

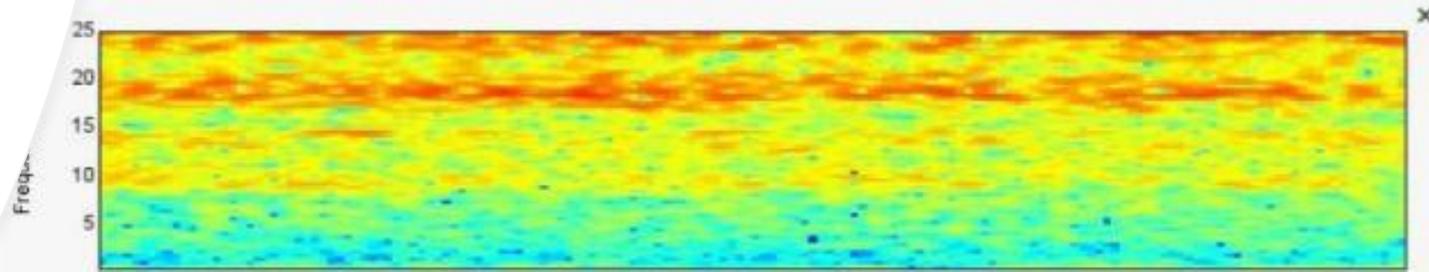
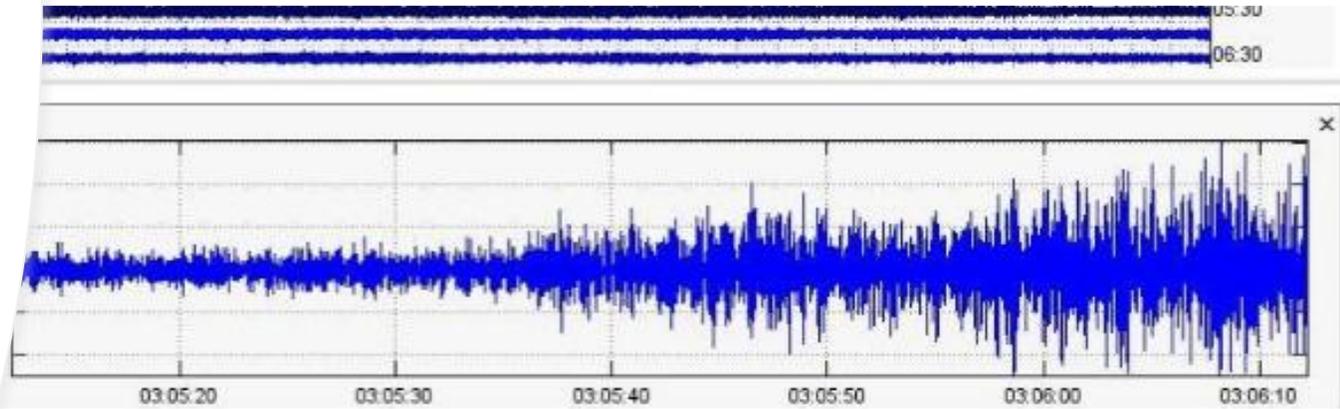
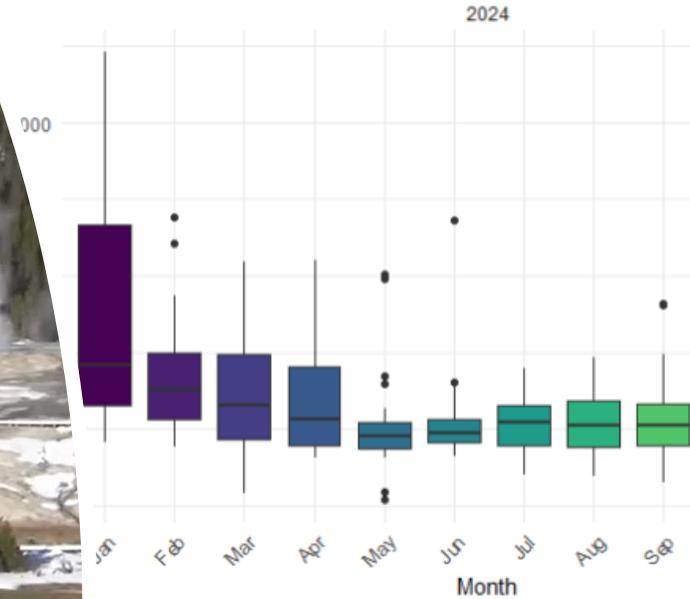
Eruptions by Proxy

Remote Geyser Gazing and Data Interpretation

By Korben Cooper



Beehive Intervals by Month during 2024



Who am I?

- Geyser Gazing Regularly Since 2019
- Petroleum Engineering and Data Science
- Old Faithful Webcam Volunteer
- Research Impact of Climate on Subsurface Fluid Reservoirs



Presentation Outline

1. Remote Geyser Gazing

- Old Faithful Webcam
- Seismographs
- Geysertimes
- Other Loggers

2. Data and Geysers

- Data Science Workflow
- Issues with Geyser Data
- Case Studies (Beehive and Strokkur)
- AI and Geyser Data

```
# --- Fetch Beehive eruption data ---
url = f"https://www.geysertimes.org/api/v5/entries/{one_year_ago_epoch}/{now_epoch}/{beehive_id}?iso=1"
response = requests.get(url)
data = response.json()

all_intervals, all_interval_times, all_interval_labels = [], [], []
if data["status"] == "success":
    eruptions = sorted(data["entries"], key=lambda x: x["time"])
    times = [datetime.fromisoformat(e["time"].replace("Z", "+00:00")) for e in eruptions]
    for i in range(1, len(times)):
        interval_hours = (times[i] - times[i - 1]).total_seconds() / 3600
        if interval_hours > 1:
            all_intervals.append(interval_hours)
            all_interval_times.append(times[i])
            all_interval_labels.append(times[i].strftime("%Y-%m"))
else:
    print("Failed to retrieve interval data:", data.get("message", "Unknown error"))

# --- Fetch durations ---
durations_by_time = []
if data["status"] == "success":
    for entry in data["entries"]:
        dur_sec = entry.get("durationSec")
        time_str = entry.get("time")
        res = entry.get("durationRes")
        if dur_sec is not None and time_str is not None and res != 1:
            try:
                dur_sec = int(dur_sec)
                if dur_sec > 0:
                    timestamp = datetime.fromisoformat(time_str.replace("Z", "+00:00"))
                    durations_by_time.append((timestamp, dur_sec / 60))
            except ValueError:
                continue
```

Webcam Resources

- **Old Faithful Webcam**

- NPS Page

<https://www.nps.gov/yell/learn/photosmultimedia/webcams.htm>

- Geysertimes Chatpage

<https://chat.geysertimes.org/#>

- 12hr Webcam Loop

<https://www.youtube.com/watch?v=f7NDLBzILto>

- **Biscuit Basin Webcam**

- USGS Link

<https://www.usgs.gov/media/webcams/biscuit-basin-webcam>

- Joel's Webcam Loop

<https://www.cs.drexel.edu/~jrh436/blackdiamond/>

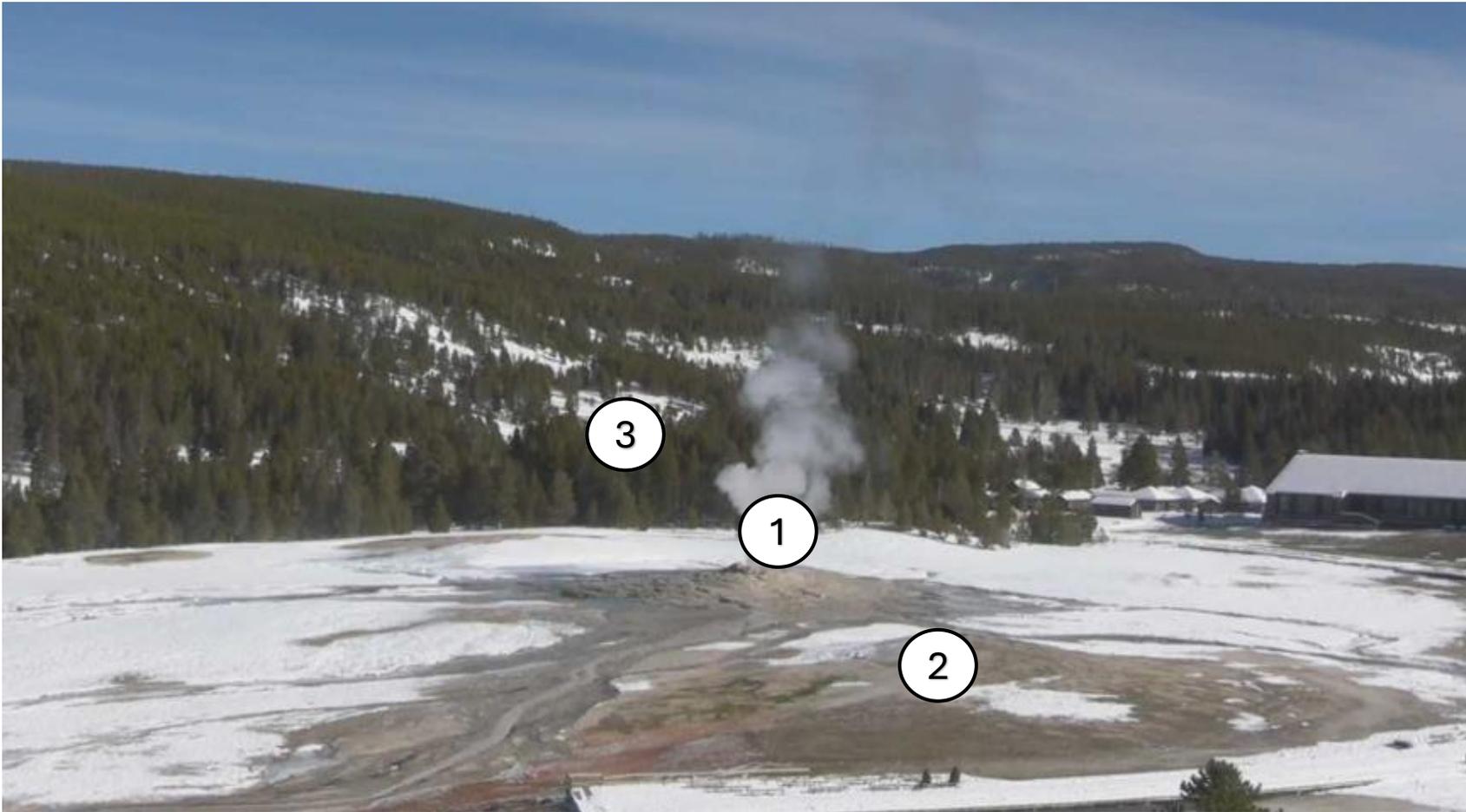
Old Faithful Webcam

- Located on top of the Old Faithful Inn
- Required to be on Old Faithful during Old Faithful's Window
- Moves elsewhere at Cam Operator discretion

Scope of Use: Eruption Times. Observing Behavior on Select Features.



Old Faithful: Feature Identification



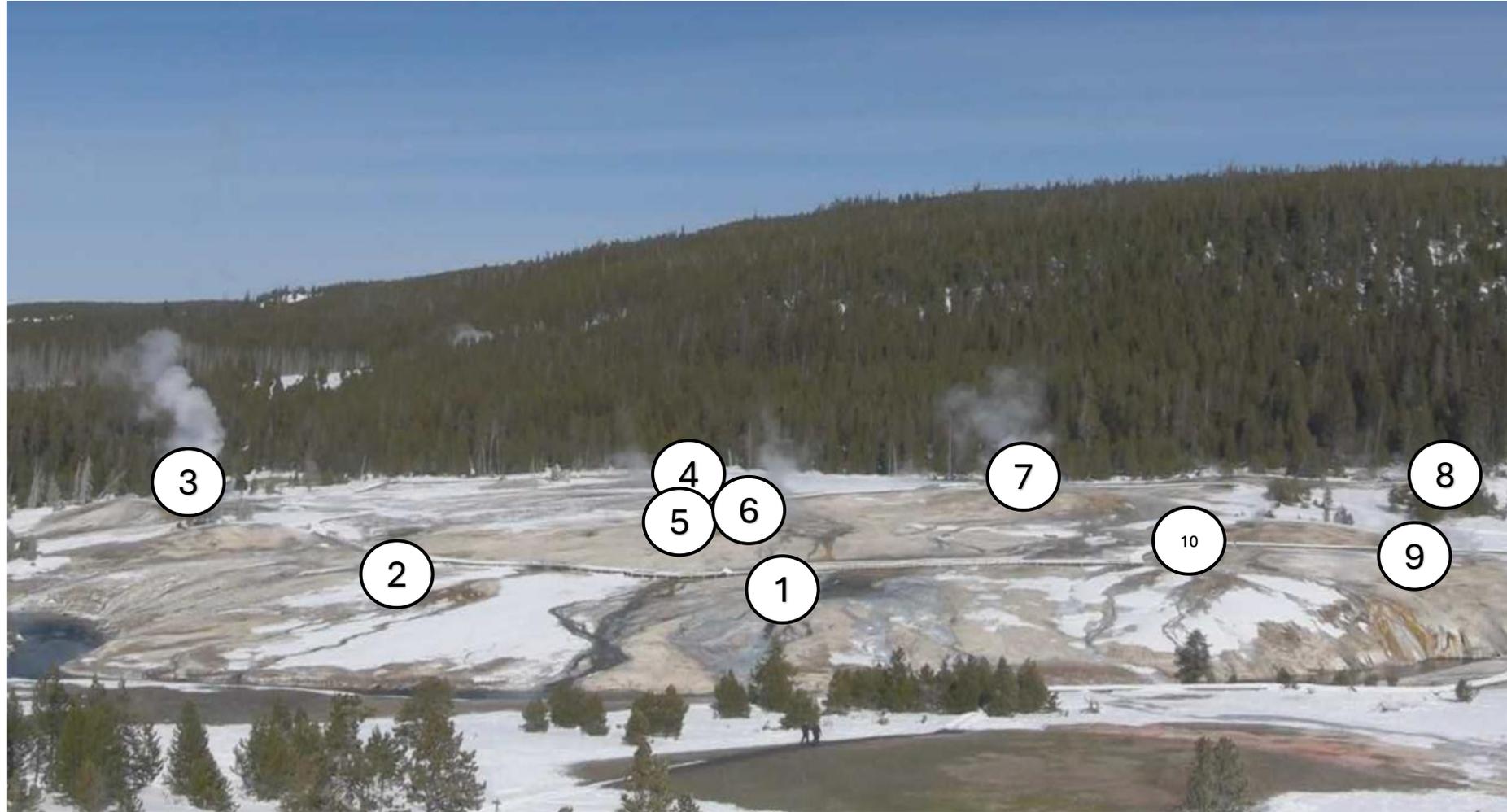
1. Old Faithful
2. Split Cone
3. Dilapidated

Old Faithful: Observational Advice

Feature	Visible?	Start Time?	End Time?	Additional Details	Comments
Old Faithful	Yes	Exact	+/-5sec	Short vs. Long	
Split Cone	Yes	le	Not Possible		
Dilapidated	Behind Trees	Ns	+/-1min		

Geyser Hill: Feature Identification

1. Beehive
2. Depression
3. Lion
4. Aurum
5. Plate
6. Slot
7. Giantess
8. Dome
9. Little Squirt
10. Anemone

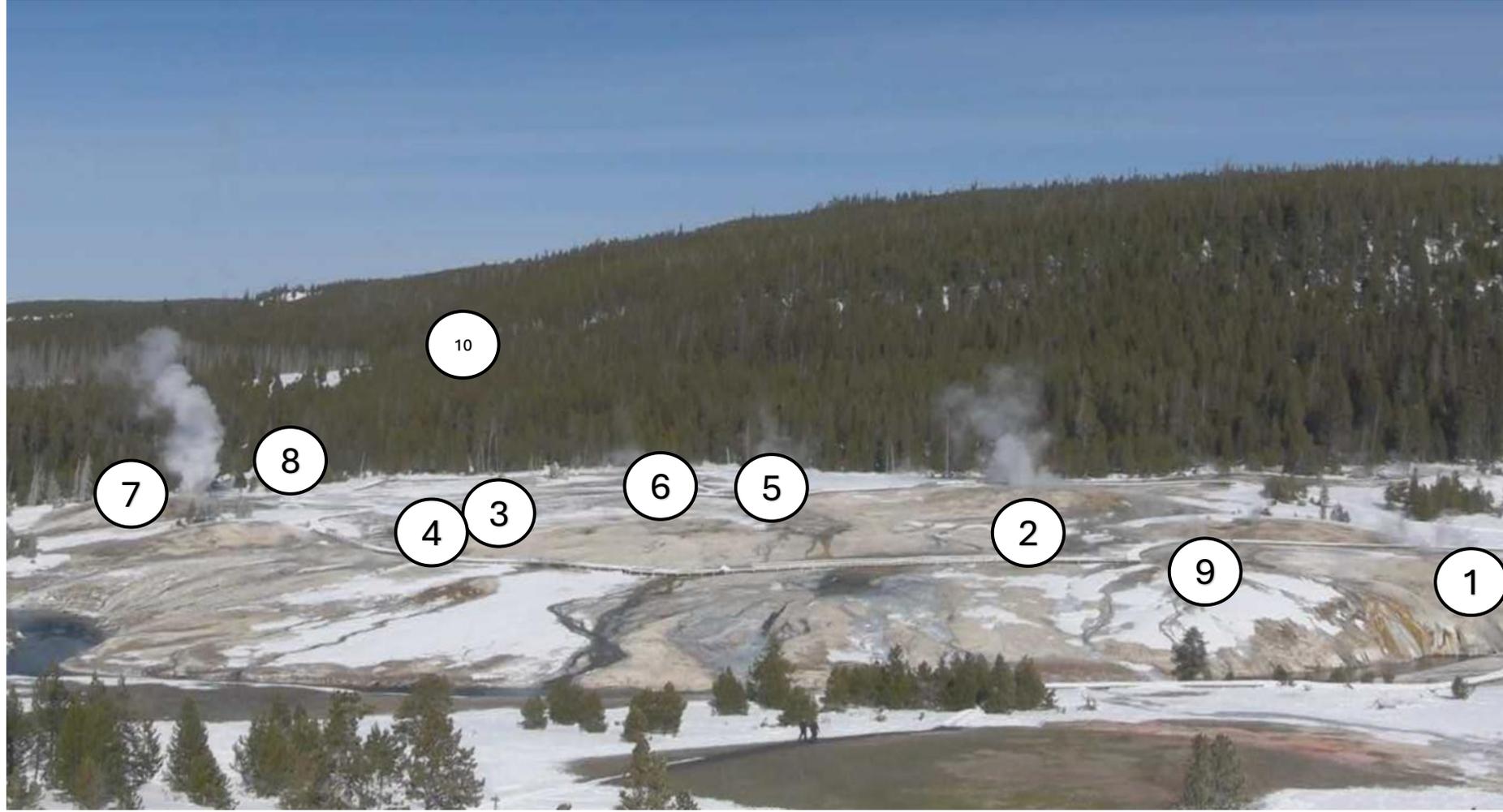


Geyser Hill: Observational Advice Pt 1

Feature	Visible?	Start Time?	End Time?	Additional Details	Comments
Beehive	Yes	Exact	+/-15sec		Exact end difficult
Depression	Yes	Exact/ns	+/-10sec		End is when pool drops
Lion	Yes	Exact	+/-10sec	Initial, Normal, Minor	
Aurum	Yes	Exact	+/-10sec		
Plate	Yes	Exact	+/-30sec		Continuous Jetting
Slot	Yes	Exact	+/-30sec		First visible splash
Giantess	Yes	Exact	+/-1min		
Dome	Yes	Exact/ns	+/-1min	Initials/Near Start of Series based on strength	
Little Squirt	Yes	Ns/ie	+/-5min		May restart
Anemone	Yes	Exact	+/-5sec	Big vs. Little	

Geyser Hill: Feature Identification Pt 2

1. Silver Spring
2. Plume
3. UNNG-GHG-18
4. Marmot Cave
5. Pump
6. Doublet Pool
7. Little Cub
8. UNNG-GHG-5
9. Improbable
10. Solitary

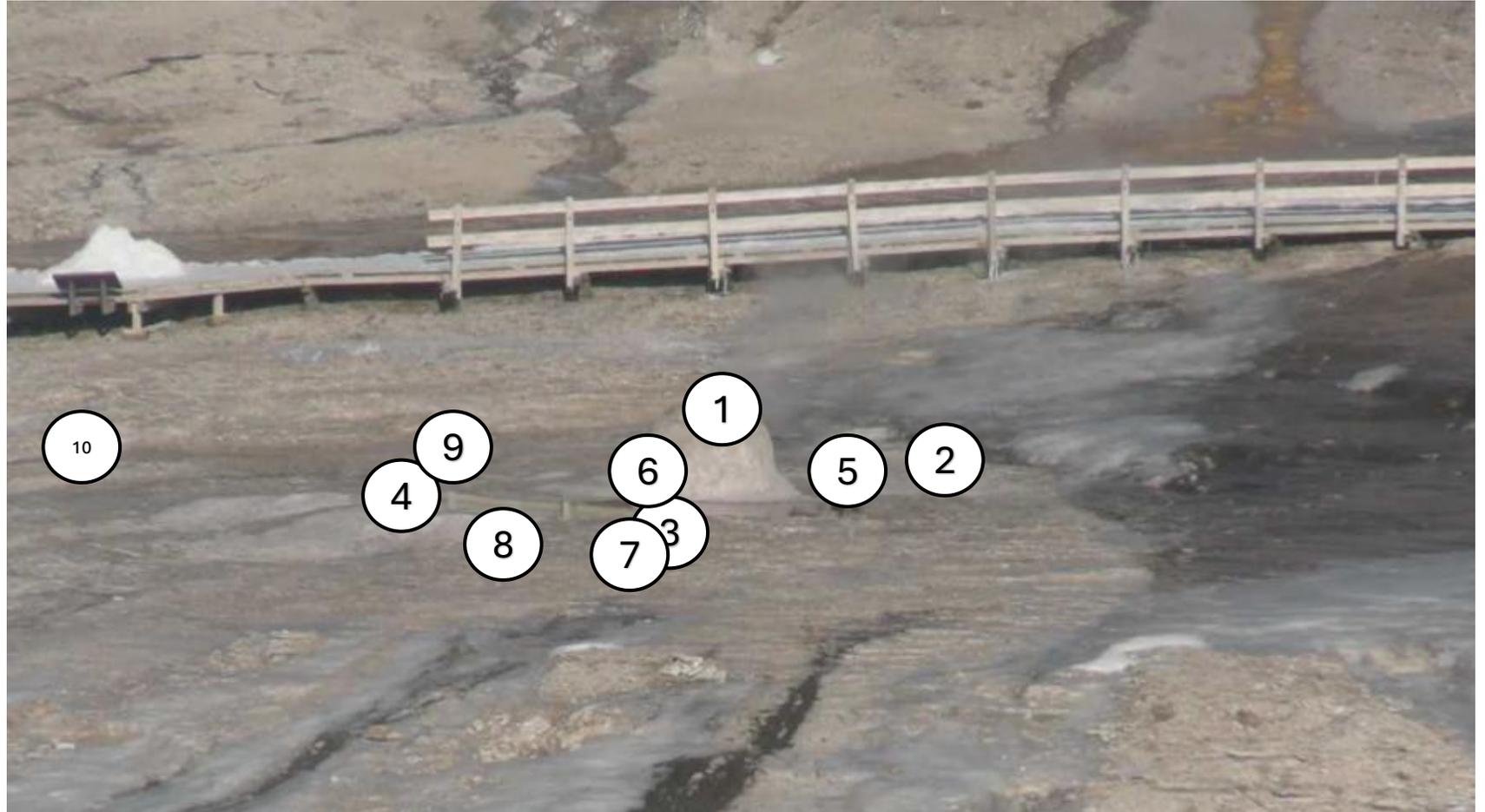


Geyser Hill: Observational Advice Pt 2

Feature	Visible?	Start Time?	End Time?	Additional Details	Comments
Silver Spring	Yes	le	N/A		Look for bursting
Plume	Yes	Exact	Unknown	Please come back!!	
UNNG-GHG 18	Yes	Exact	+/-15s		
Marmot's Cave	Yes	Ns			
Pump	Yes	N/A	N/A		No Entry
Doublet Pool	Yes	N/A	N/A		Distracting steam
Little Cub	Yes	Exact/ns	+/-15s		
UNNG-GHG 5	Behind Trees	le	N/A		Look for large steam, water
Improbable	Yes	Exact	+/-15s	Only enter majors	
Solitary	Behind Trees	N/A	N/A		Rarely Enterable

Beehive: Feature Identification

1. Beehive
2. Beehive's Indicator
3. South Bubbler
4. West Bubbler
5. Close to Cone
6. Blooper
7. Frying Pan
8. SW Steam Vents
9. NW Bubbler
10. Far NW Bubbler

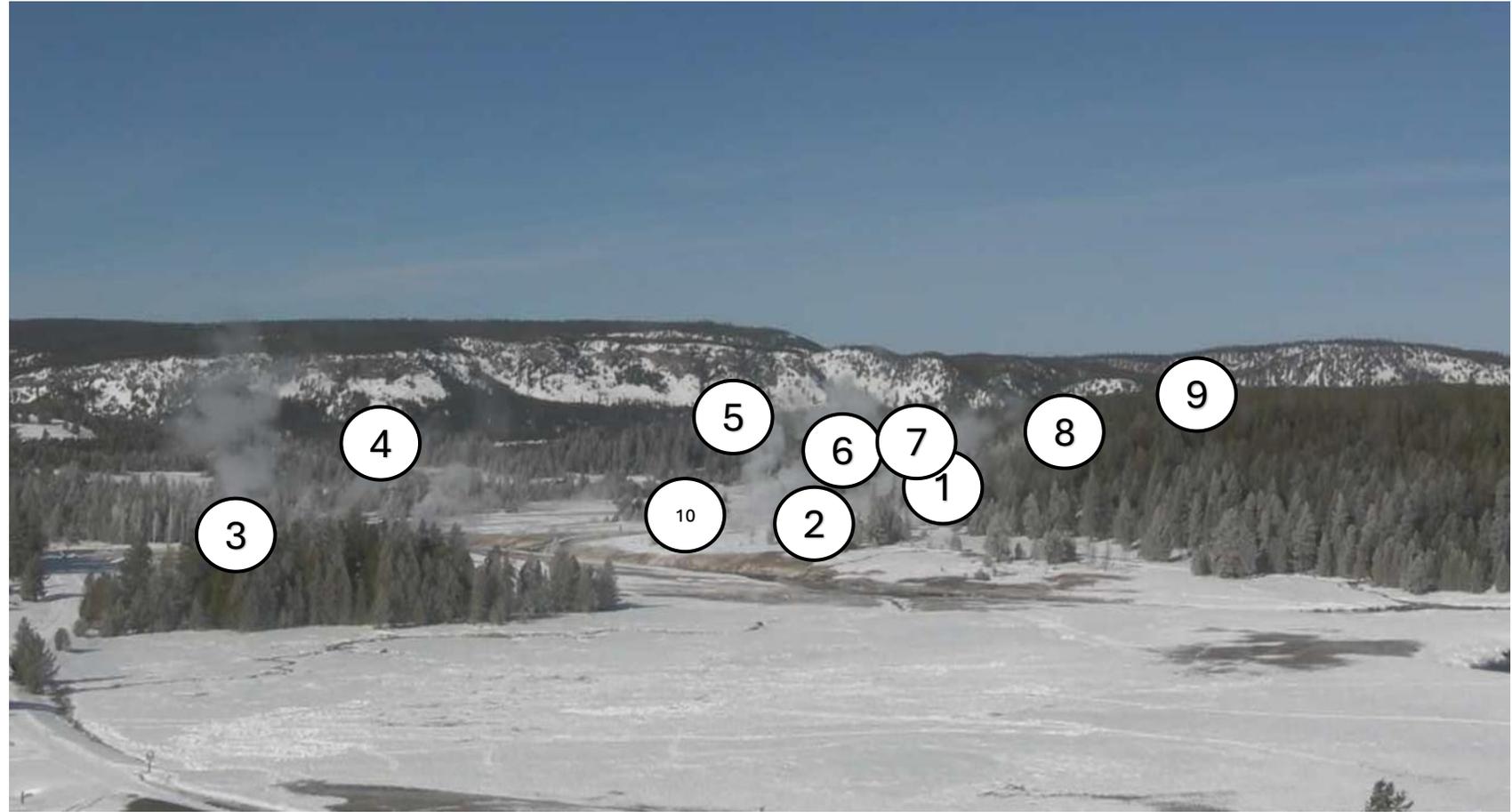


Beehive: Observational Advice

Feature	Visible?	Start Time?	End Time?	Additional Details	Comments
Beehive	Yes	Exact	+/-15sec	Indy vs. No Indy	
BHI	Yes	Exact	+/-10sec		
BSB	Yes	Exact	+/-10sec		MUST have visible water
BWB	Yes	Exact/ns	+/-5min		Any visible water
CCI	Sometimes	le	N/A		Rarely enterable
Blooper	No	N/A	N/A		
Frying Pan	Yes	Note in GT			Easily confused with south
SW Steam Vents	Yes	Note in GT		Between BSB and BWB	
NW Bubbler	No	N/A	N/A		
Far NW Bubbler	No	N/A	N/A		

Down Basin: Feature Identification

1. Grand Group
2. Sawmill Group
3. Castle
4. Daisy
5. Artemisia
6. Grotto
7. Giant
8. Fan and Mortar
9. Riverside
10. Churn



Down Basin: Observational Advice

Feature	Visible?	Start Time?	End Time?	Additional Details	Comments
Grand Group	Yes	See Details	See Details	See Details	See Details
Sawmill Group	Yes	See Details	See Details	See Details	See Details
Castle	Behind Trees	Exact	+/-1min	Able to tell maj/min from steam phase	Watch out for large preplay
Daisy	Behind Trees	Exact	+/-1min		
Artemisia	Behind Hill	le	Not Possible		Must be large, continuous steam plume
Grotto	Behind Trees	Ns	+/-5min	Possible to see Rocket, Grotto Ftn, and Spa	
Giant	Behind Trees	Exact	Unknown	Hot Periods will be impossible to differentiate	
F&M	Behind Hill	ns/	Not Possible	Can see pause/restart	Nuclear Steam Cloud
Riverside	Behind Hill	Ns/ie	Not Possible		
Churn	Yes	Exact	+/-30sec		Steam does not mean eruption

Grand and Sawmill: Feature Identification

1. Grand
2. West Triplet
3. Percolator
4. Bulger
5. Old Tardy
6. Penta
7. Spasmodic
8. Sawmill
9. Tardy
10. Oblong



Grand and Sawmill: Observational Advice

Feature	Visible?	Start Time?	End Time?	Additional Details	Comments
Grand	Behind Trees	Exact	+/- 10s	Burst Count, Sometimes C/Q	Cannot see pool
West Triplet	Behind Trees	ie	+/- 2min		
Percolator	Yes	ie	Difficult		
Bulger	Yes	Exact	+/- 10s	Major/Minor	
Old Tardy	Yes	ns	+/- 30s		
Penta	Yes	Exact/ns	+/- 1min	ID of Major/Minor Type	Cone slightly hidden
Spasmodic	Behind Trees	ie	+/- 10min	On/Off	
Sawmill	Yes	Exact	+/- 30s		
Tardy	Yes	Exact	+/- 30s	ID of Tardy mode possible	
Oblong	Behind Hill	ns/ie	Difficult	Eruption Strength	Hard to see flood

Black Diamond Webcam

- Eruption Indications:
 - Pool Level Drop
 - Wash/Rock Movement
 - **Front Pools Drop**
- Enter Approximate (A wc) time, with comments, based on best guess of when





Webcam Considerations

- Everything comes back to visibility and eruption type!
 - Refer to TSB or resources of preference to crosscheck eruption style, height, duration, location to help with feature identification
- Start Time
 - If you can see pool/cone, exact.
 - Can almost see pool/cone, ns
 - Cannot see pool/cone, ie
- Always use webcam tag
- Enter Duration based on ability to see start/end
 - Able to see start and end? Use Approximate Duration
 - Not able to see start or end? Do not enter duration
- End Time
 - Consider eruption type: Fast Quit? +/- 15s or better. Not visible or slow quit? Less accurate

Webcam has inherent limitations.

Seismograph Resources

Yellowstone Volcano Observatory:

<https://www.usgs.gov/observatories/yvo>

Use map to navigate to preferred seismometer, click (black triangles)

<https://www.isthisthingon.org/Yellowstone/daythumbs.php>

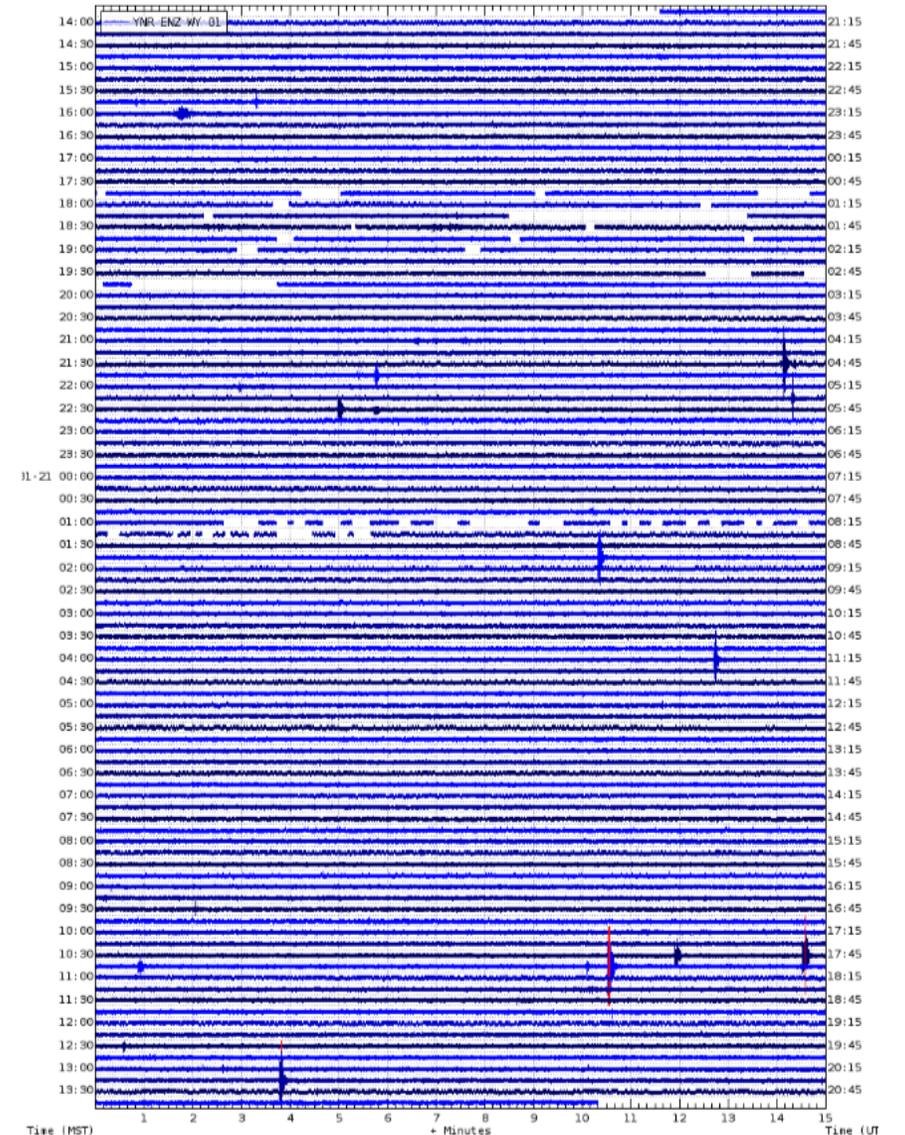
Displays some important seismographs

▲ Seismometer Monitoring Station

Station: YNR

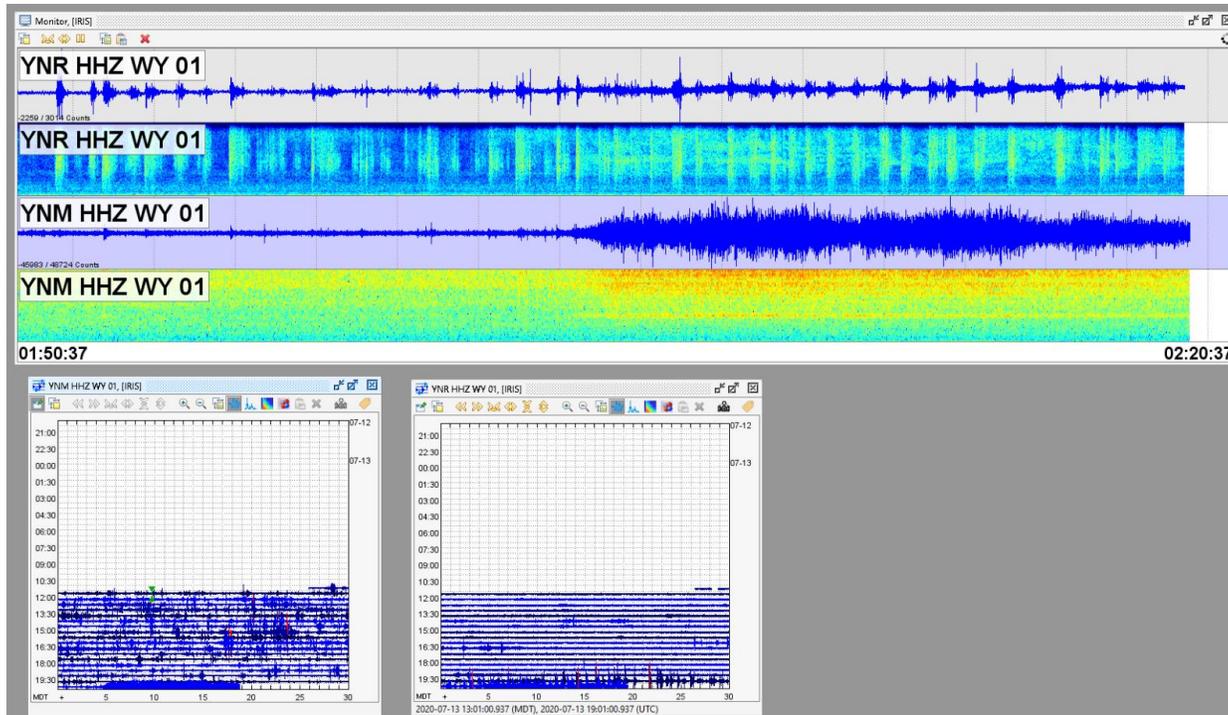
Operator: UU

Last 24 Hours



Steamboat Geyser on Seismograph

- YNM or YNR
- Consider downloading Swarm software to look at spectrogram



Eruption Indications:

- Sustained increase in YNM and YNR
- Frequency Signature like this example
- Combine with Tantalus Creek Gauge (water output)
- Later: Confirm In Basin or via Steamboat Temperature Gauge

Geysertimes Tricks

&n Trick to View More Eruptions

<https://geysertimes.org/geyser.php?id=Beehive&n=1000>

Adding &n=### onto end of link pulls ### eruptions instead of generic 100

Retrieve

<https://geysertimes.org/retrieve.php>

Detailed Entry Search Allows Exporting Data to Browser or CSV

Analysis Page

Allows basic chart creation

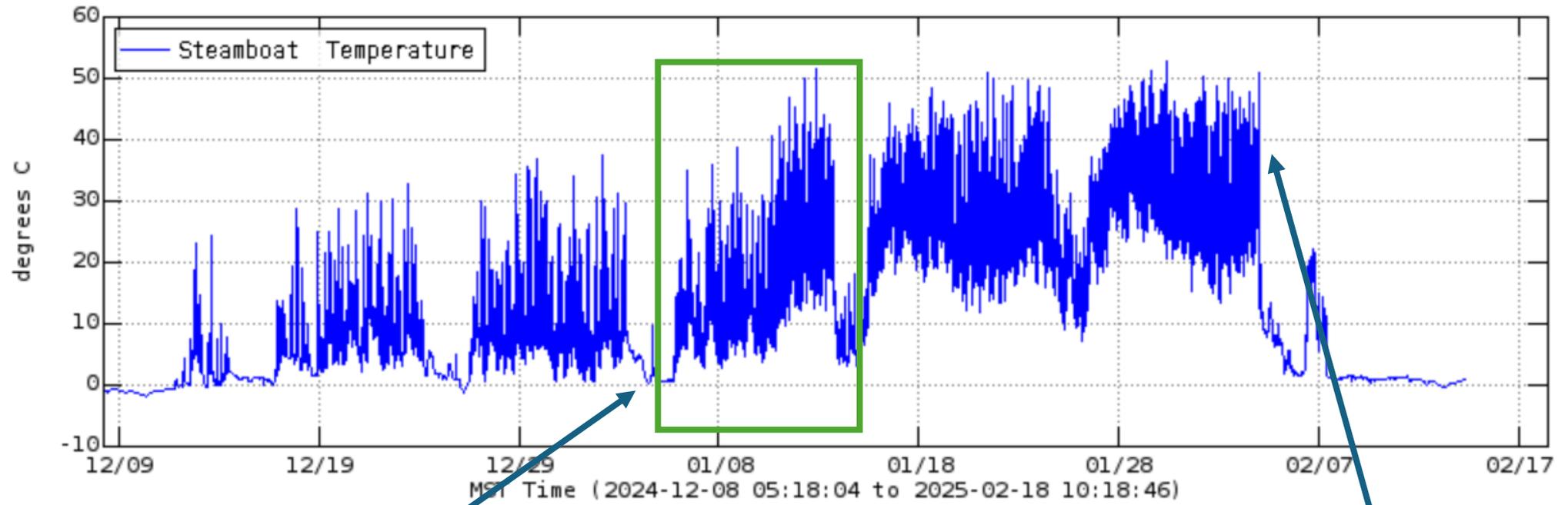
YVO Valve

<https://yvo-valve.wr.usgs.gov/>

Allows analysis of Seismometers, Deformation, and **Norris Temperatures**

Click “Norris Temperatures,” Select Feature, Enter Start/End Time in form YYYYMMDDHHMM, Submit!

Clicking on chart twice, then collecting submit again creates new chart with your newly selected start and end times.



Cycle

Eruption

Temperature Gauges

Most Temperature Loggers Not Accessible to Public
Steamboat is primary logger within GOSA Scope
Can track cycles, and eruption times

Water Gauges

Accessible through YVO Valve.

Steamboat Direct Link:

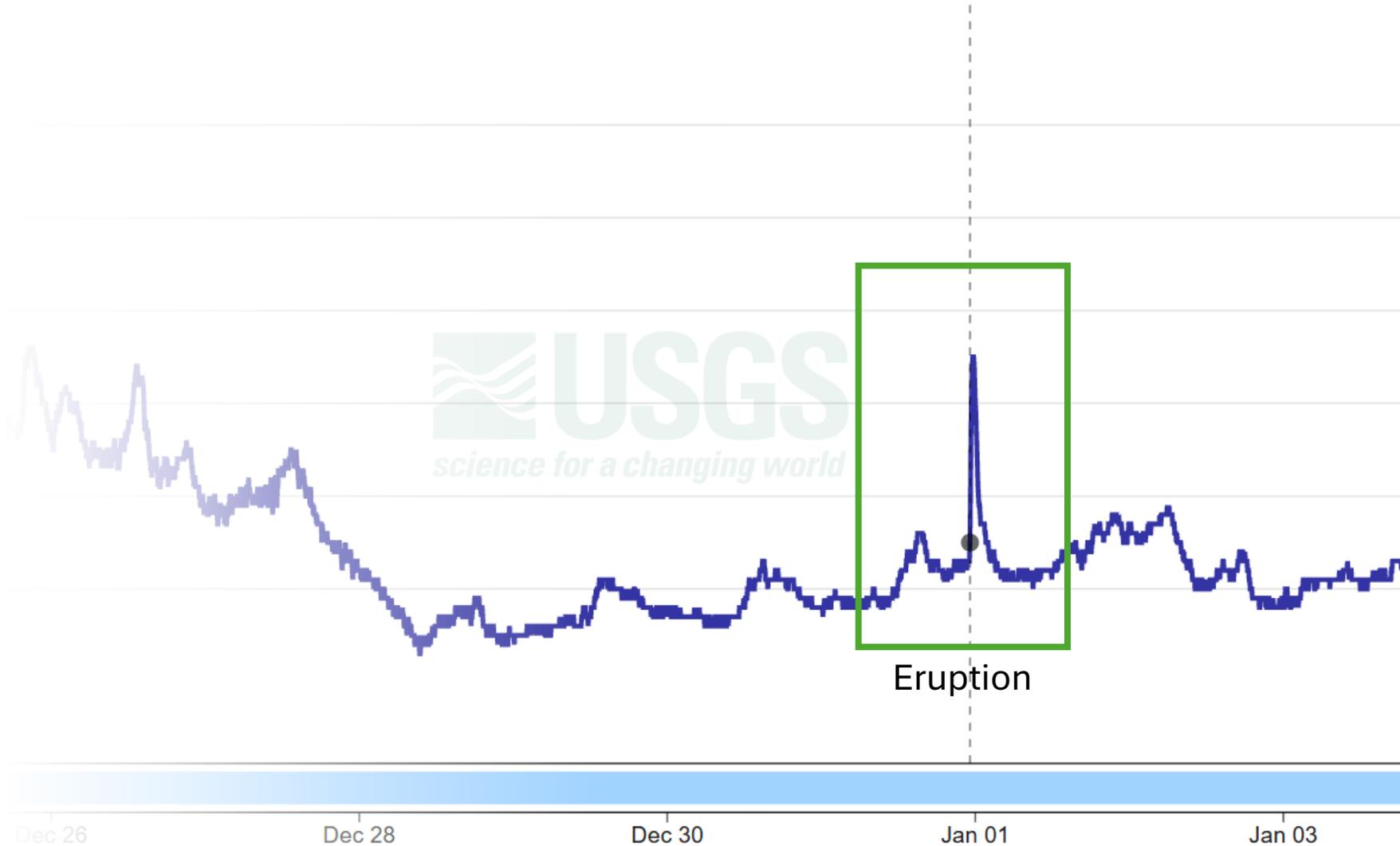
<https://waterdata.usgs.gov/monitoring-location/USGS-06036940/#dataTypeId=continuous-00065-0&period=P7D&showFieldMeasurements=true>

- Change time frame, download data.
- For Steamboat: Look for spike
- **CAUTION:** Precipitation events may look like eruptions

- using custom time span -
December 25, 2025 - January 3, 2026

Gage height, feet

Dec 31, 2025 11:10:00 PM MST



Introduction to Data Science

Asking a question

Clear, Simple, Defined
Scope

Collecting Data

Variables of Interest,
Possible Confounds

IS

Cleaning

Remove “Bad” Datapoints
Manual or Filtering

NOT

Running Code,
Trusting Output

Must check each
step

Making Fancy Plots

Plots, Numbers
serve purpose

Analyzing

Calculation and
Manipulation

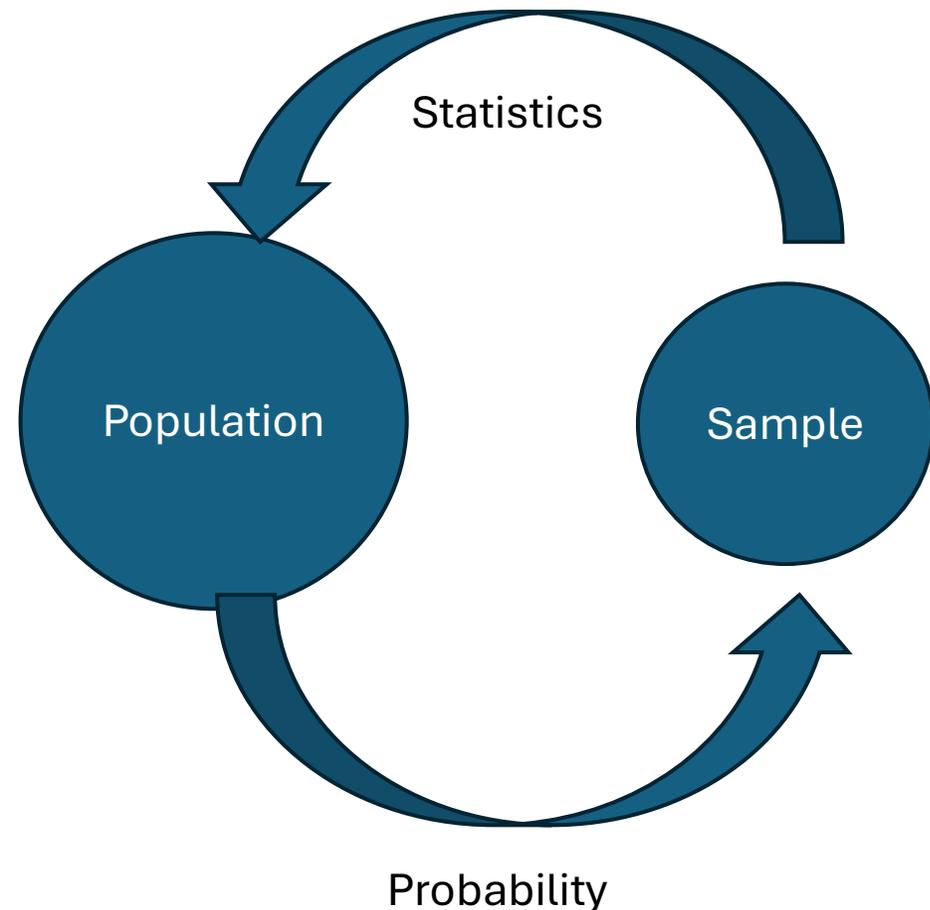
Letting the
computer find the
answer

Interpret
numbers in
context

Interpreting

Apply Analysis to Question

How do we think about data?



