# Uncertainties and Feedback Control in Mars Entry-Descent-Landing 

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## Mars

## Mars

Earth to Mars distance $\approx 234$ million miles

## Why explore Mars



## Why explore Mars

1 Mars day $\approx 1.0275$ Earth day [ 24 hr 39 min 36 s ]

1 Mars year $\approx 1.8808$ Earth year [687 Earth days]

Terrestial planet with rocky core

Water ice caps at its North and South poles

Very strong evidence that liquid water existed in the past

Travel time approx. 7 months

## However, landing on Mars is challenging

Mars atmosphere:
$95 \% \mathrm{CO}_{2}$
2.8\% Nitrogen

2\% Argon
rest $\mathrm{O}_{2}$ and Carbon Monoxide

Very thin ( $<1 \%$ of Earth)

Earth atmosphere:
$78 \%$ Nitrogen
$21 \% \mathrm{O}_{2}$
$1 \%$ Argon and other inert gases $0.04 \% \mathrm{CO}_{2}$



## However, landing on Mars is challenging

Sol 2075


## Frequent dust storms

Whole planet-level dust storm in every 3 Mars years

## Past NASA landings on Mars

Perseverance [2021]


## Mars Entry-Descent-Landing (EDL)



## Mars EDL

EDL duration $\approx 7$ minutes [" 7 minutes of terror"]

Radio signal travel time $\approx 14$ minutes during Martian Summer

Requires on-board autonomy and decision making capabilities

## Mars EDL: 2021



## Uncertainties in Mars EDL



## Uncertainties in Mars EDL: prediction, estimation and control



Supersonic parachute



Gale Crater (4.49S, 137.42E)

## Uncertainty prediction: joint probability density functions (PDFs)

Nonlinear Dynamics with
Monte Carlo on Samples


Linear Dynamics with
Gaussian Uncertainty


## Uncertainty prediction: joint probability density functions (PDFs)

Nonlinear Dynamics with
Monte Carlo on Samples


Too expensive for EDL simulation

Linear Dynamics with
Gaussian Uncertainty


Too ideal for EDL simulation

## Uncertainty prediction: how bad is the Gaussian fit



Source: Golombek et. al., J. Geophys. Research. 2003
Credit: NASA JPL, Univ. Washington, St. Louis, JHU APL, Univ. Arizona.


## Uncertainty prediction: a new nonparametric method


A.H., and R. Bhattacharya, Beyond Monte Carlo: a computational framework for uncertainty
propagation in planetary entry, descent and landing, AIAA GNC, 2010

## Uncertainty control: an emerging direction in control research

Uncontrolled joint PDF evolution:


Optimal controlled joint PDF evolution:

K.F. Caluya, and A.H., Wasserstein proximal algorithms for the Schroedinger bridge problem: density control with nonlinear drift, IEEE Transactions on Automatic Control, 2021

## Uncertainty control: an emerging direction in control research

## has applications in Earth too



Risk management for safe automated driving in multi-lane highways
S. Haddad, K.F. Caluya, A.H., and B. Singh, Prediction and optimal feedback steering of probability density functions for safe automated driving, IEEE Control Systems Letters, 2020

## Terrain relative navigation: 2021 landing



## Summary

Uncertainties are unavoidable in Mars EDL

Feedback control enables high performance EDL in the presence of uncertainties

Will see more advanced control algorithms for future high payload missions

Beyond Mars: many more challenges - landing in Titan, Europa, Enceladus

## Thank You

Support:

