



# **PREDICTED ARSENIC CONCENTRATIONS IN BASIN-FILL AQUIFERS OF THE SOUTHWEST**

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Western Region  
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**U.S. Department of the Interior  
U.S. Geological Survey**

# BACKGROUND

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In 2001 USEPA revised the arsenic drinking-water standard from 50 to 10  $\mu\text{g}/\text{L}$



Interest in areas within the United States where enriched arsenic concentrations in potable supplies are or may potentially occur

# OBJECTIVE

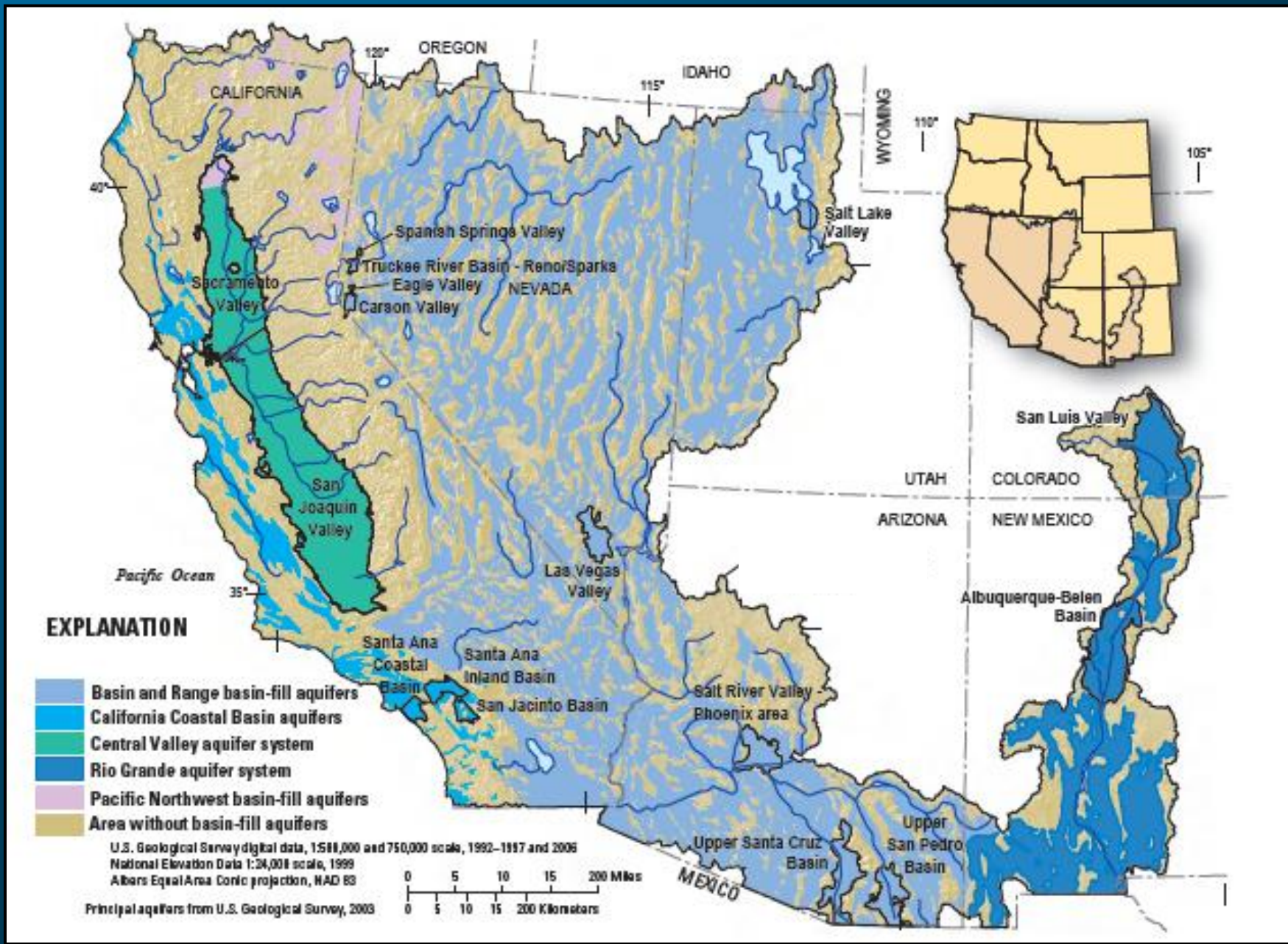
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Characterize a spatial context in arsenic concentrations throughout basin-fill aquifers of the Southwest United States

Using the current understanding of arsenic occurrence, geochemistry, and transport mechanisms

Predict arsenic concentrations from areas of known concentration to areas where concentrations are unknown

# Basin-Fill Aquifers



# OBJECTIVE

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Characterize a spatial context in arsenic concentrations throughout basin-fill aquifers of the Southwest United States

Using the current understanding of arsenic occurrence, geochemistry, and transport mechanisms

Predict arsenic concentrations from areas of known concentration to areas where concentrations are unknown

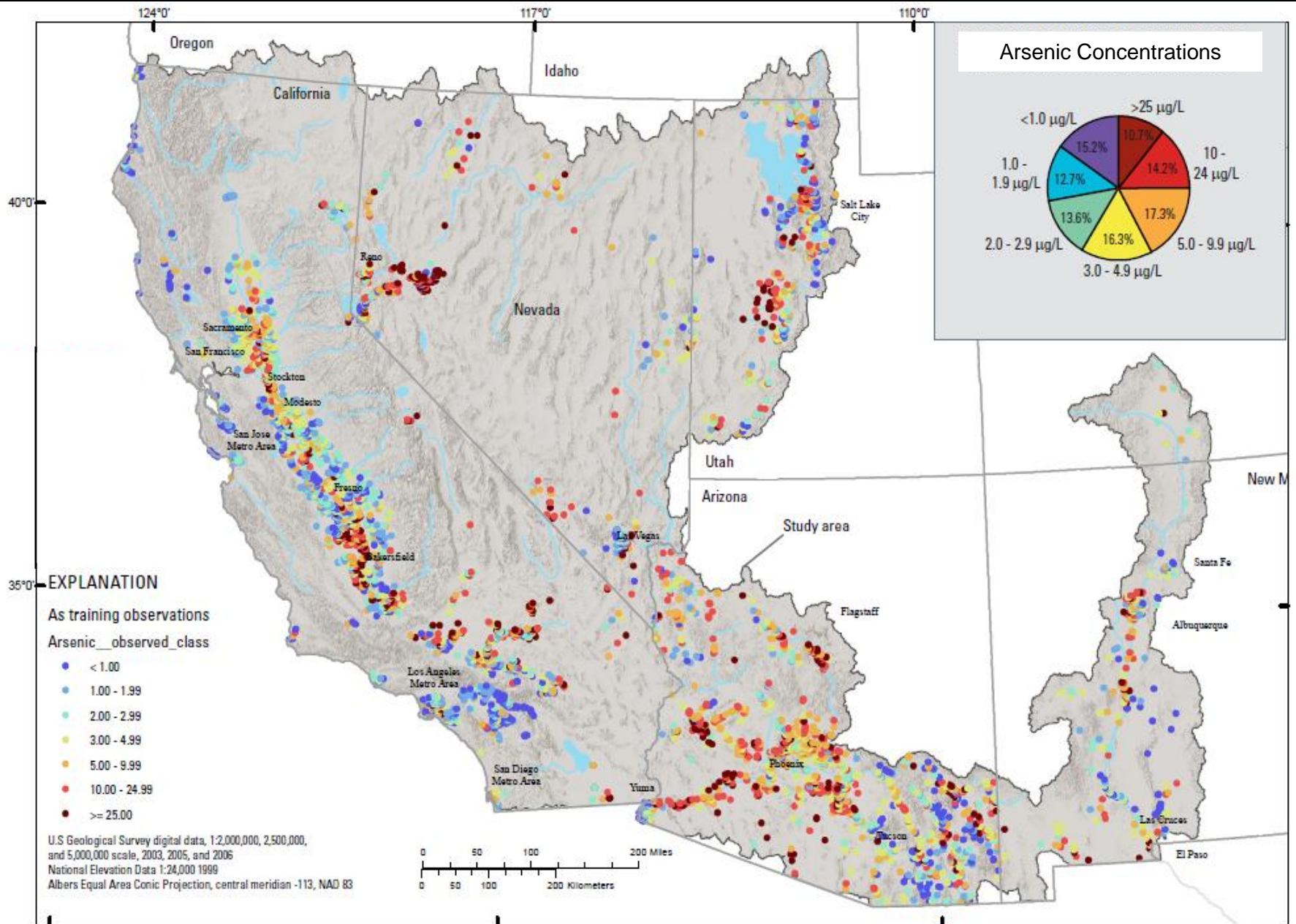
# APPROACH

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- The  $\approx 191,000$  mi<sup>2</sup> basin-fill regional study area was discretized into smaller spatial units (grid cells)
  - 54,854 grid cells (3.5 mi<sup>2</sup>/ each)
- Measured arsenic concentrations were available for about 6 percent (10,700 mi<sup>2</sup>) of the regional study area
  - One to two observations per grid cell (shallow, deep)
  - Measured arsenic concentrations available for 4,162 wells
  - 7 Categorical Concentration Classes (<1 to  $\geq 25$   $\mu\text{g/L}$ )