Population vs. Sample

- **Population:** The complete set of all possible geyser eruptions or behaviors.

- **Sample:** The subset of eruptions we actually observe and record.

- **Key idea:** Samples estimate populations, but never capture them fully.

- **Implication:** Conclusions always include uncertainty and possible bias.

Statistics vs. Probability

- **Statistics:** Using data to describe patterns and estimate unknown parameters.

- **Probability:** Using assumed models to predict outcomes before observing data.

Statistics asks: “What does this data tell us?”

Probability asks: “What should we expect to see?”

How do we think about data? Pt. 2



Observational vs. experimental: Geyser data is observed, not controlled or repeatable.



Data is not truth: Data records observations, methods, and limitations—not reality itself.



Uncertainty is expected: Variability is natural, not a flaw in the data.

Asking the right questions

- It is important to ask good questions
 - Clear variables, time scale, scope
 - Specific, Testable, Addresses an element
 - Big Projects: Asking many questions to create a complete picture

Bad Question:

“Is this random” -> Not Testable

“How does Beehive like weather” -> Need to be broken down

Good Question:

“Is Grand more likely to start with Turban than without” -> Testable

“How does Beehive respond to rain” -> Single Element

Variables and Workflow

Ask Question

“How does Beehive respond to rain” -> Simple, Clear

Determine Hypothesis

“Beehive intervals lengthen with rain” -> Testable

Decide Variables

Beehive intervals, precipitation, other environmental variables

Account for Confounding Variables

Other environmental variables are within the same “bucket”

Clean Data

Most Challenging Step, remove bad datapoints, unit conversions, formatting

Variables and Workflow

Analysis

What numbers do I need? What charts? I.e. Beehive intervals w/ rain versus w/o rain

Reproducibility

If I used data from July, test again with August, test again with July of last year

Stupid Check!

Does this make sense intuitively? Does it fit with your observations?

Back to Hypothesis

Confirm or reject your hypothesis. I.e. Beehive intervals are longer during rain

Answer Question

How does hypothesis go back to question? I.e. Beehive has a negative response to rain

Methods in Data Science

Descriptive Statistics: Summarize behavior using means, medians, ranges, ect.

Visualizations: Reveal patterns, trends, errors through plots and charts

Time-Series: Explore how variables change over time

Comparative Analysis: Compare Groups (like seasons)

Correlation: Measure Relationships between variables

Outlier Analysis: Identify unusual events

Modeling: Explore patterns predictively

Data Science Resources

Programming and Analysis Tools

- R: Excellent for statistical analysis and visualization
- Python: Flexible language for analysis, automation, modeling
- Excel/Google Sheets: Accessible tools for logging and basic analysis

Preference:

- Use Excel/Google Sheets to store data
- Use R or Python to perform analysis
 - Python is better at data manipulation
 - R may be easier to learn

Issues in Geyser Data

1

Correlation vs. Causation

Correlation: Shows association
Causation: Physical Response

Bad: Dome causes short Beehive intervals
Good: Beehive has short intervals around the time Dome erupts

Guidance:

- 1) Observational data rarely allows causation
- 2) Physical processes may be suggested as causation
 I.e. Rain caused Beehive delays by an influx of cold water

2

Open vs. Closed Datasets

Open: Incomplete, Missing Data Points
Closed: Curated or Complete

Bad: Mixing Open and Closed Datasets
Good: Curate data to remove missing data

Guidance:

- 1) Ensure datasets are as close to closed as possible
- 2) Be transparent: Explain the size of your dataset and the methods you used to curate it

Issues in Geyser Data

3

Observational Bias

Inherent impact of observation, beliefs, or expectations on a dataset

Examples:

- Geysers are observed more during day, and summer
- Well-known geysers are observed more frequently

Guidance:

- A lack of an observation does not mean a lack of event
- Random Sampling can help

4

Errors in Data Curation

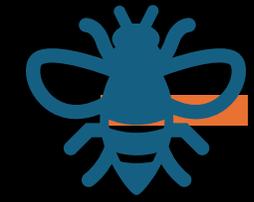
Error introduced when deciding what data to include in analysis.

Examples:

- Filtering out intervals >8 hrs misses 8.5hr intervals
- Not filtering out certain intervals introduces double intervals

Guidance:

- Hand curation may be necessary with geyser data
- Only work with datasets you know



Case Study:
Beehive
The Impact of
Indicator Lead time
on Beehive Duration



Case Study: Starting the Process

Ask the Question:

Do Indicator Lead Times Impact Beehive Durations?

Determine Hypothesis:

Longer Indicator Lead Times Result in Shorter Beehive Durations

Decide Variables:

Beehive Eruption Time, Preceding Indicator Time

Understand the Confounding Variables:

Mid Cycles, No Indicators, Environment



Case Study: Working with a Dataset

Clean Data:

- Pull Indicator and Beehive eruption times
- Find nearest Indicator time before Beehive's eruption time
- If not within 40 minutes, require manual check
- Record Indicator Lead Time (Beehive Time – Indicator Time) for any Beehive eruption with a duration
- Remove Inadequate Durations (~5m is not helpful, 5m14s is)
- Pair Data (x=Indicator Lead Time, y=Beehive duration)
- Print pairs and check manually to ensure proper calculation



