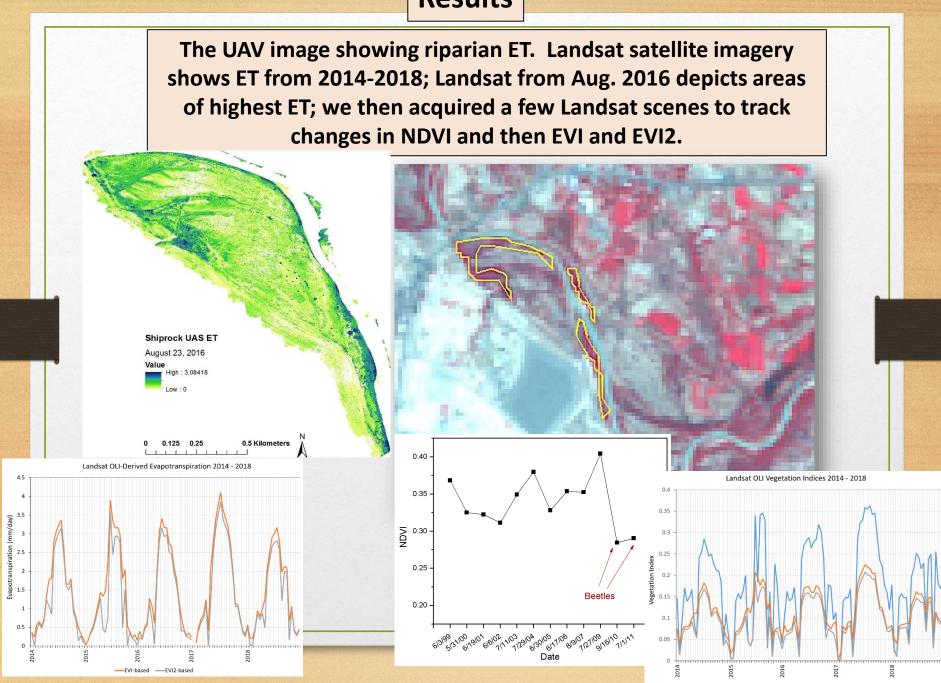
#### Sentinel-2 (10m spatial resolution)