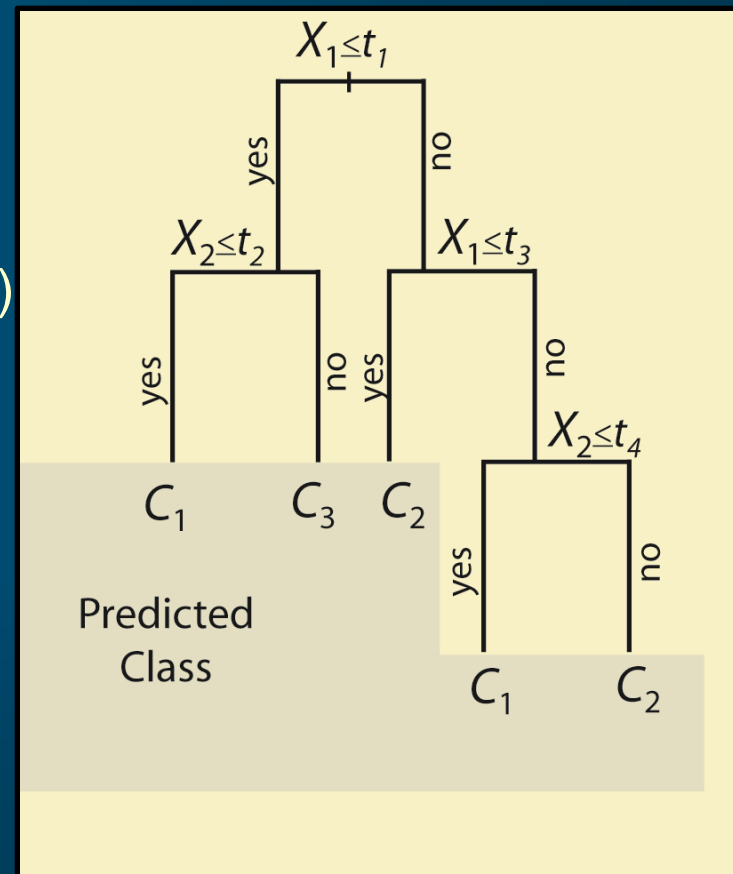


# Measured Arsenic Concentrations



# Random Forest Classifier (RFC): multiple decision tree analyses

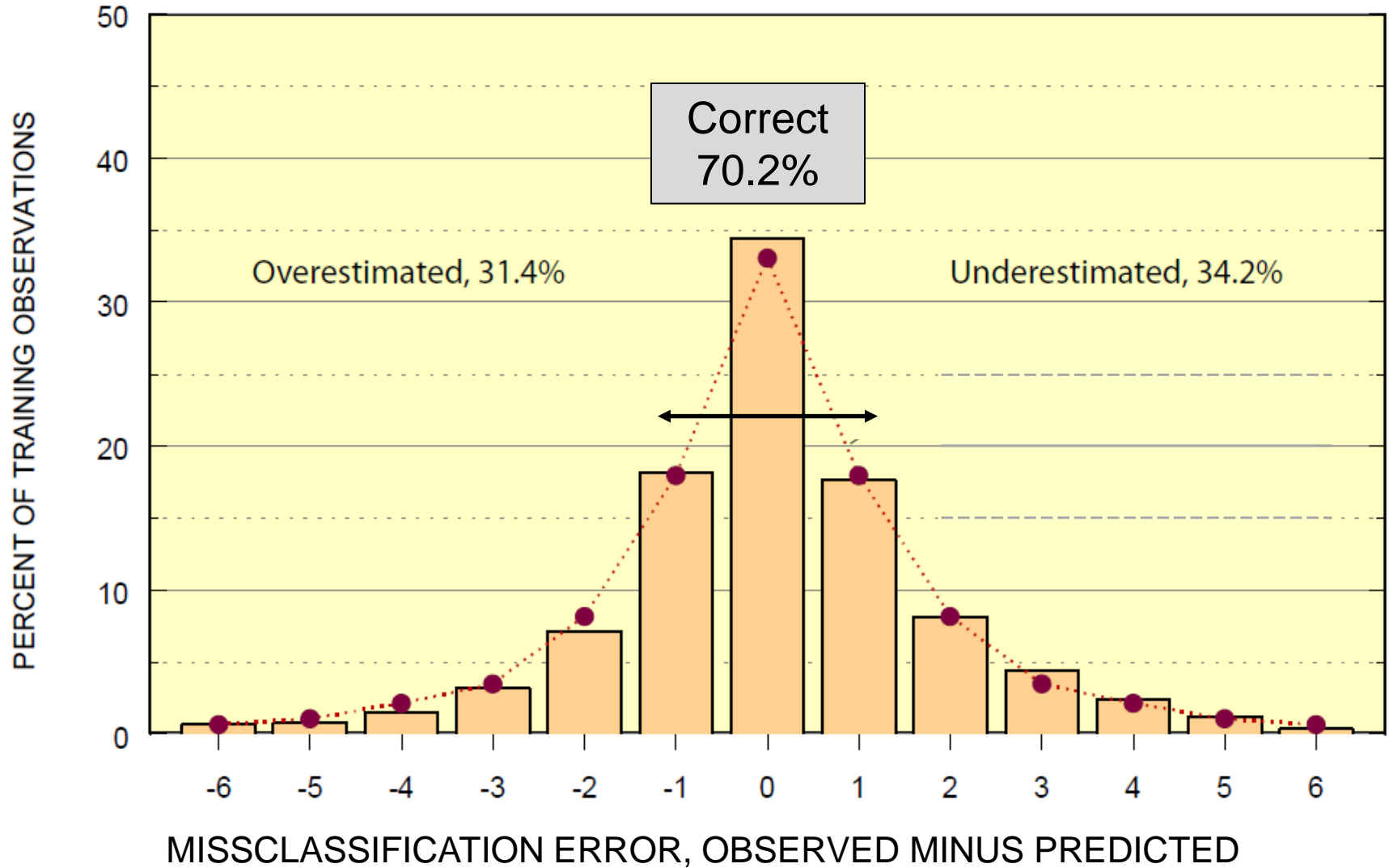
- Concentrations assigned to each of 7 concentration classes ( $C_n$ )
- Known concentrations used to calibrate using explanatory variables,  $X_n$  (53 available)
- Variables randomly selected for each tree (35 for each tree)
- Conditional relations among explanatory variables based on threshold value ( $t_n$ ) for each
- 1000 individual trees make up the RFC





# RFC PERFORMANCE

N = 4,162 wells



# EXPLANATORY VARIABLES

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## Prediction RFC

Explanatory variables throughout regional basin-fill study area = 53

- **Land use** (agricultural, urban, rangeland)
- **Water use** (irrigation, municipal)
- **Geology** (presence, cell distance from unit)
- **Soil characteristics** (permeability, composition)
- **Flow path** (elevation percentile, slope, distance from basin margin)
- **Hydroclimate** (potential ET, estimated contributory recharge)

