



# Individual response trends to Urban Air Mobility noise in a laboratory study

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## Urban Air Mobility (UAM) presents new opportunities for dynamic aviation transportation systems

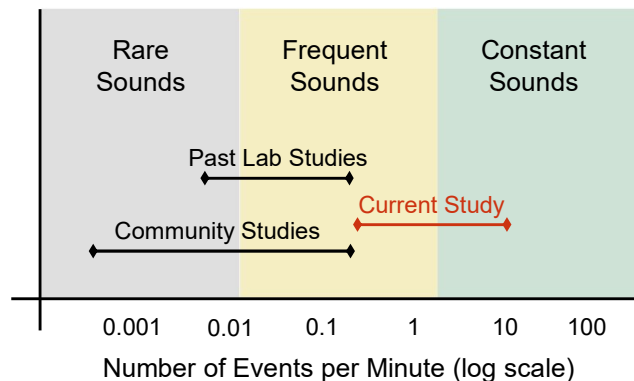


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- Urban Air Mobility (UAM) is a subset of Advanced Air Mobility (AAM)
- UAM allows point-to-point transportation of people and goods via air taxis and drones, etc.
- NASA is a technical partner to industry and communities and not a regulator nor manufacturer
- Noise is a concern for entry into service, but no public data available on human response to UAM noise
- We at NASA are conducting psychoacoustic research to understand the human response to these vehicles

## The “noise and number” problem:

How do people respond to a frequent sound? What metric to use?



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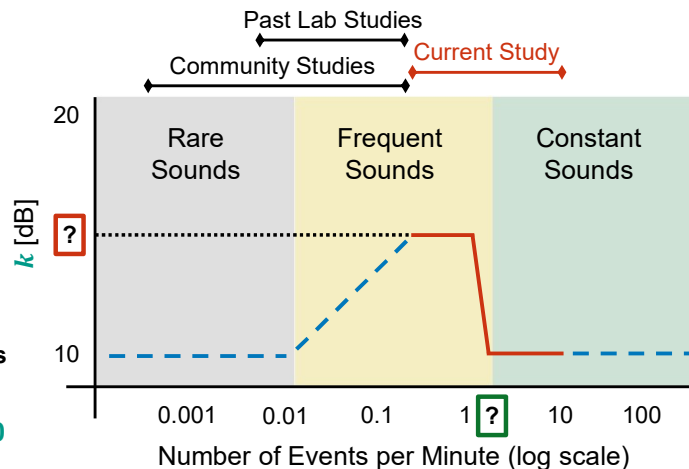
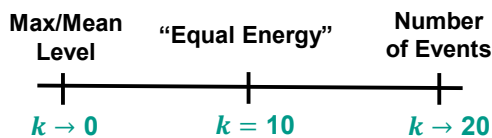
- One challenge in community noise response, dubbed the “noise and number” problem, addresses how people respond to a sound that is frequent
  - How does annoyance integrate over time?
- “Frequent” in contrast to rare or single events and continuous sounds
- Rare sounds:
  - Garbage truck in residential neighborhood (1x per week)
  - Airplane takeoff and landing (rare to frequent)
- Constant sounds:
  - Busy freeway
- Previous lab studies and community studies have focused in the rare to frequent sound regimes
  - Response to single flyovers
  - Limited by airport operations
- Current study addresses transition from frequent to constant sound response

## A common method to investigate noise and number is with the Fields (1984) $k$ equation



$$L_k = \overline{SEL} + k \cdot \log_{10}(N)$$

$L_k$  = sound level metric  
 $\overline{SEL}$  = average sound exposure level  
 $k$  = “decibel equivalent number”  
 $N$  = number of events



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- One method to assess a penalty to number of events is Fields’  $k$  equation
- The equation produces a sound level metric from
  - the average equivalent sound level
  - $k$  “decibel equivalent number”
  - and  $N$  number of events
- $k$  is a number of dB the metric should increase for a 10-fold increase in  $N$
- $k = 10$  corresponds “equal energy”
  - Assumes equal tradeoff between level, number, and duration (e.g., DNL)
- As  $k \rightarrow 0$ , number of events becomes irrelevant and  $L = \overline{SEL}$
- As  $k > 10$ , greater weighting to  $N$ 
  - $k > 20$  not observed in previous data
- What  $k$  value does the data support?

## Noise and number study of UAM noise with 38 subjects conducted in the Exterior Effects Room at NASA Langley in January 2023



EER Noise and Number Test Response Sheet

Subject #	Seat #
Group #	Date/Time

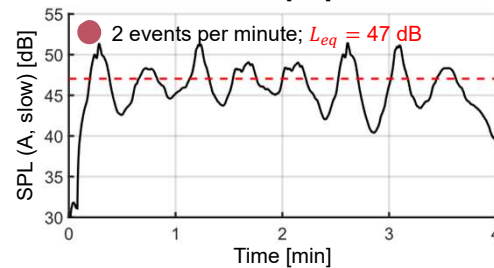
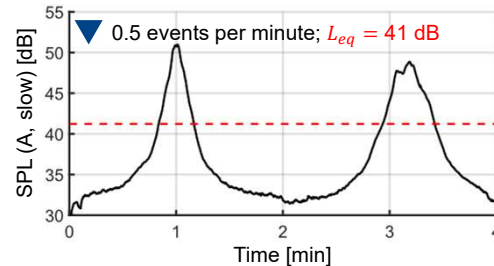
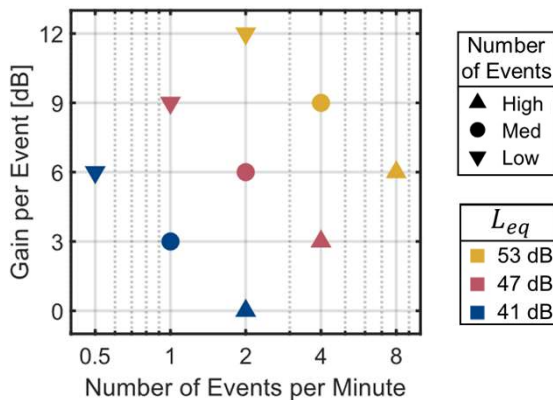
**Instructions:** We are studying the impact of noise on people. You are going to hear a number of scenarios which involve flyovers of new kinds of aircraft. Each scenario will last about 4 minutes. Some of these scenarios may have many flyovers in them, and some may only have a few. Some scenarios may have loud flyovers, and some may have quieter flyovers. What we would like you to do is to listen to the scenario as a whole while reading, and then give a response to the question below when prompted by the test director.

Scenario Number	Question: (circle one) What number from 0 to 10 best shows how much you are bothered, disturbed, or annoyed by the noise?	Comments/Notes Use this space as you like
1	0 1 2 3 4 5 6 7 8 9 10	
2	0 1 2 3 4 5 6 7 8 9 10	
3	0 1 2 3 4 5 6 7 8 9 10	
4	0 1 2 3 4 5 6 7 8 9 10	
5	0 1 2 3 4 5 6 7 8 9 10	

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- We conducted a noise and number study in the Exterior Effects Room at NASA Langley in January 2023
- Sounds were of UAM vehicle flyovers
- During the test, participants were given reading materials
- 38 subjects successfully participated, 4 at a time as shown above
- Participants provided their annoyance response on the numerical 0 to 10 IC BEN scale