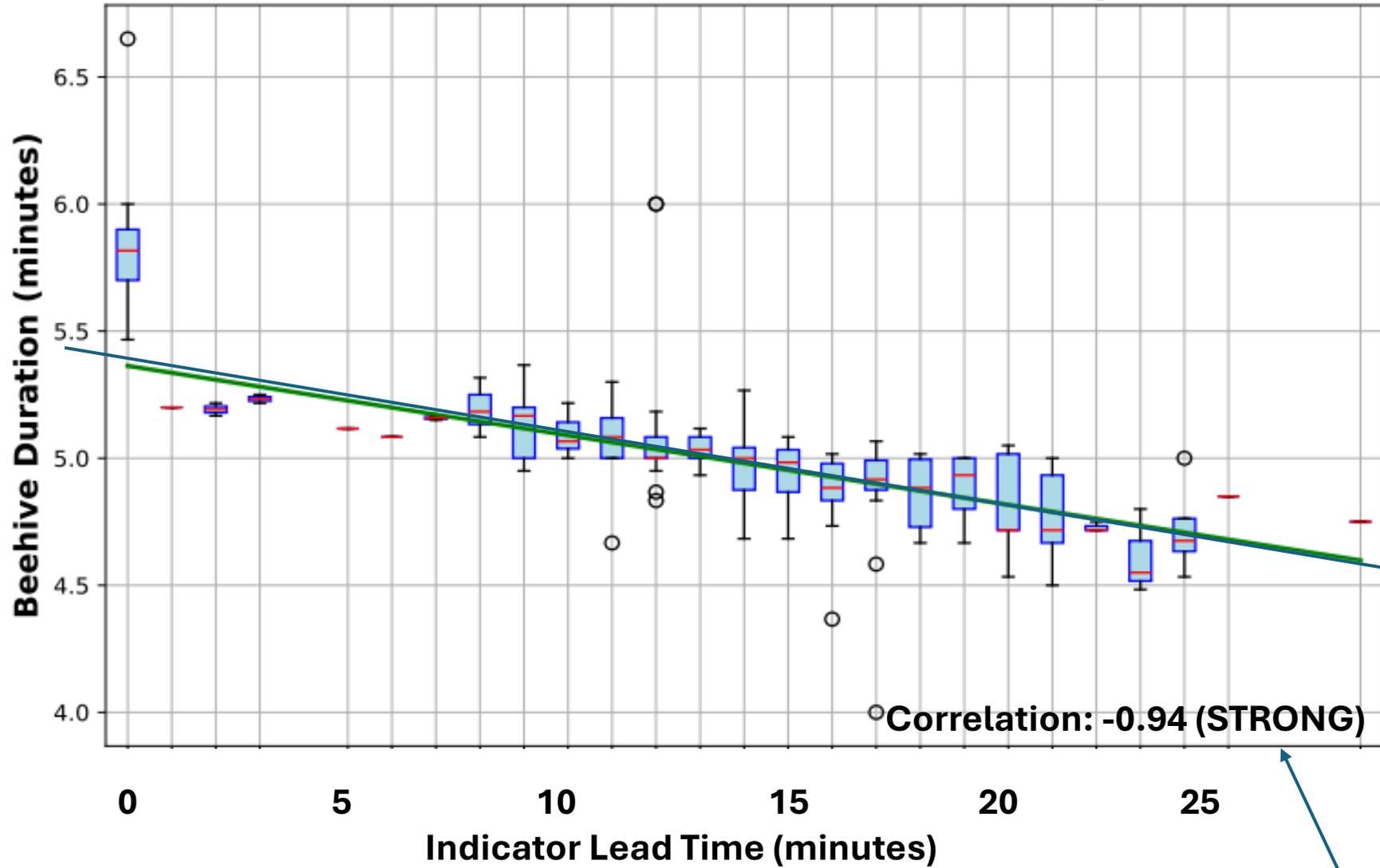
Case Study: Working with your Dataset

Analyze Data:

- Bin Indicator Lead Times
 - $X(1)$ represents all Beehive's w/ duration where X (indicator lead time) is 1 minute
- Treat Each Bin as it's own sample
 - Calculate mean, median, average, and standard deviation for $X(n)$ where n is a bin between 0 (no Indicator) and 40 (maximum allowed lead time)
 - Create a "box a whiskers" plot to show distribution for each bin
- Compare Bins
 - Chart Duration= $d[X(n)]$ where d is the distribution of each $X(n)$ bin



Duration vs Lead Time - Last 365 days



Clear Negative Trend

Correlation: -0.94 (STRONG)

STRONG Correlation



Case Study: Interpret Results

Reproducibility:

Tested across multiple time frames, all showed same results

Stupid Check:

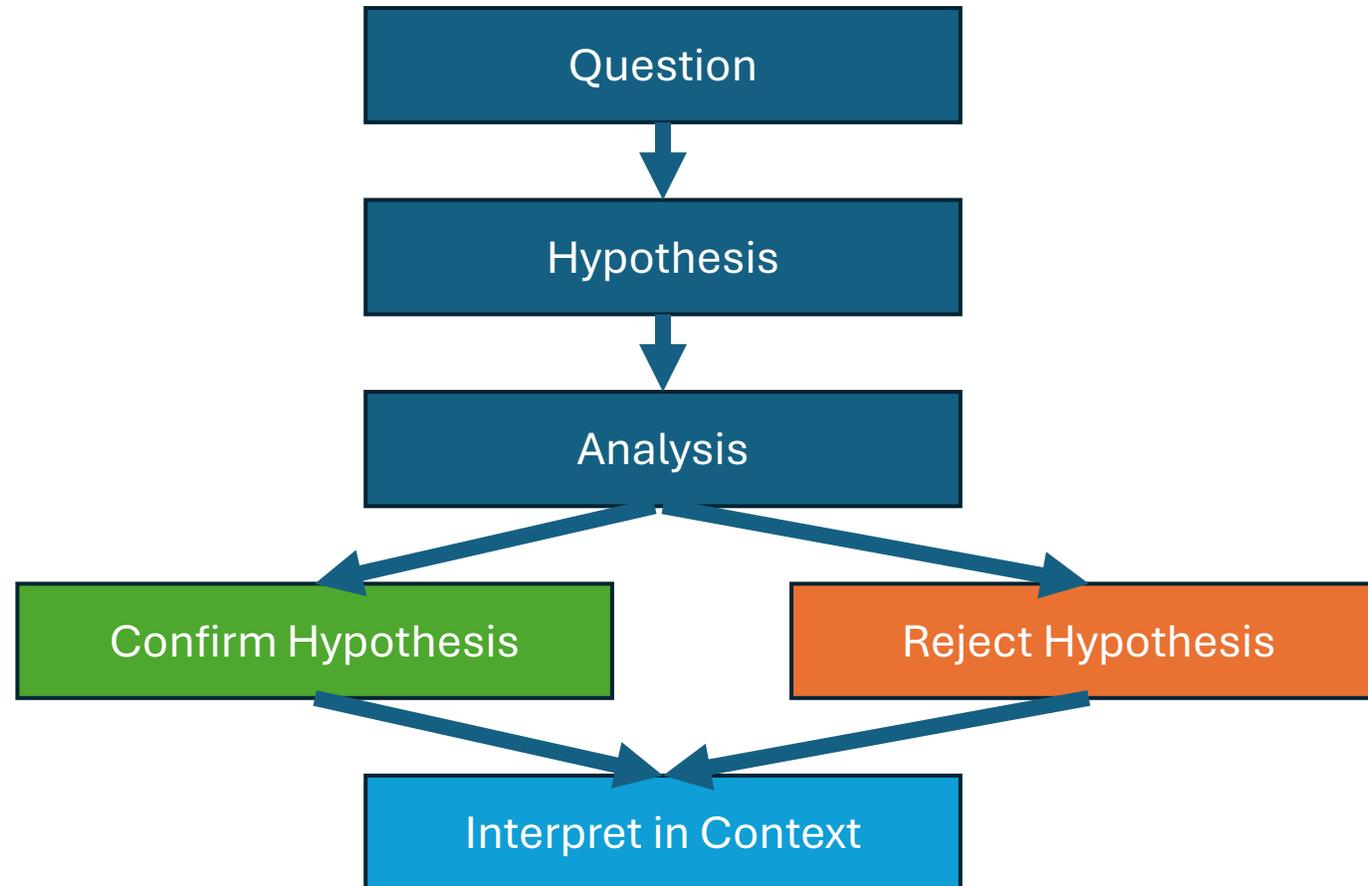
Has a physical explanation, makes sense, can see it in the data

Back to Hypothesis and Question:

CONFIRMED! Longer Lead Times = Shorter Duration



Interpreting Results



AI in Geyser Data

AI is a tool, not a scientist: It does not understand geysers or physical processes

Best Use: Code Acceleration. Writing Scripts when the goal is already defined.

Human Judgement is Required: User must choose variables, filters, assumptions, and analysis

Do not feed it raw data: AI cannot evaluate data quality, and often makes computational errors

Not a substitute for analysis: AI speeds up workflows, but does not replace reasoning

Data Spotlight: CDF Optimization of Sit Time

- CDF calculates probability of some event (eruption) having happened by some time
- Effectively, function for % of eruptions occurring by X hour.
- Allows for optimization of sit time

Grand Geyser Optimal Sit Table:

Coverage (%)	CDF Lower	CDF Upper	Interval Start (hrs)	Interval End (hrs)
25	0.375	0.625	7.942778	8.596944
50	0.250	0.750	7.637222	8.903333
60	0.200	0.800	7.360278	9.022222
70	0.150	0.850	7.122778	9.164722
75	0.125	0.875	7.044722	9.164722
80	0.100	0.900	6.873611	9.552222
85	0.075	0.925	6.806111	9.622778
90	0.050	0.950	6.328333	9.972222
95	0.025	0.975	6.109722	10.691944

Remote Geyser Gazing Review



Know what the webcam can and cannot see



Timing is approximate, not exact



Use multiple data sources when possible



Observation bias built in



Document context and observation, not just events

Data Science Review



Good Questions Matter: Use Statistics/Probability to Confirm or Reject a Hypothesis



Observational Data has Limits



Sanity Checks are Essential: Geyser Gazers will often know the answer before the analysis



Visualiation is Analysis and Communication



Context is Part of Data: Must understand your data



Questions?

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