# FACTORS IMPORTANT IN THE DISTRIBUTION OF ARSENIC









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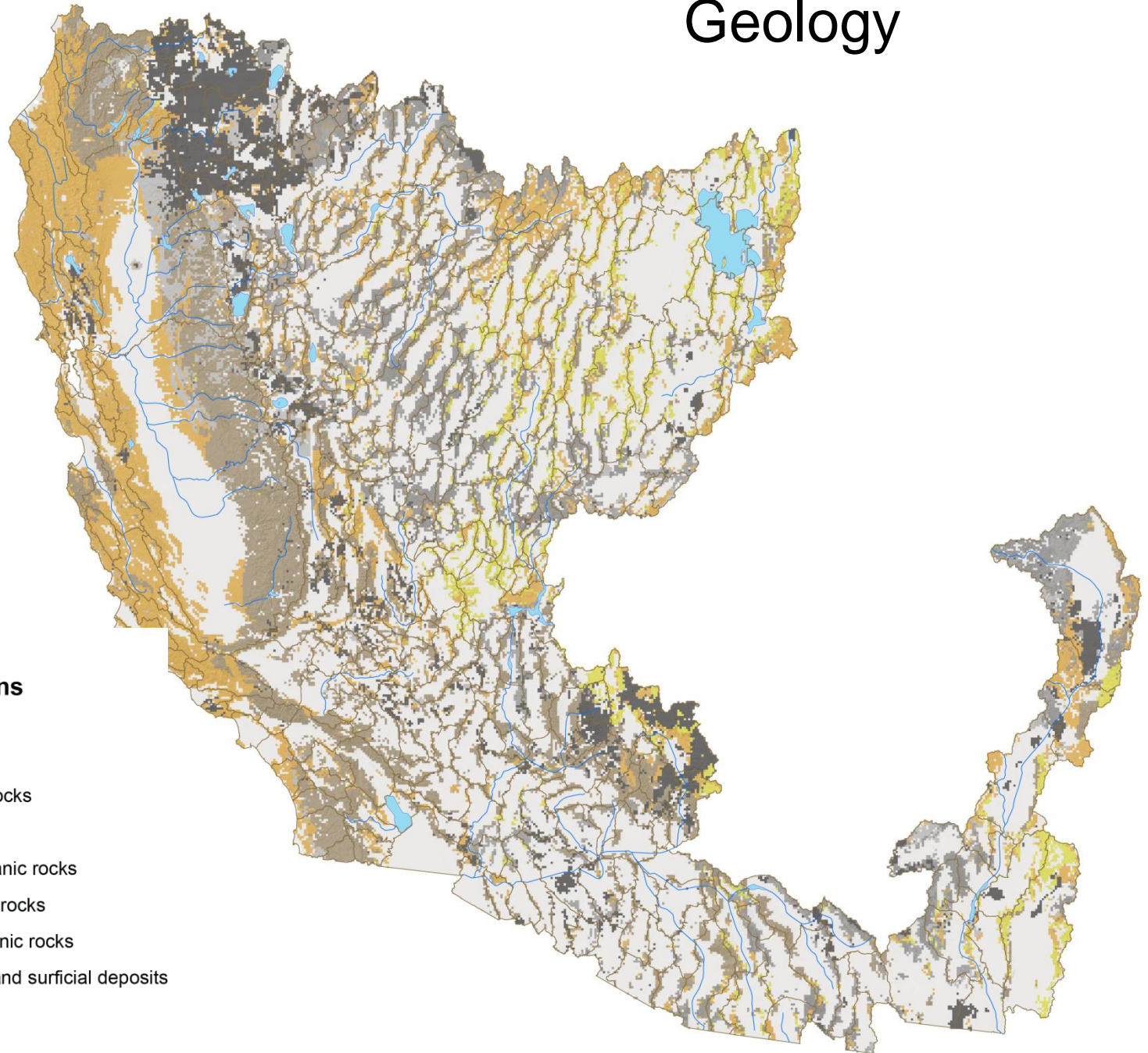
- Geology surrounding basin
- Position along flow path (residence time)
- Relative contributing recharge
- Basin characteristics (open, closed) – flushing

# Geology

## EXPLANATION

### Geology, all formations

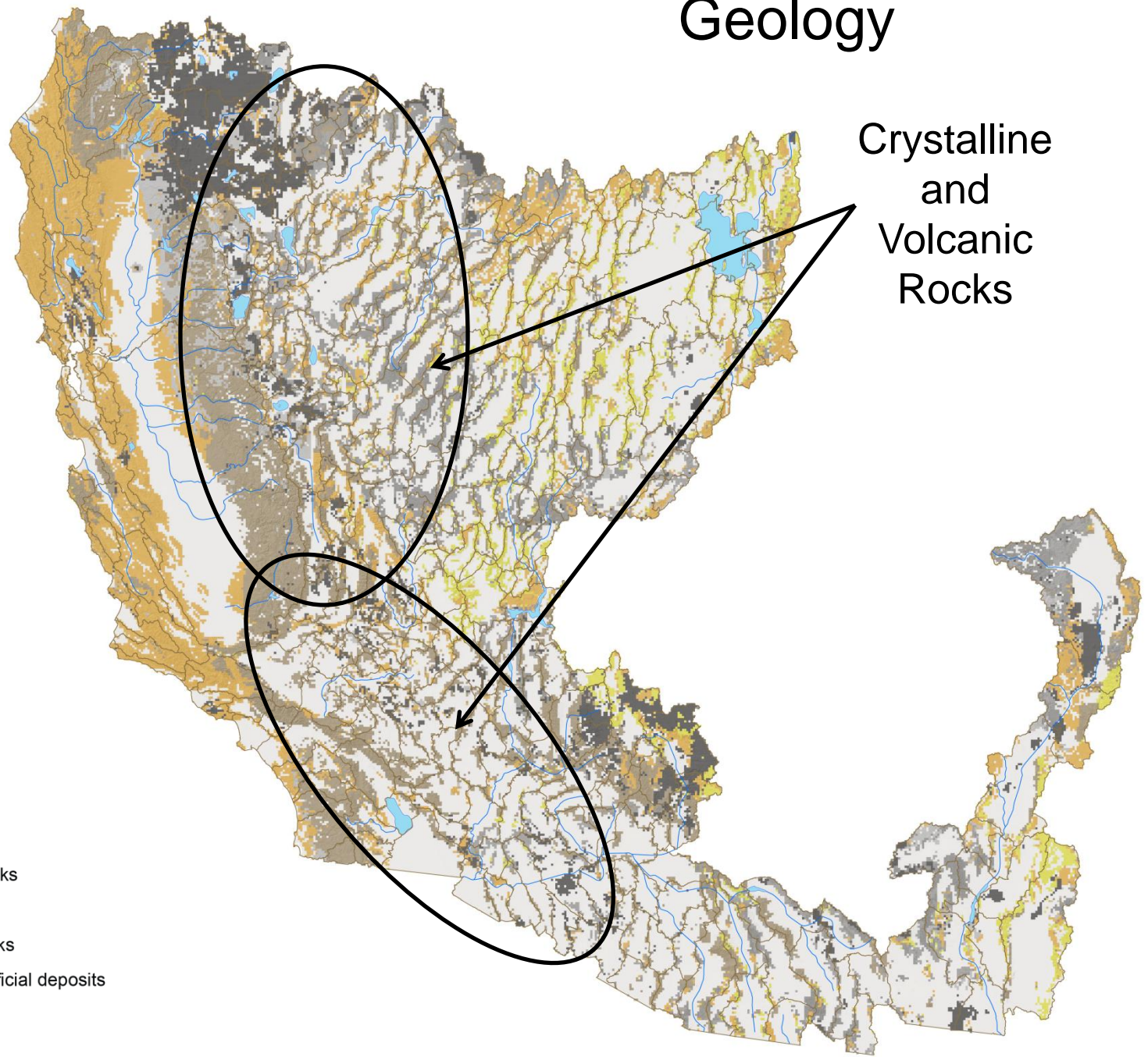
-  Carbonate rocks
-  Crystalline rocks
-  Clastic sedimentary rocks
-  Mafic volcanic rocks
-  Felsic and silicic volcanic rocks
-  Intermediate volcanic rocks
-  Undifferentiated volcanic rocks
-  Quaternary alluvium and surficial deposits





# Geology

Crystalline  
and  
Volcanic  
Rocks

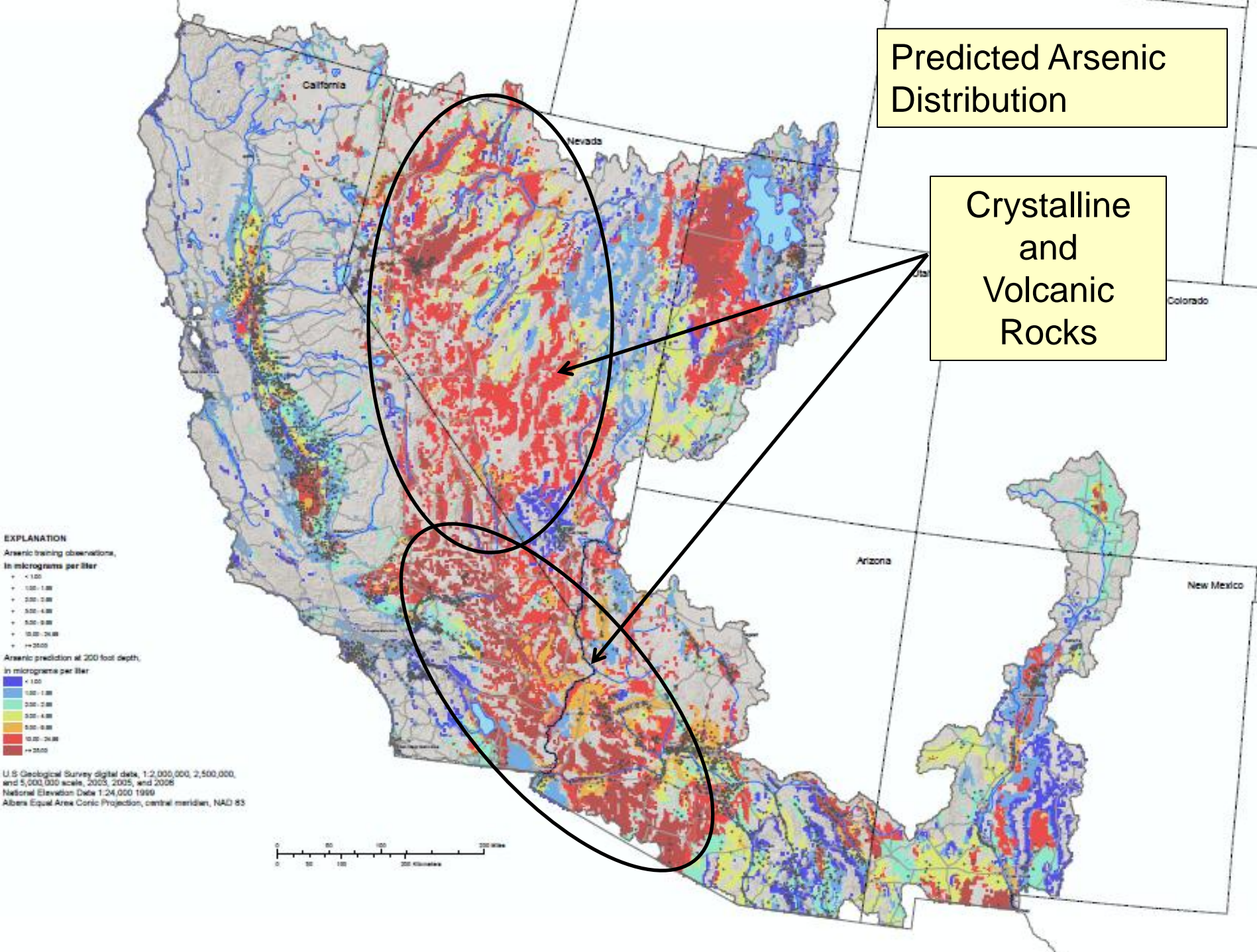


## EXPLANATION

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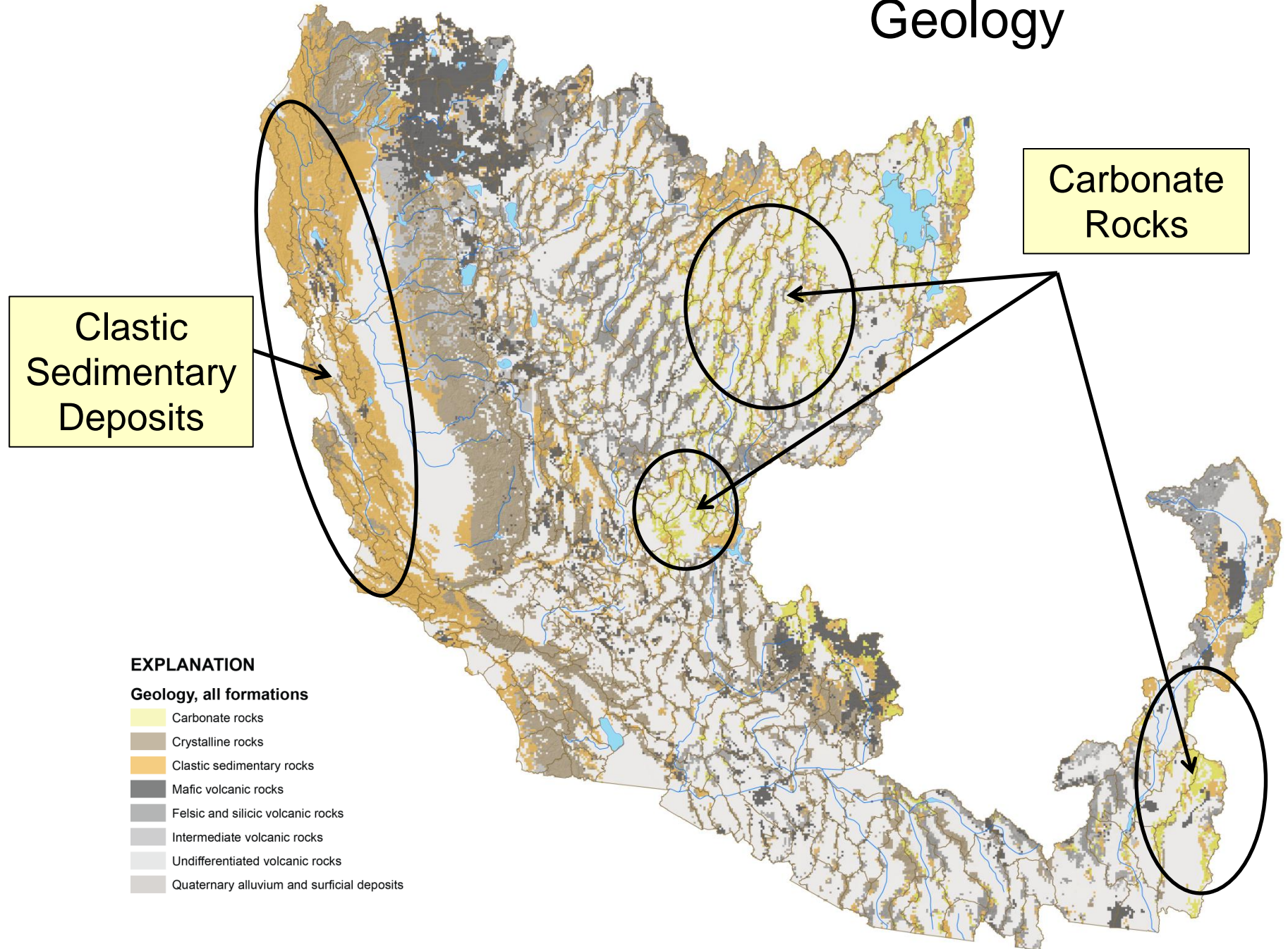
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# Geology



Clastic  
Sedimentary  
Deposits

Carbonate  
Rocks

Carbonate  
Rocks



Predicted Arsenic Distribution Throughout SWPA

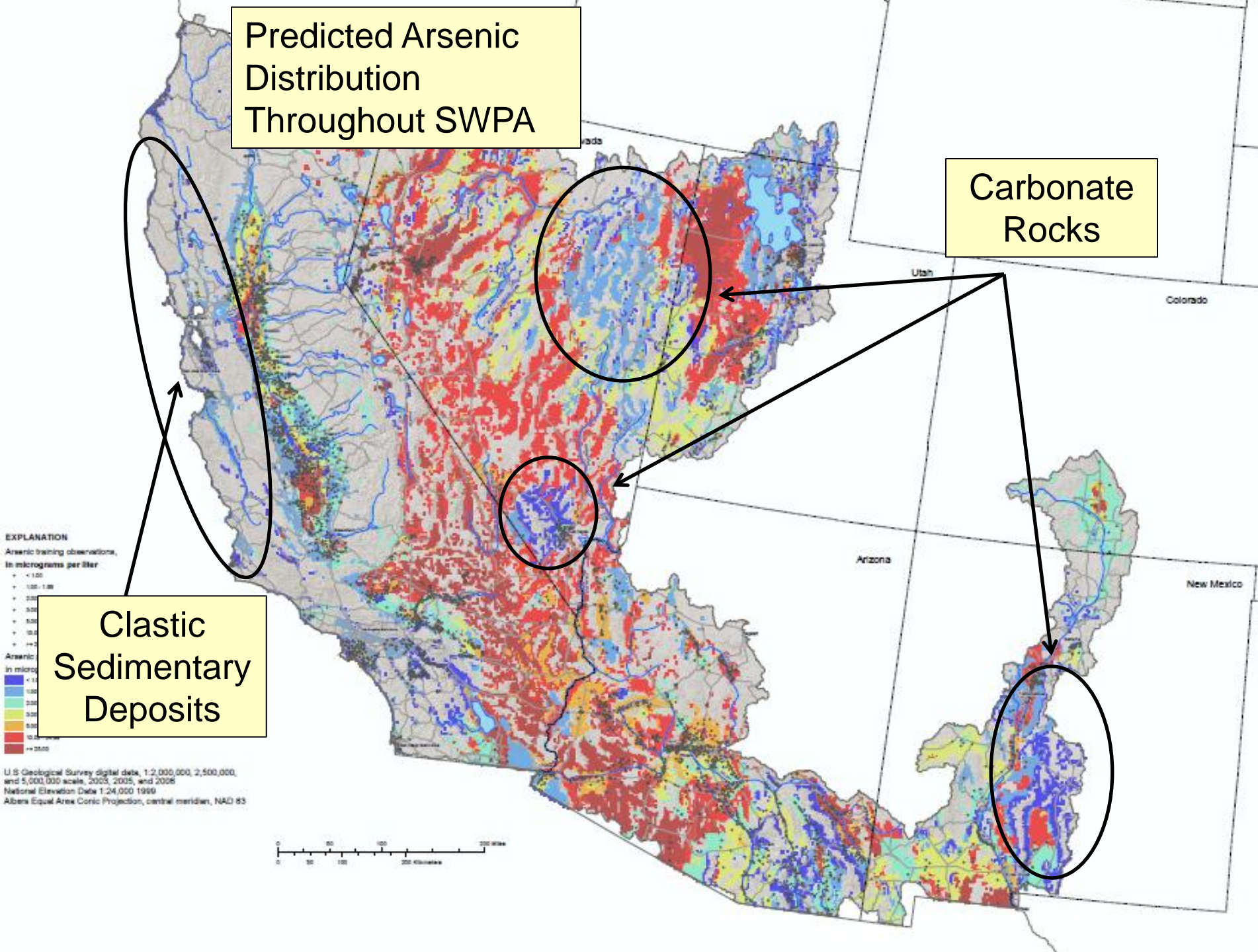
Carbonate Rocks

Clastic Sedimentary Deposits

EXPLANATION  
Arsenic training observations,  
In micrograms per liter



U.S. Geological Survey digital data, 1:2,000,000, 2,500,000,  
and 5,000,000 scale, 2003, 2005, and 2008  
National Elevation Data 1:24,000 1999  
Albers Equal Area Conic Projection, central meridian, NAD 83