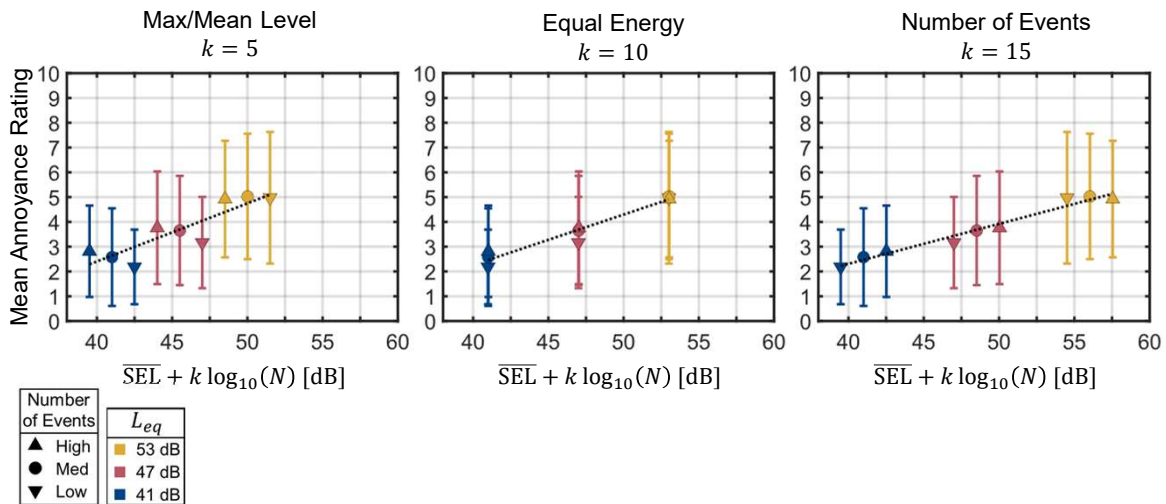
Stimuli were 4-minutes long at 3 distinct  $L_{eq}$  values with 3 differing number of event cases (low, med, high)



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- Nine 4-min-long test sessions
  - Values given by EEH ( $k = 10$ )
  - 3 sets of  $L_{eq}$  as noted by the color
  - 3 different case of number of events, noted by symbol
- Equal span in  $L_{eq}$ , Gain, and equivalent  $N$  (given by EEH)
  - If EEH holds true, then results collapse to 3 points (noted by color) of indistinguishable annoyance
- Example plots of sound level over time
  - Events are distinguished by peaks
  - Increasing number of events makes them less distinguishable  $\rightarrow$  constant sound

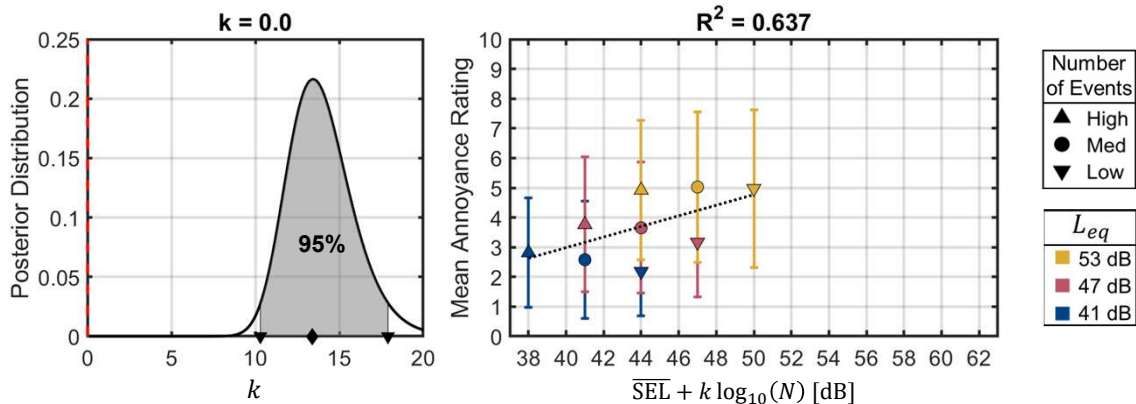
Multilevel linear regression fit for a given value of  $k$  to determine population mean annoyance trend



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- This is a review of previous work on population results
  - Going through these results, then to trends of individuals
- Using a multilevel linear regression to show population mean annoyance trend
  - Varying the noise metric, not annoyance responses
- Error bars show SD of annoyance responses across subject pool – about the data not line, represents scatter not confidence bound
- Results shown for 3 different  $k$  values
  - $k = 5$ , with less weight to number and more to max or rather mean level since they are all equivalent in this case
  - $k = 10$ , which is the equal energy (like DNL), collapse
  - $k = 15$ , greater weighting to number of events
- Data seems to collapse for  $L_{eq} = 53$  case (yellow), but at lower  $L_{eq}$  (with fewer events) that the data have a positive slope, suggesting  $k > 10$
- At what  $k$  do we get our best fit to the data?

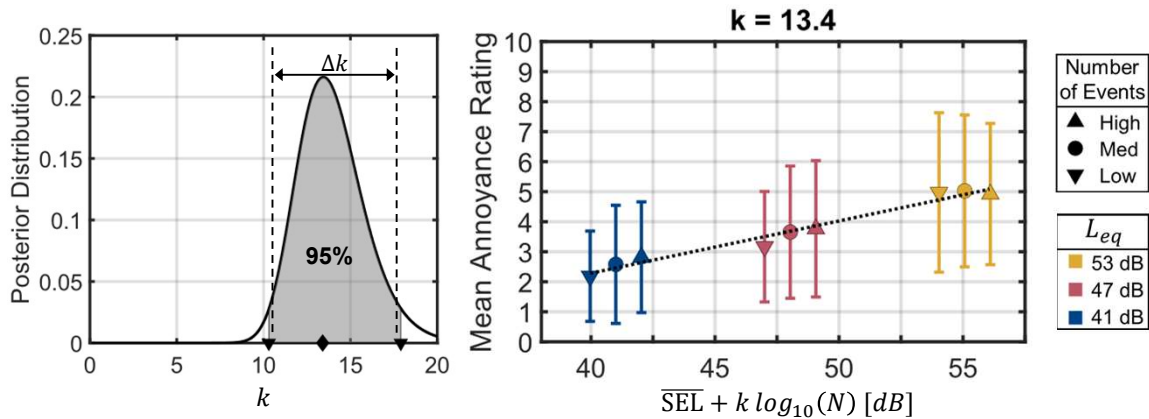
Determine the best value of  $k$  by evaluating a goodness of fit for each  $k$  from 0 to 20 and plot result as a posterior distribution



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- This animation demonstrates the analysis with  $k$  from 0 to 20
- A distribution of  $k$  values is created that describe the best fit
- At each  $k$ , evaluate the log likelihood, which is a log sum of residuals as a measure of goodness of fit
- Compile the values and normalize area under curve to 1
- Peak denotes “best”  $k$  and confidence bound notes precision about that estimate of  $k$
- We also note the coefficient of determination,  $R^2$
- It is clear that the best fit to the data occurs  $k > 10$
- The peak is  $k = 13.4$ , meaning that the number of events is penalized or weighted greater than suggested by EEH ( $k = 10$ )

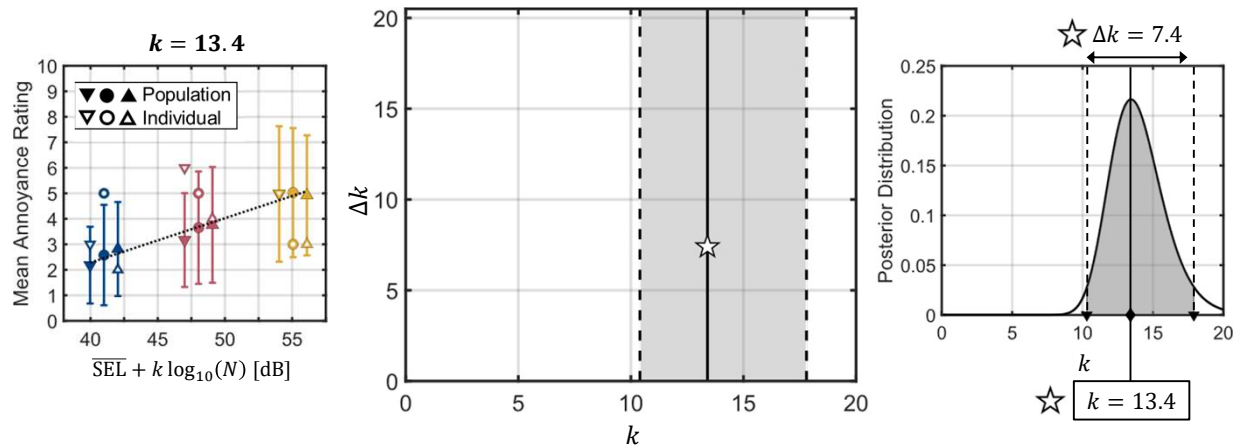
Population best fit occurs at  $k = 13.4$ , meaning more weight to number of events than suggested by “equal energy”



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- The peak is  $k = 13.4$ , meaning that the number of events is penalized or weighted greater than suggested by EEH ( $k = 10$ )
- This is for the population with all the data grouped together

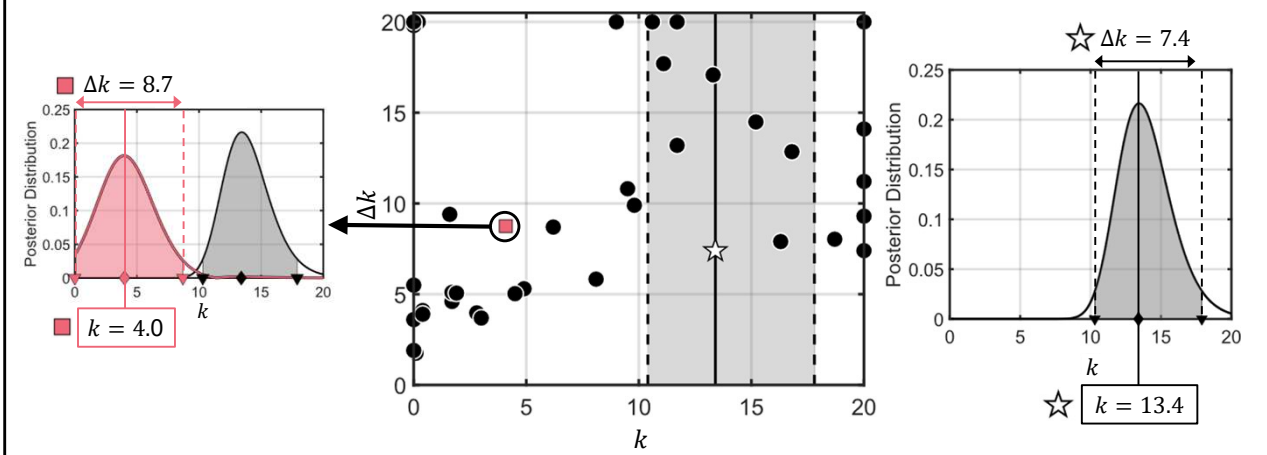
## How do individuals compare with the overall population trend?



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- We're going to use the middle plot as a framework to compare individuals with the population trend
- First, left plot shows an example of an individual's responses compared to the overall populations
  - Individual likely has more scatter, they may be using different part of the response scale
  - Comparing individual data with the overall provides insight on whether individuals support population trend
- Middle plot has the star noting the peak  $k$  value and the  $\Delta k$  for the confidence interval width.
  - Vertical solid line also notes the peak  $k$  value and vertical dashed lines and shading note the confidence interval
  - These values are shown on the right

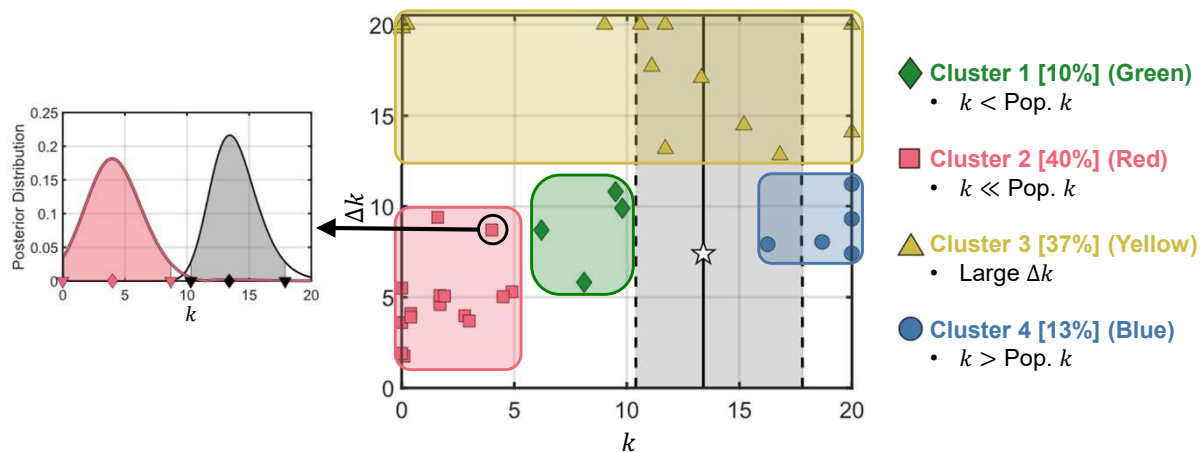
# Comparing $k$ and $\Delta k$ of individuals with the overall population



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- Now we are plotting 38 dots representing where individuals fall in this  $k - \Delta k$  space
  - Each person with responses to 9 stimuli
- Reminder,  $k$  tells the best guess,  $\Delta k$  suggests precision on that guess
- Example on left of an individual with a peak below the populations

## Individuals can be grouped into 4 clusters based on $k$ values



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- Create 4 clusters based on a combination of k-means clustering (which is a little confusing since our variables are also called  $k$ ) and our intuition of what these  $k$  values mean relative to our population

### Cluster 1 (Green) [10%]

- $k < \text{Pop. } k$
- $6 < k < 10$

### Cluster 2 (Red) [40%]

- $k \ll \text{Pop. } k$
- $k < 5$

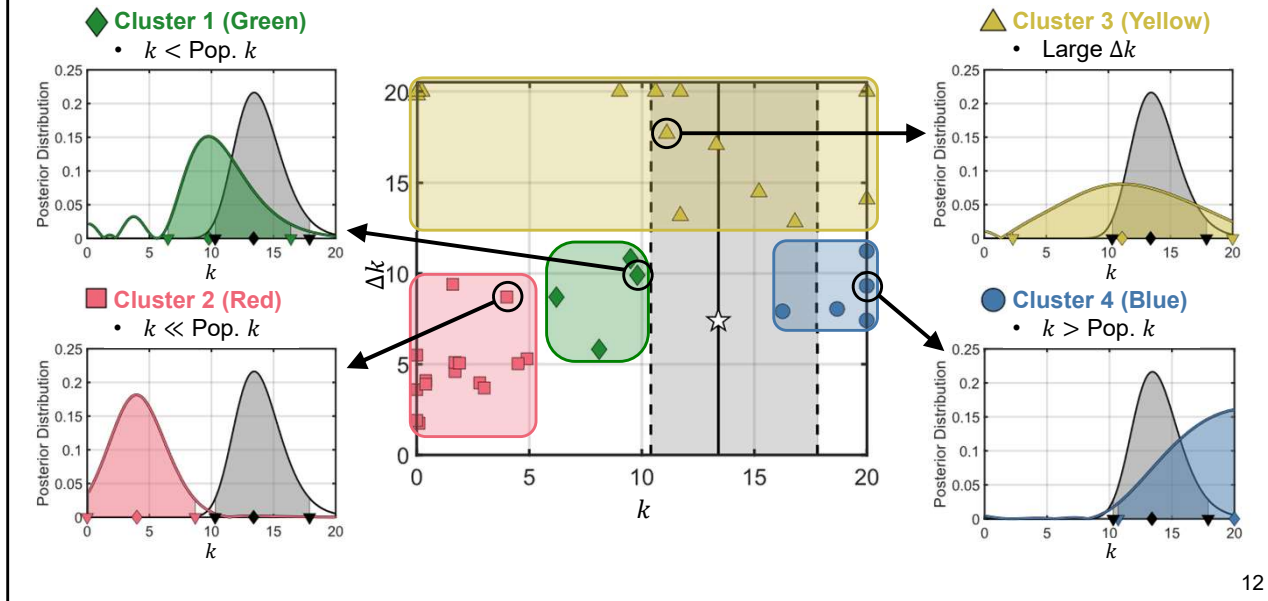
### Cluster 3 (Yellow) [37%]