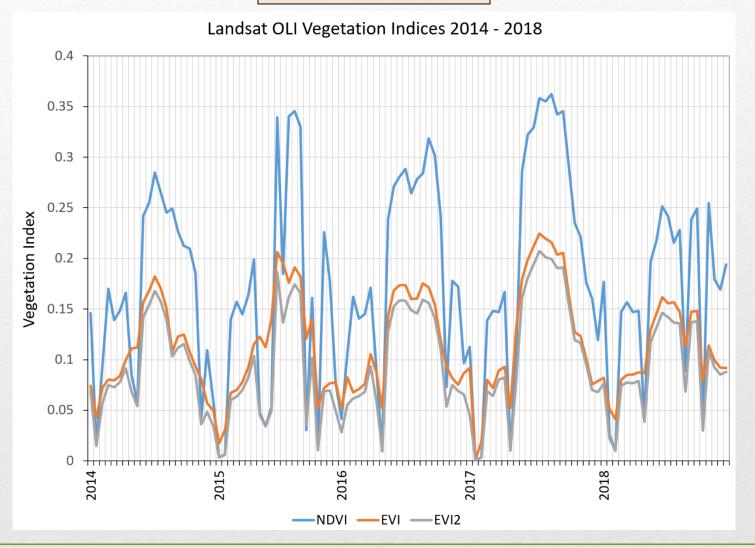
# **Satellite Imagery**

#### Landsat OLI (30m spatial resolution)

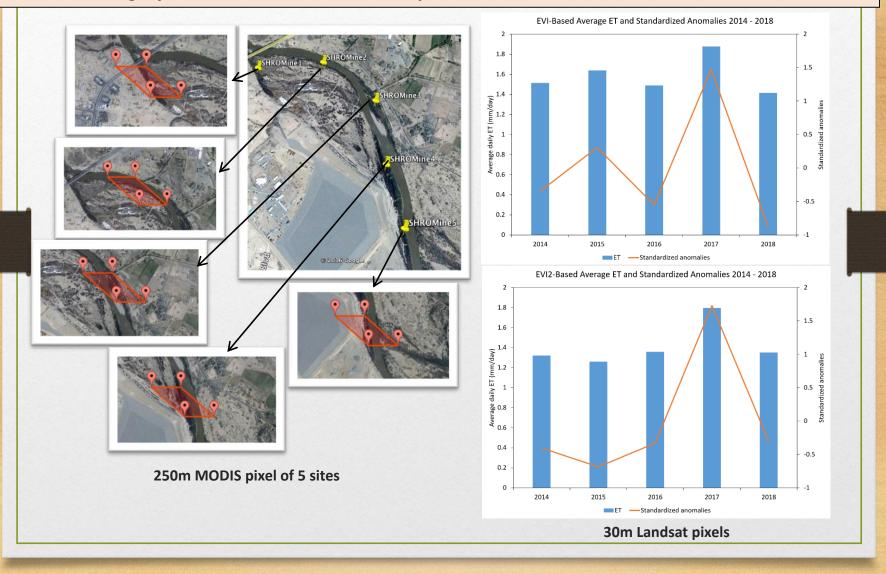




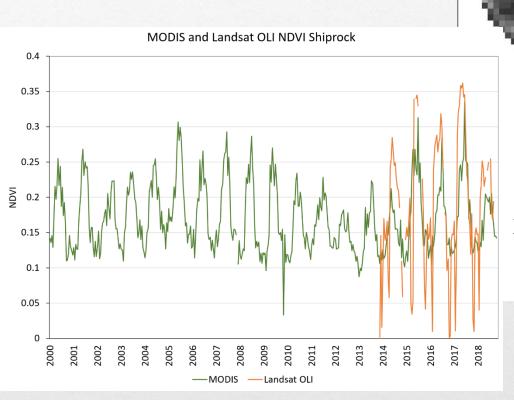




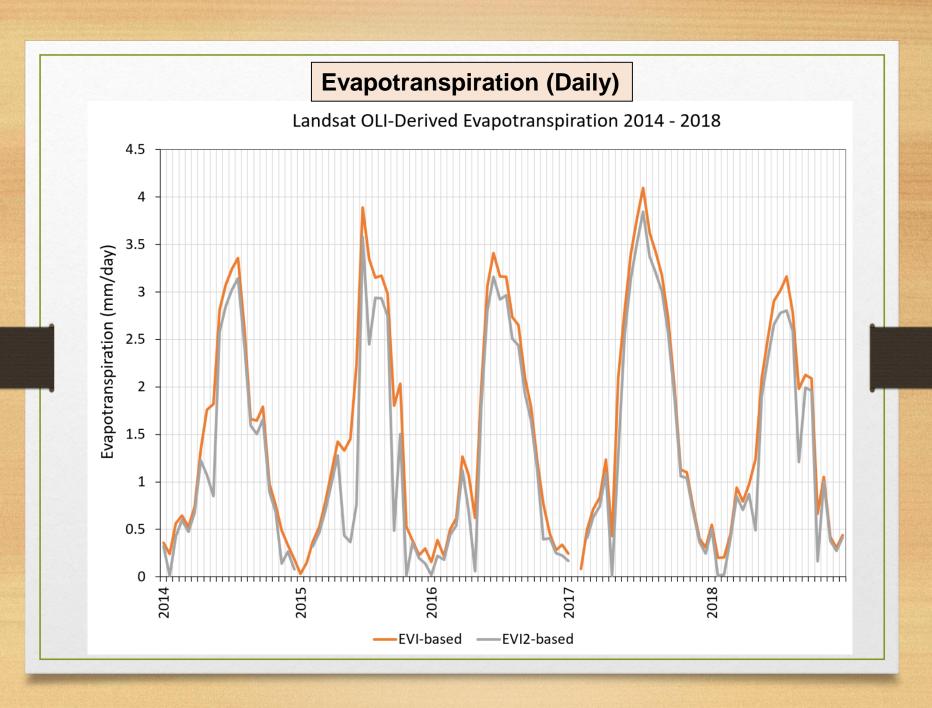
MODIS and Landsat EVI data was used to estimate ET over the past five years; we are processing Imagery back to 2000 to track the impact of the beetle which arrived ca. 2007.



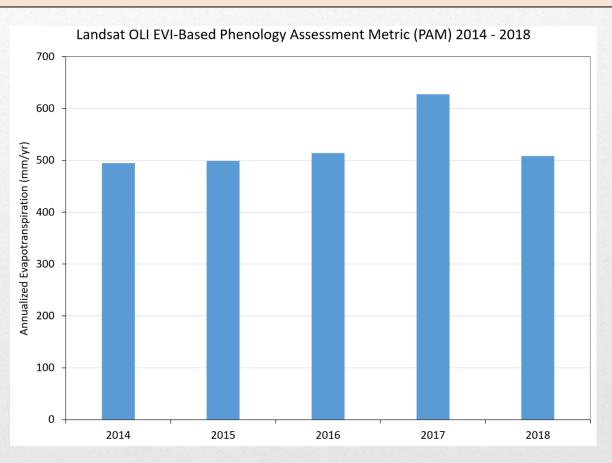
## **Vegetation Indices**



Landsat NDVI 2016



For the first time, we applied an area assessment (Phenology Assessment Metric, PAM) to quantify changes annually in ET for the tamarisk dominated riparian areas.



We acquired several sources of imagery for the Shiprock site:

- High resolution, 8cm, drone data
- Sentinal data at 10 m.
- Landsat 8 from Earth Explorer every 16 days. We transformed this imagery into an NDVI scene so that analysis of change from 2000 can be compared with MODIS EVI data.
- MODIS EVI. We then had both 250 m and 30 m pixels to document a timeseries of landscape-level changes in vegetation.

Using baseline LAI, fractional cover and vegetation greenness, we will now be able to monitor changes in plants and their water use over time, with ET approximately 1.5 mm / day or 500 mm / yr.

We processed and analyzed the UAS imagery to acquire a high-resolution ET image. With the LAI data from Shiprock and Moab, we are refining the algorithm for estimating landscape-scale ET. LM and USGS will use the new algorithm to estimate spatial, seasonal, and annual variation in ET and GW discharge for tamarisk and other phreatophytes growing along river corridors at the Shiprock site.

#### Conclusions

Our results showed that remotely sensed monitoring of ET was improved using the drone imagery. We used greater vegetation detail provided by UAS in combination with satellite imagery to improve the ET algorithm for scaling up from ground measurements of plant health to larger areas in the landscape. More reliable ET estimates may improve GW flow modeling at this site.

For the uranium mill site, we demonstrated improved quantification of ET by

- (1) using 4 resolutions of remotely sensed imagery at both sites and
- (2) showing changes in the ecosystem vegetation cover, tamarisk phenology, fractional greenness, and water use over long periods (18 years).

We conclude that our methods to estimate the effects of changes in tamarisk cover on landscape-scale ET estimates improved our understanding of plant water use at this uranium processing site. These data may also improve GW flow modeling and evaluation of GW remediation strategies.

## **Acknowledgements**

We would like to thank faculty from Diné College, a 4-year, tribally controlled community college serving the Navajo Nation.