

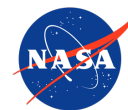
# Automated Detection of Dust-Devil Induced Pressure Signals

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# Outline

- Background
- Synthetic Testing
- Results from Observational Data
- Future Work



Dust devils captured by Spirit rover.  
Credit: NASA

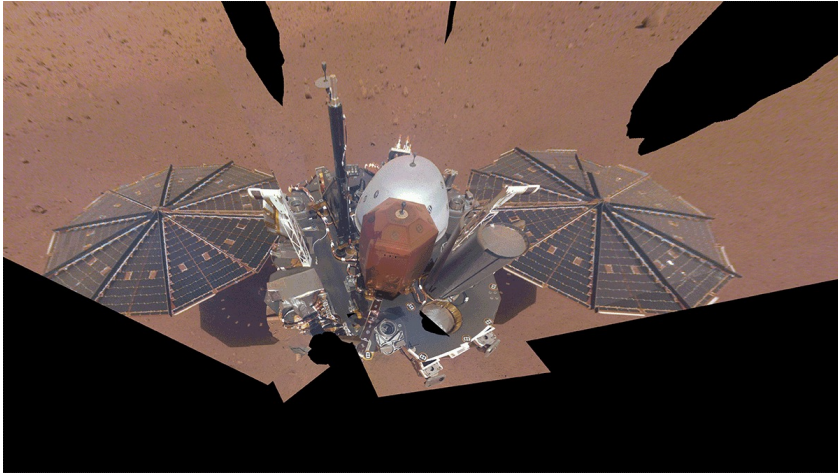
# Introduction to Vortices

- Formed by warm pockets of air
- At least a meter in height and last at least 10 seconds (Oke et al, 2007)
- Dust devils unique in that they are dust-laden
- Notable dip in pressure near their centers
- Frequently observed on Mars by surface landers and orbiters



Dust devil observed by the Curiosity rover.  
Credit: NASA

# Dust Devils on Mars



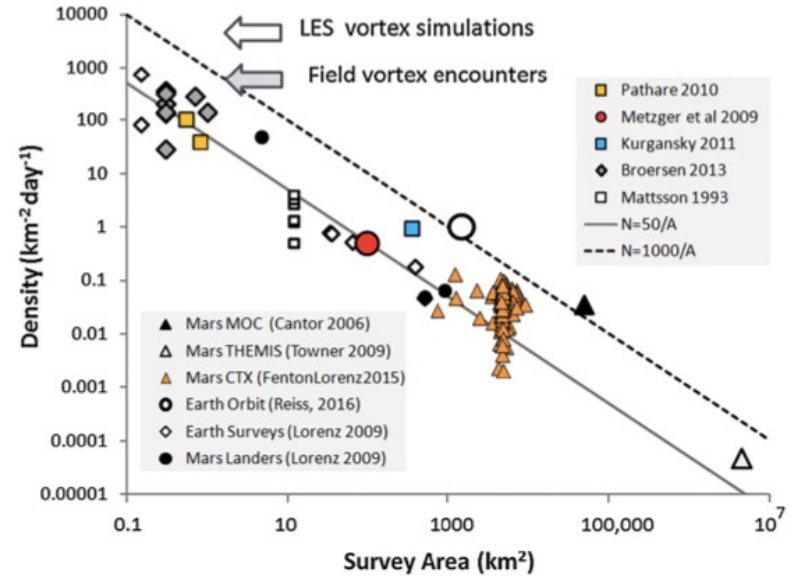
Mars InSight first and final selfies  
Credit: NASA

- Dust loading plays a primary role in Martian atmospheric dynamics
- Wind erosion could play a role in affecting biosignatures preserved in rock
- Dust devils could affect the longevity and efficacy of Martian landers and eventual human missions



# Challenges in Studying Martian Dust Devils

- Lack of an in-depth record poses a problem given prevalence of dust devils on Mars
- Low station density
- Formation characteristics can be studied through the development of a catalog
- “...deployment of sensor networks that produce a variety of data streams with high spatial and time resolution.” Jackson et al. (2018)



Dust devil density plot in Lorenz and Jackson (2016)

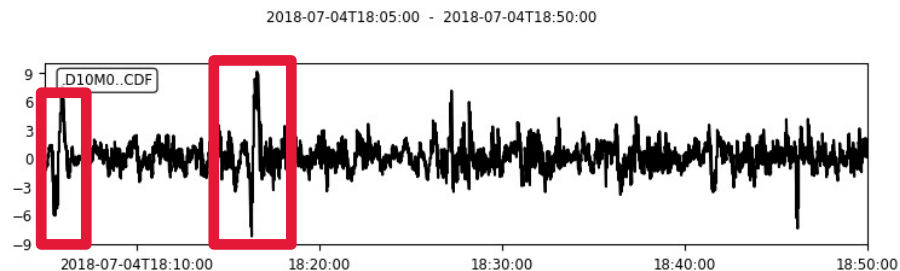
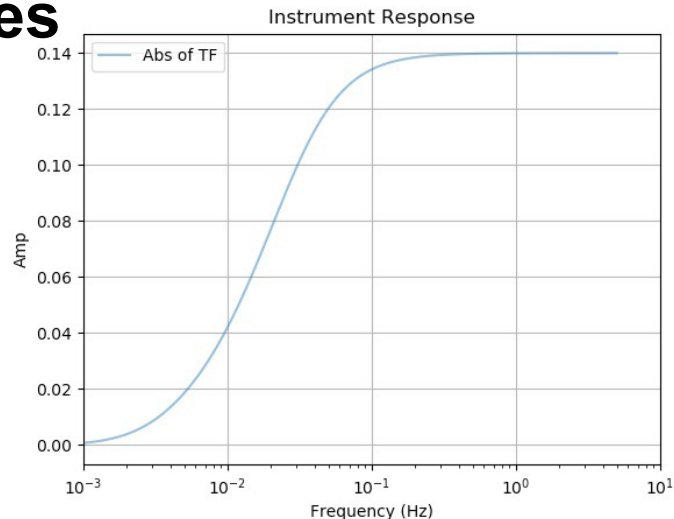
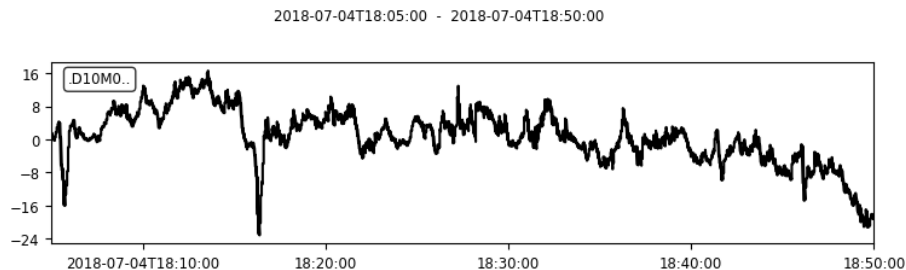
# An Analog Study

- 7-year deployment of seismometers and infrasound microbarometers at Nevada National Security Site (NNSS) in Mojave desert
- 32 microbarometers, 20 broadband seismometers, 100 geophones
- $10^4$  station-days of data
- Unique landscape pockmarked with craters
- Atmospheric scaling from Earth to Mars

$$\Delta p \approx \frac{\gamma \eta c_p \Delta T p_\infty}{RT_\infty}$$



# Signatures in Time-Pressure Series

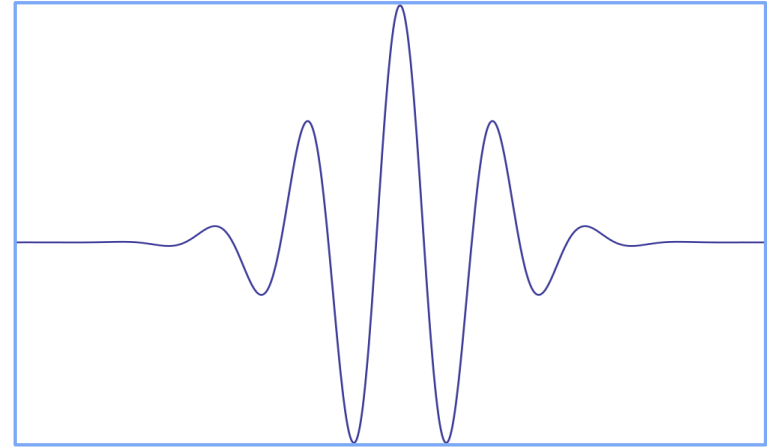


- Unique “heartbeat” signature good for correlation detector, consequence of **convolving signal with instrument response**
- Occur within  $10^{-3}$  to  $10^{-1}$  Hz frequency band
- Distinct in time