- Large  $\Delta k$
- $\Delta k > 13$

### Cluster 4 (Blue) [13%]

- $k > \text{Pop. } k$
- $k > 16$

## Examples for each of the 4 clusters comparing the $k$ -distribution of an individual to the population

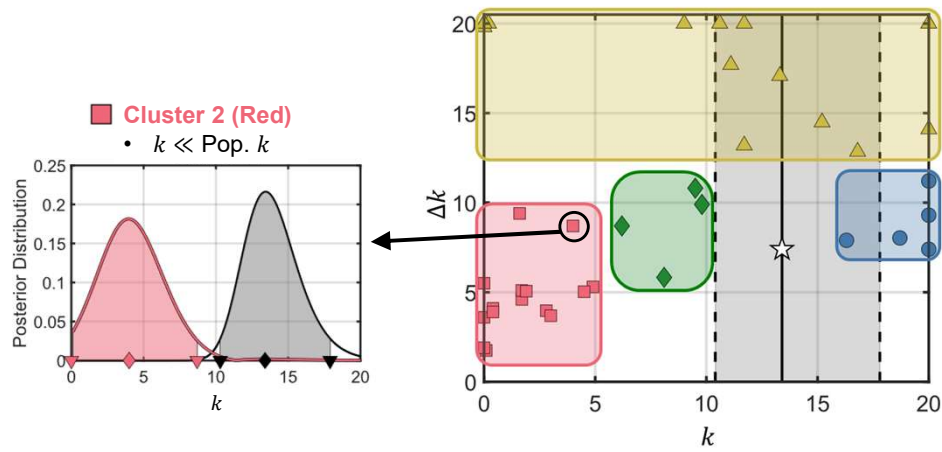


- Examples of distributions for each of the 4 clusters
  - Cluster 1 (green) overlaps with population but peaks at lower  $k$
  - Cluster 2 (red) same example as previously shown, very interesting that a lot are peaking much lower than  $k$ 
    - Not overlapping with population
    - Point out that the average of these  $k$  values does not necessarily become the population average. But it does seem like there's a group that may be more annoyed by or responding to the mean/max level than the number of events
  - Cluster 3 (yellow) broad uninformative for  $k$
  - Cluster 4 (blue) peak greater than population,  $k$  bounded to 20
- Again, averaging these might not equate to population. Yellow, green, and blue groups seem reasonable, red is unexpected
- What if policy is made that follows population, and over time, level decrease and number of operations increases? Blue might become disproportionately more annoyed



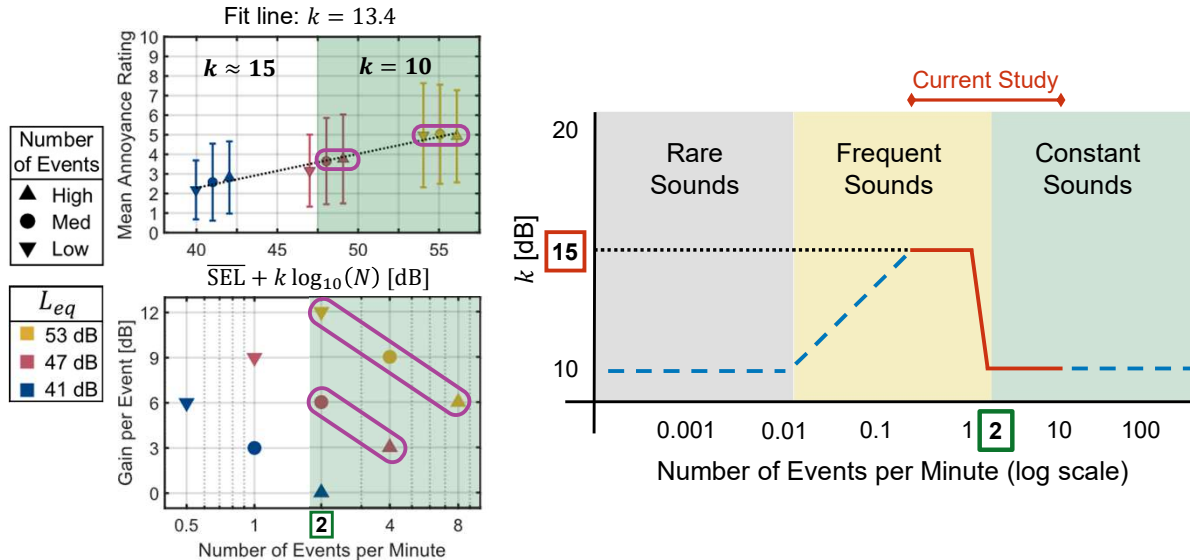
## Summary of UAM Noise and Number Test:

- Number of events impacts population response ( $k > 10$ )
- Individuals group in 4 clusters, 1 differs significantly from population trend
- Only focusing on the population may obscure differing trends of individuals



(BACKUP)

Results suggest transition from “frequent” to “constant” sounds at about 2 events per minute

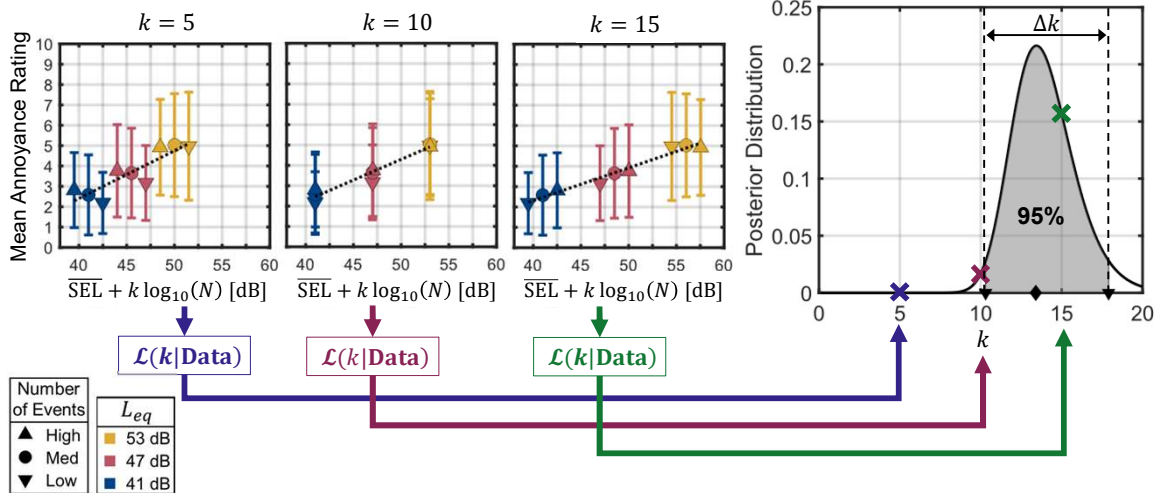


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- We noted that the data points don't collapse at lower  $L_{eq}$  but do at higher  $L_{eq}$
- Rather than some sort of  $L_{eq}$  cutoff, this more likely corresponds to a number of events transition from frequent to constant
- We see the yellow ( $L_{eq} = 53$  dB) and upper 2 red collapse, which corresponds to 2 events per minute on test matrix
- So,  $k \approx 15$  for the lower part of the curve, and  $k = 10$  at about 2 events per minute
- These are population trends; how do individuals hold up against this?

(BACKUP)

Determine the best value of  $k$  by evaluating a goodness of fit for each  $k$  from 0 to 20 and plot result as a posterior distribution



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- Create a distribution of  $k$  values that describe the best fit
- At each  $k$ , evaluate the log likelihood, which is a log sum of residuals as a measure of goodness of fit
- Compile the values and normalize area under curve to 1
- Peak denotes “best”  $k$  and confidence bound notes precision about that estimate of  $k$
- This posterior distribution is the result from this study

(BACKUP)

## Examples with 95% confidence intervals