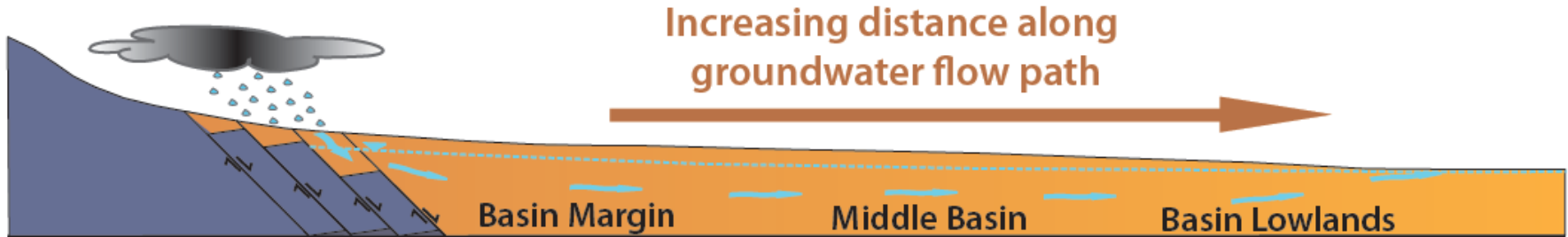
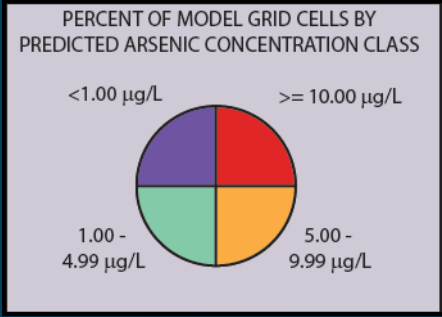


# FACTORS IMPORTANT IN THE DISTRIBUTION OF ARSENIC THROUGHOUT SWPA

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- Geology surrounding basin
- Position along flow path (residence time)
- Relative contributing recharge
- Basin characteristics (open, closed) – flushing effects

# Arsenic, Flow Path, and Recharge

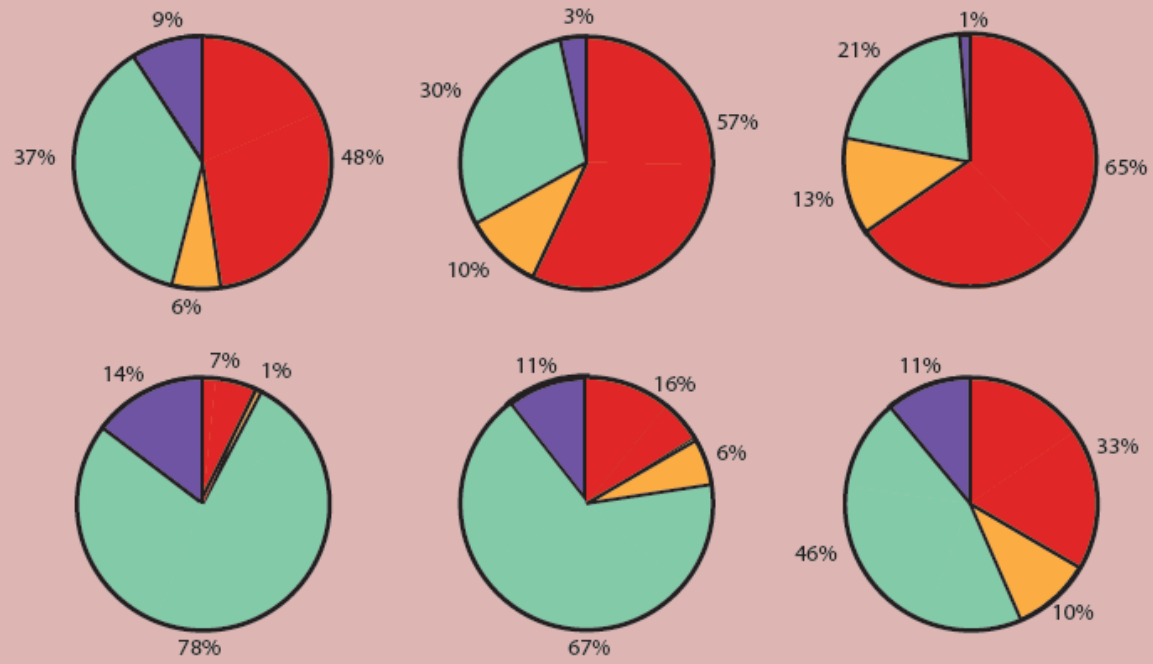


Volcanic and Crystalline Rocks

Recharge Condition

Low Recharge

High Recharge





# FACTORS IMPORTANT IN THE DISTRIBUTION OF ARSENIC THROUGHOUT SWPA

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# Predicted Arsenic Distribution Throughout SWPA

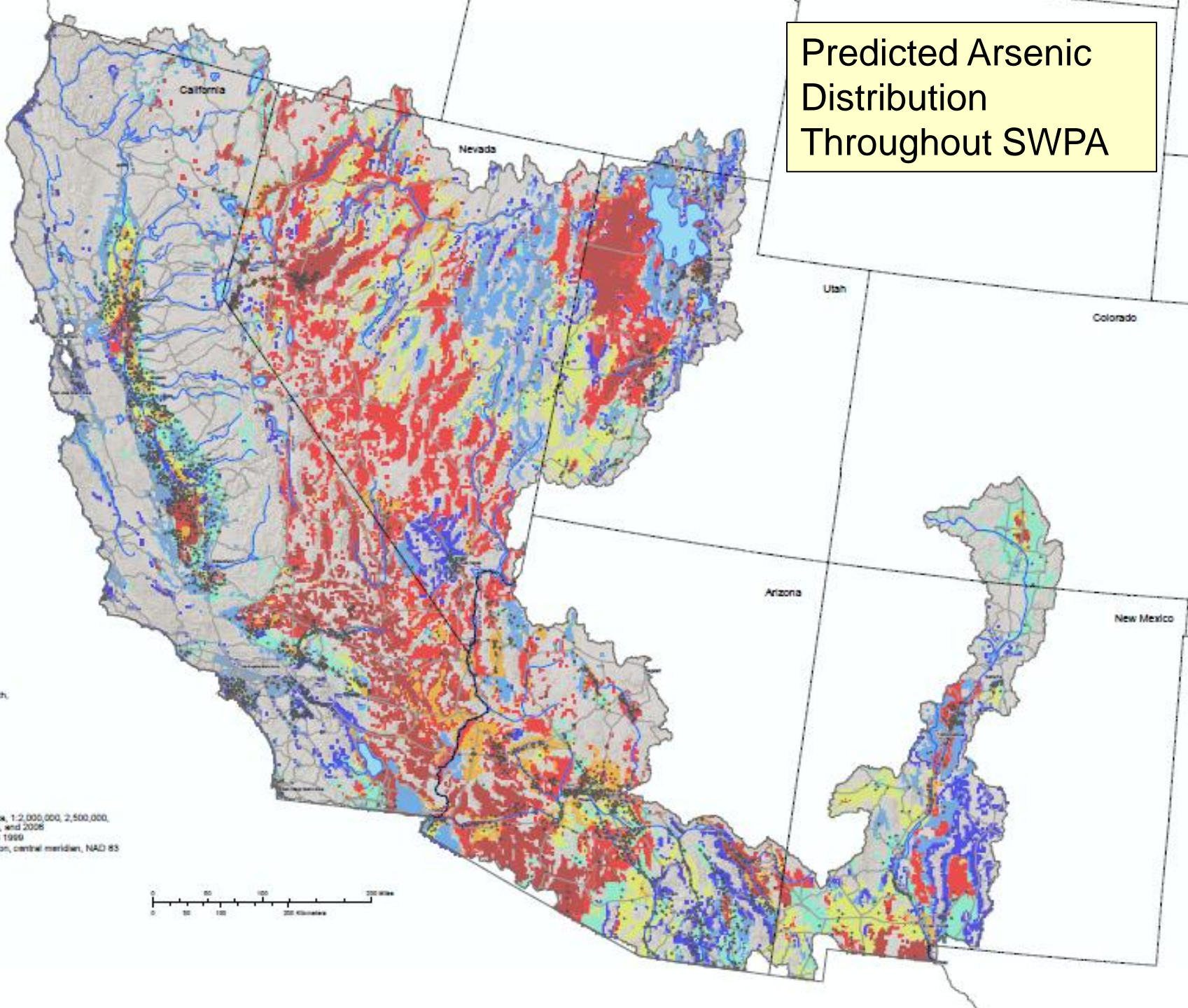
**EXPLANATION**  
Arsenic training observations,  
In micrograms per liter