# Detector Architecture

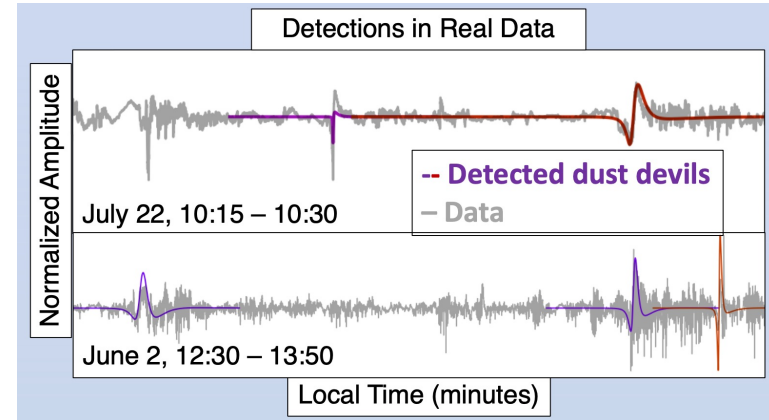
## Wavelet Detector

- Not as sensitive to noise compared to correlation detector
- Expensive
- Detections not specific to dust devils



## Correlation Detector

- Pressure-time series signatures are great candidates
- Sensitive to noise

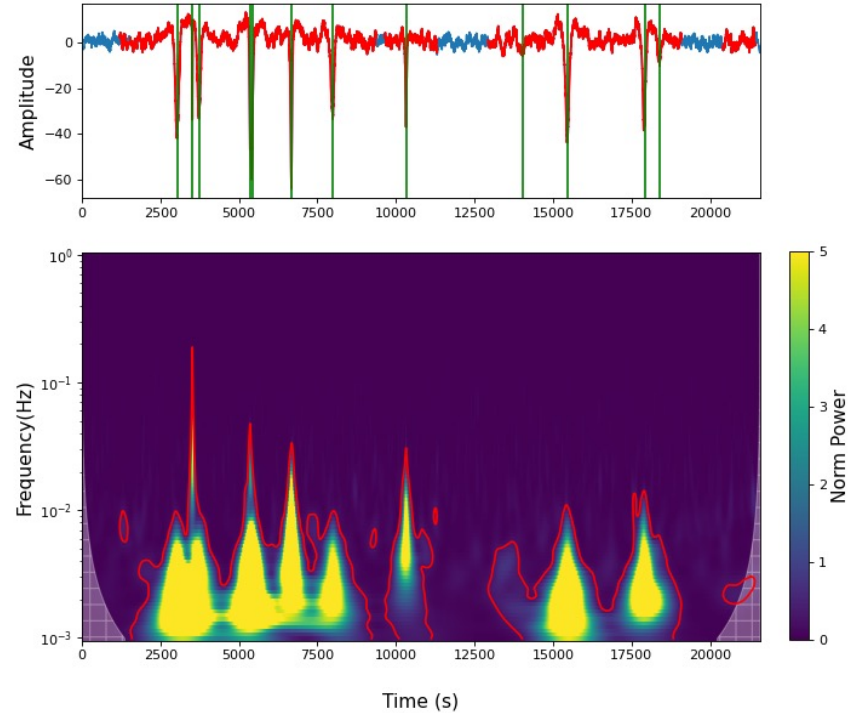




# Wavelet Detector

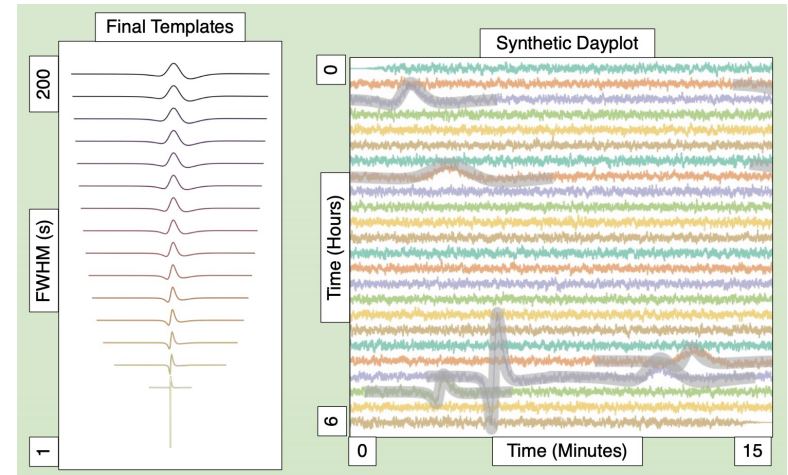
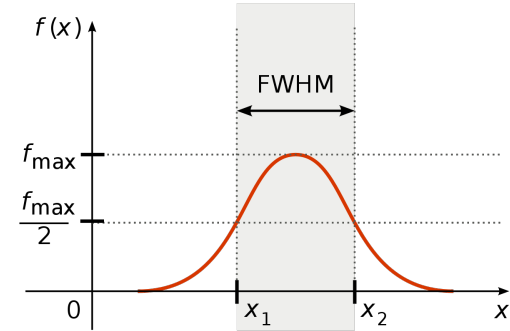
- Confidence testing in spectral domain
- Deconvolve instrument response
- Smoothed in scale
- Removed segments that lie above .1 Hz and less than 20 seconds in length
- Removed redundant detections
- Recalculated variance to remove bias against small dust devils

$$\frac{|W_n(s)|^2}{\sigma^2 P_k} \rightarrow \frac{\chi_2^2}{2}$$



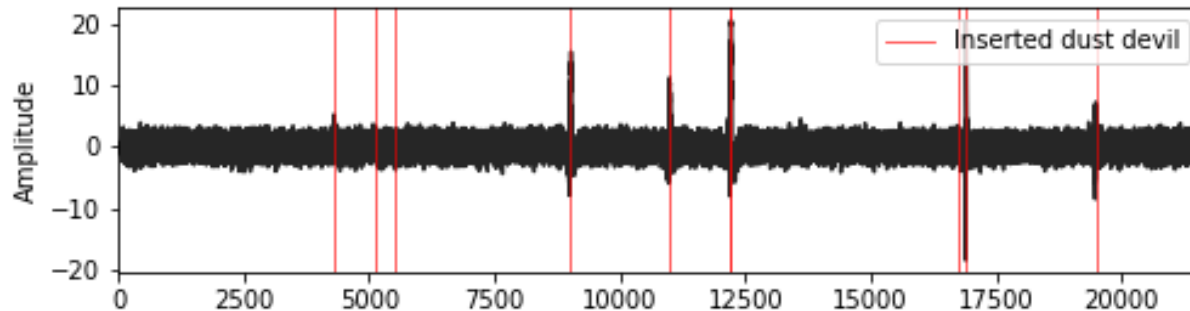
# Correlation Detector

- Unique signature lends itself to correlation
- 15 templates of varying FWHM
- Convolve instrument response with pressure profile outlined by Jackson and Lorenz (2015)
- Cross correlate templates with time series



# Testing Methodology

- 6 hour synthetics with random number of **non-overlapping** dust devils inserted at random points
- Dip (1-100 Pa), FWHM (1-300 seconds)
- Naturally observed dip 10-100 pa, FWHM 10-100s
- Unique red noise profiles for each synthetic
- Recall and efficiency analysis



# Synthetic Run Summary

- Run on 10,000 synthetics
- Conducted only with white noise characterization in wavelet detector

## Wavelet Detector

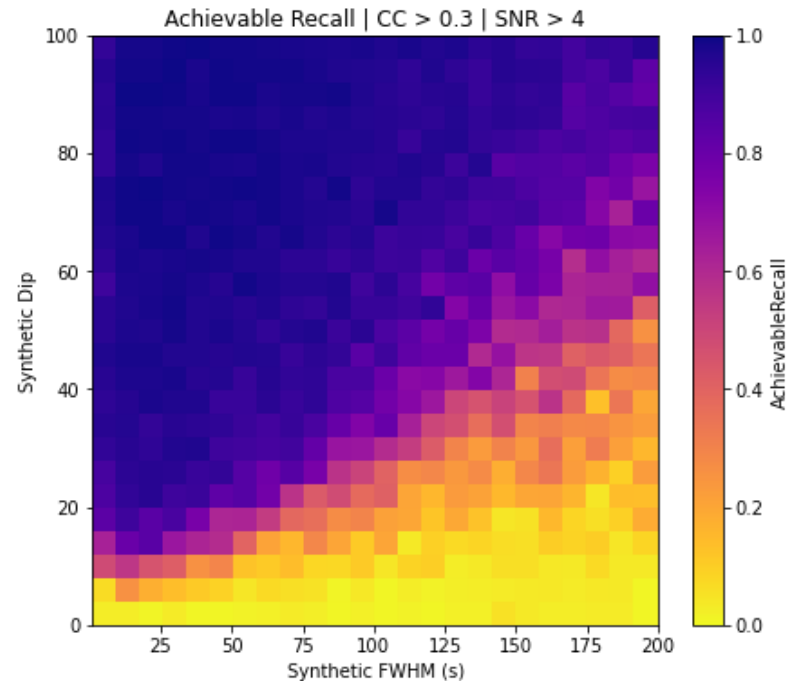
95.92 percent of dust devils were detected