- < 1.00
- 1.00 - 1.99
- 2.00 - 2.99
- 3.00 - 4.99
- 5.00 - 9.99
- 10.00 - 24.99
- >= 25.00

Arsenic prediction at 200 foot depth,  
In micrograms per liter

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- 2.00 - 2.99
- 3.00 - 4.99
- 5.00 - 9.99
- 10.00 - 24.99
- >= 25.00

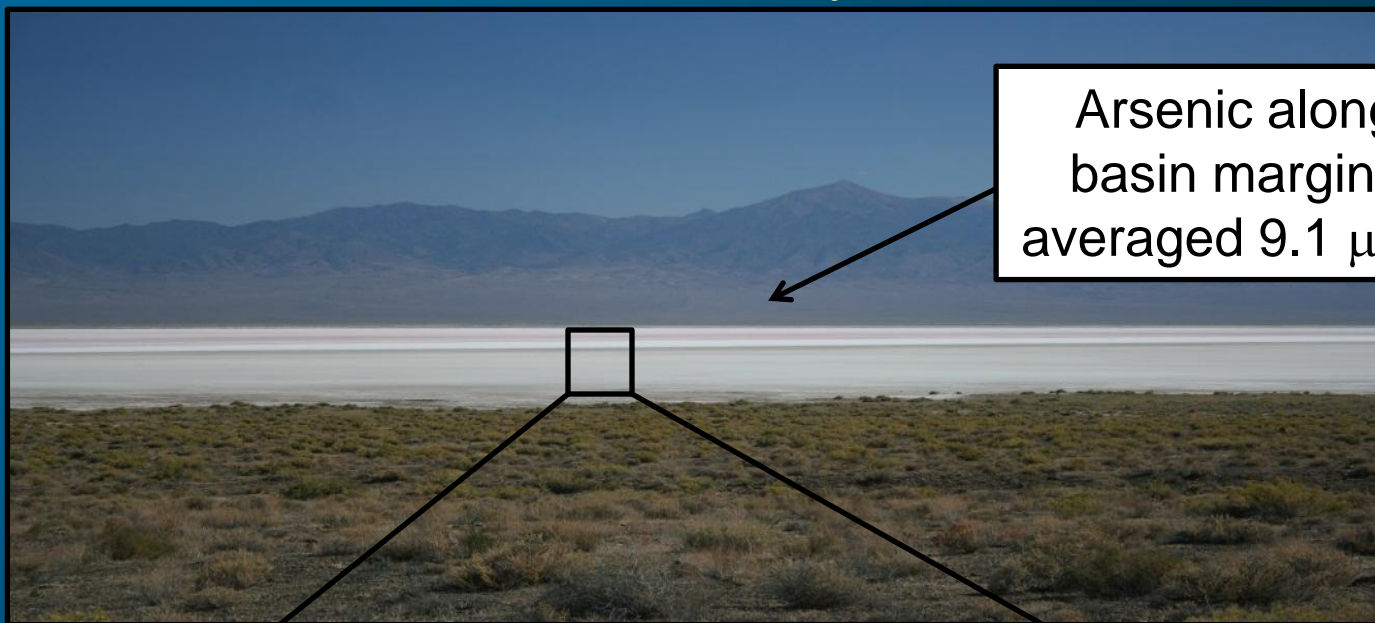
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# Arsenic in Dixie Valley, Nevada



Arsenic along  
basin margins  
averaged  $9.1 \mu\text{g/L}$



In the playa, shallow  
groundwater arsenic  
concentrations  
averaged  $12,000 \mu\text{g/L}$

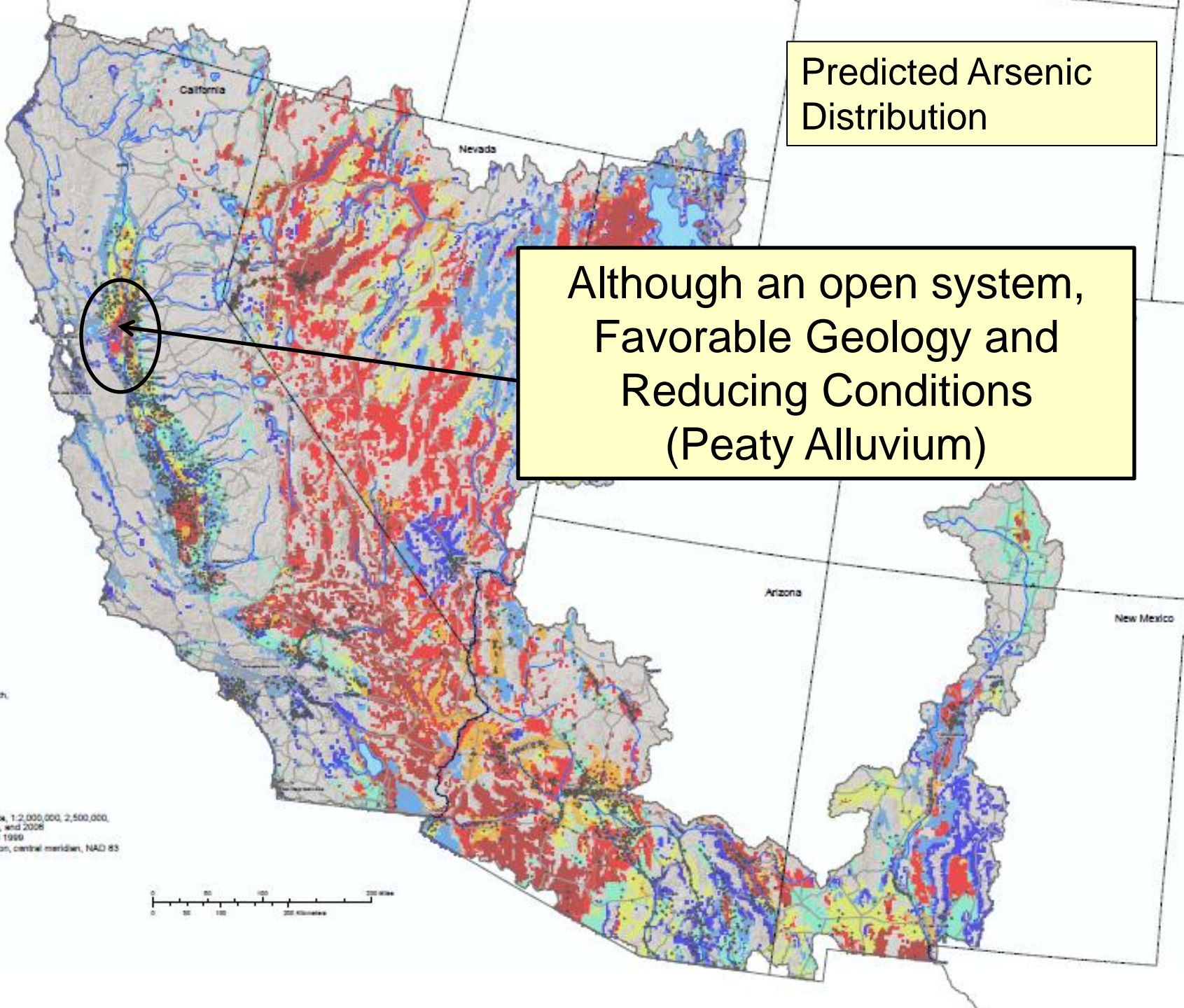


# Predicted Arsenic Distribution

Although an open system, Favorable Geology and Reducing Conditions (Peaty Alluvium)

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# Predicted Arsenic Distribution

Although geology favors As enrichment, largely open basins -- flushed

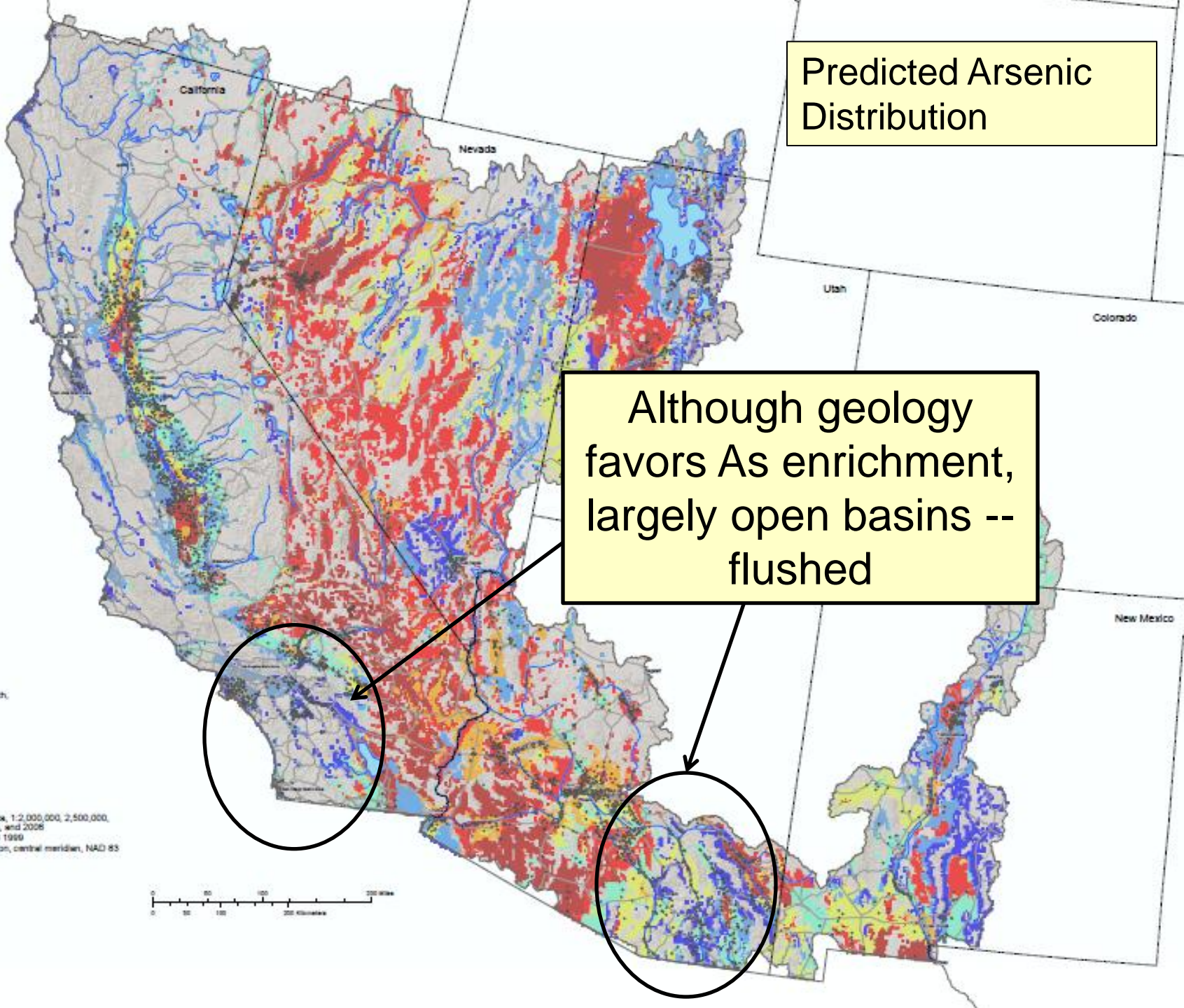
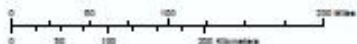
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# Predicted Arsenic Distribution

## Long Residence Time

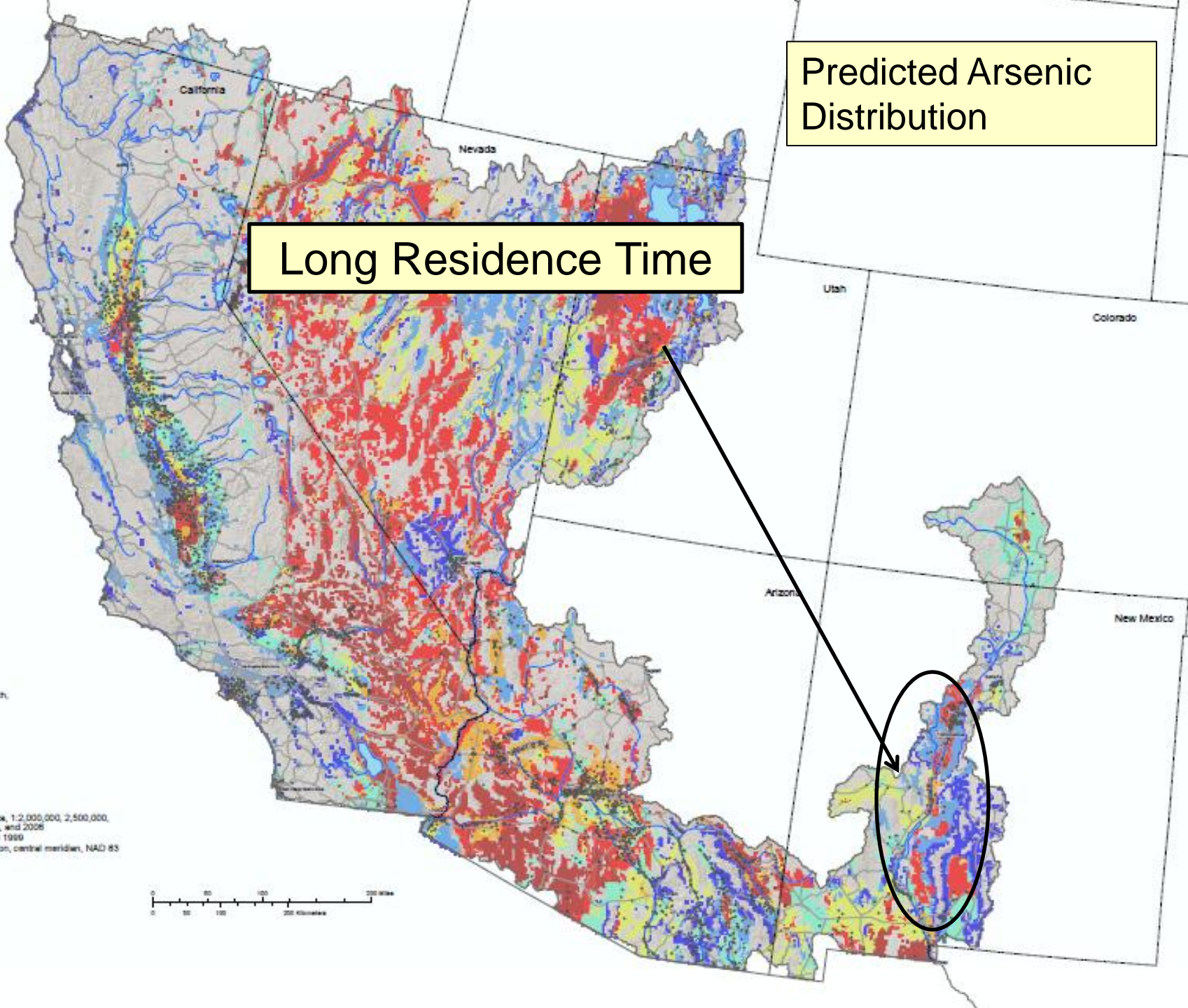
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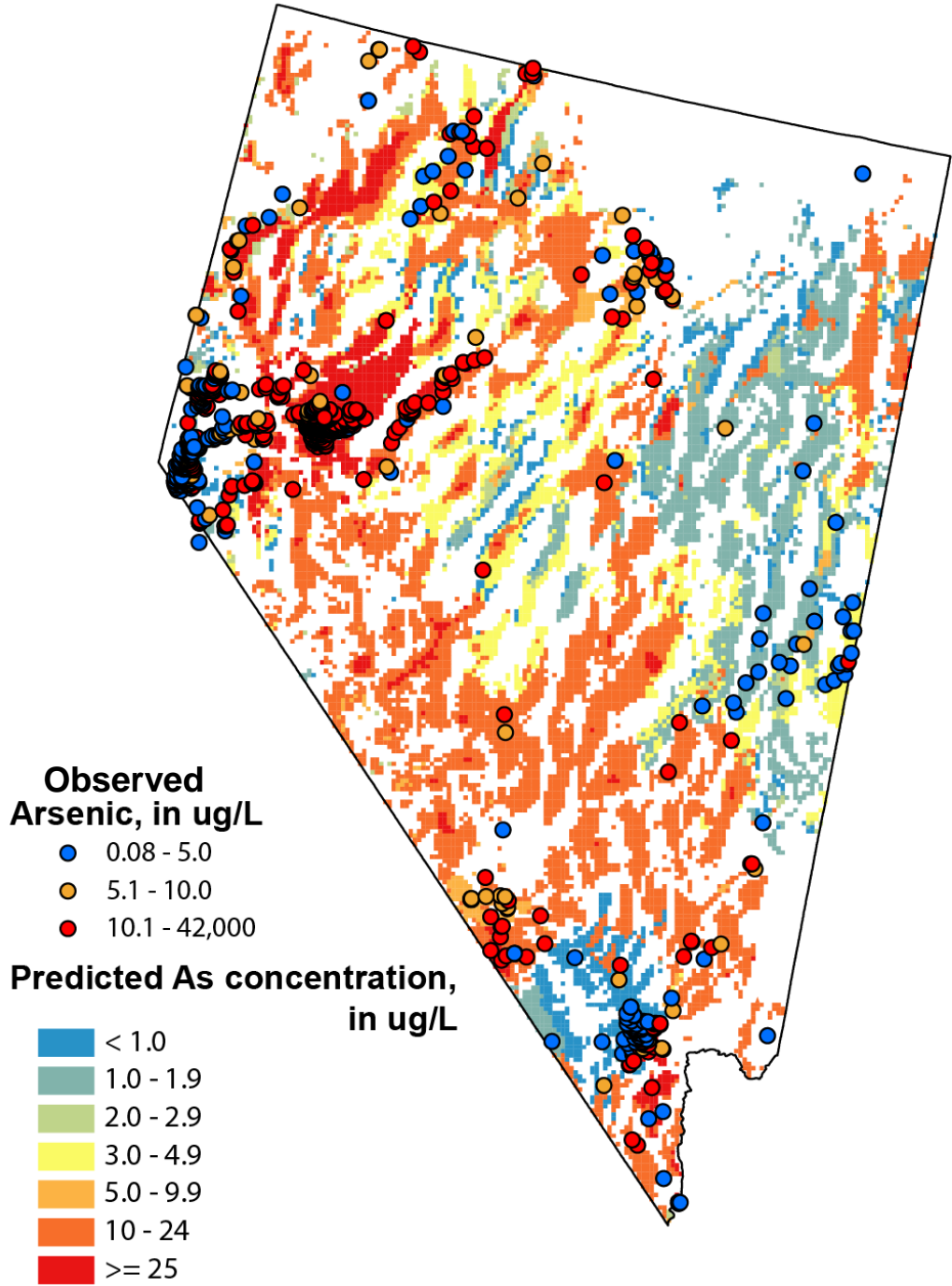
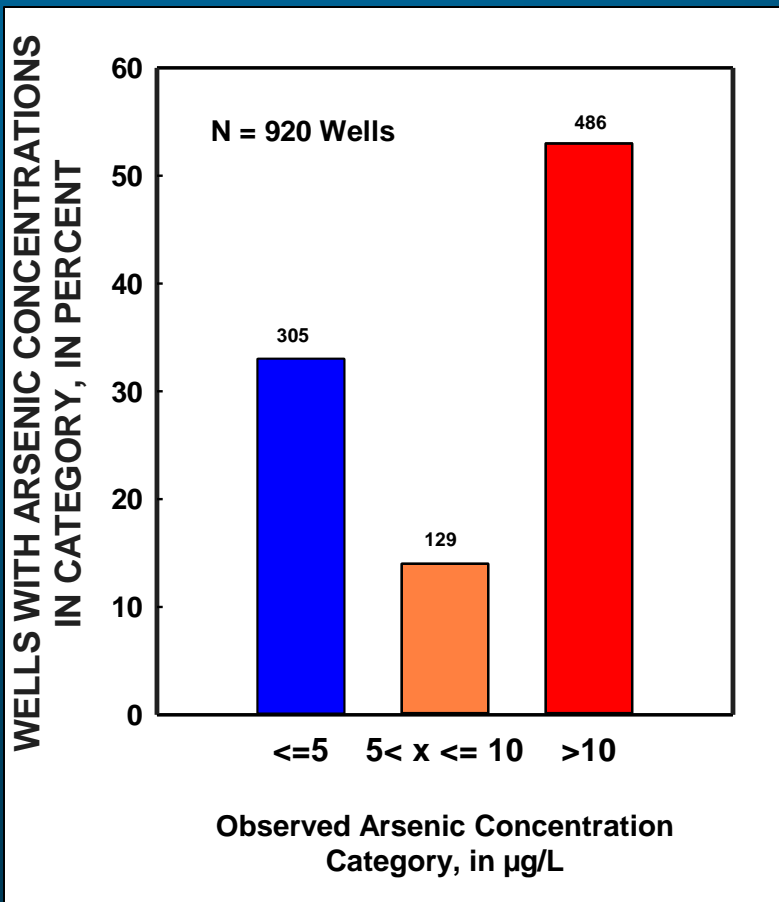
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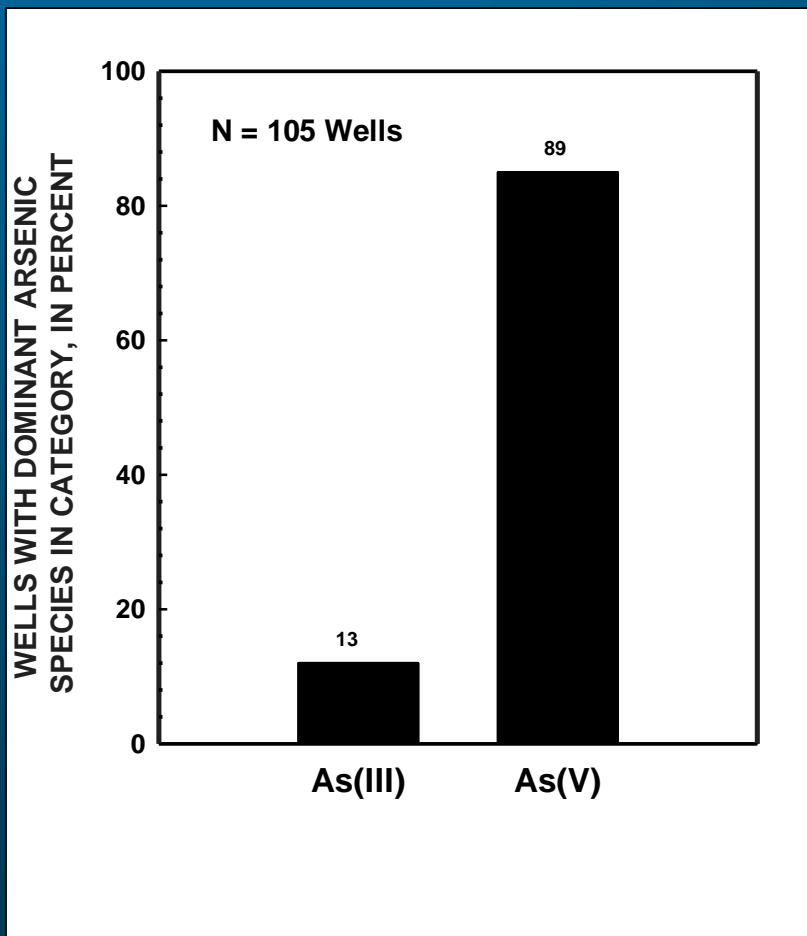


# Observed and Predicted Arsenic Distribution Throughout the State of Nevada

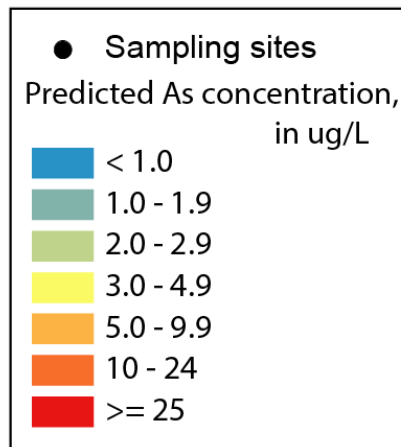


# Sites where arsenic speciation has been characterized

(in collaboration with NBMG)



N=3 wells with <LRL for all species



# Within the 191,000 mi<sup>2</sup> area representing the Southwest basin-fill aquifers

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Wells located in areas:

- surrounded by volcanic rocks
- with relatively low recharge conditions
- down gradient areas along a flow path (long residence)
- topographically low lying areas (particularly closed)

will likely have relatively high arsenic concentrations

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# Areas Where Arsenic is Predicted to Exceed Current Drinking-Water Standard

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- About 43 percent ( $\approx 81,400$  mi<sup>2</sup>) of the regional study area
  - Primarily in the Basin and Range basin-fill aquifers
  - Within Nevada 53 percent of 920 wells have arsenic concentrations  $>10$   $\mu\text{g/L}$
  - Most of the arsenic in Nevada wells for which speciation has been evaluated occurs as As(V)

# Questions?

**EXPLANATION**

Arsenic training observations,

in micrograms per liter

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- + 1.00 - 1.99
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- + 10.00 - 24.99
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