## Correlation Detector

83 percent of dust devils were detected

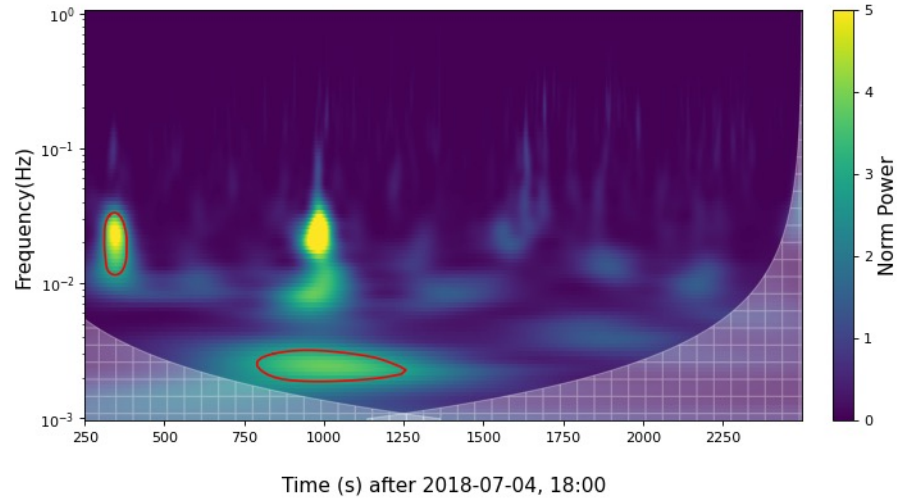
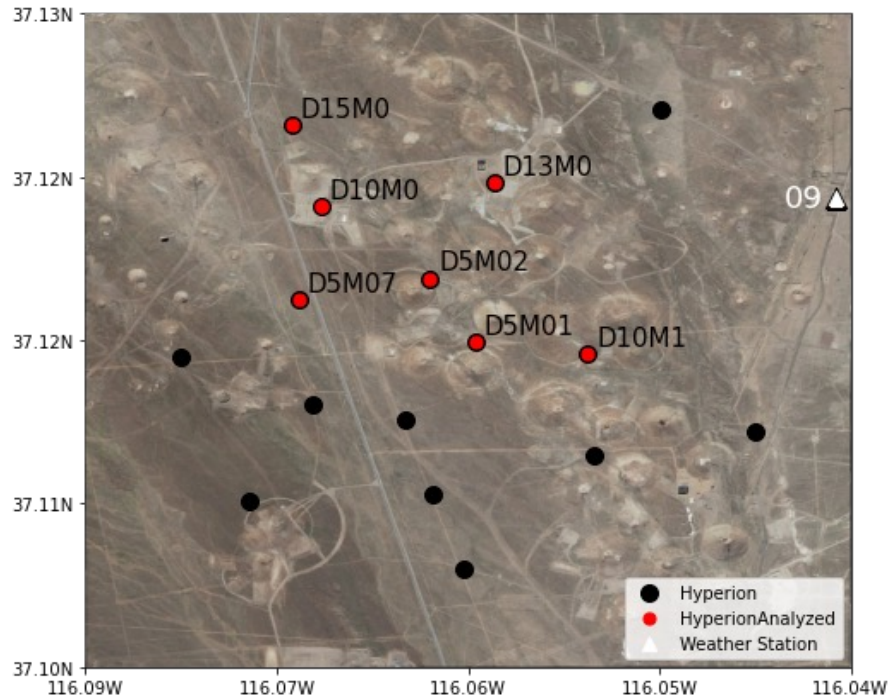
## Joint Detector

With 99 percent precision, 91 percent of dust devils were detected



Detector	Precision(%)	Recall (%)
Wavelet	74	95
Correlation	98	83
Wavelet+Correlation	99	91

# Observational Data Trial (NNSS)



- 62 days of data
- 7 stations
- 5976 detections in total



# Conclusion

- Dust devils play an important role in the Martian environment, but population is hard to study
- A heavily-instrumented analog densely populated with arrays is available for analysis
- A parallel, automated detection scheme has been developed and characterized using 10,000 synthetics, yielding promising results

# Future Work



Dust devil from Lorenz et al. (2016)

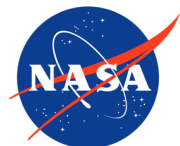
- Generate full catalog for 7 years of data
- Analysis on formation and dynamics on large N dataset
- Release catalog of dust devils through NASA PDS
- Extrapolate results to Mars based on atmospheric scaling relations

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