



The Multi-Angle Imager for  
Aerosols (MAIA) Investigation:  
Application of spaceborne  
spectropolarimetry to speciated  
airborne particulate matter  
exposure and human health



David J. Diner<sup>a</sup>  
Feng Xu<sup>b</sup>  
Gerard van Harten<sup>a</sup>  
Kristal Verhulst<sup>a</sup>  
Yang Liu<sup>c</sup>  
Howard Chang<sup>c</sup>  
Jun Wang<sup>d</sup>

<sup>a</sup>Jet Propulsion Laboratory,  
Calif. Institute of Technology

<sup>b</sup>University of Oklahoma

<sup>c</sup>Emory University

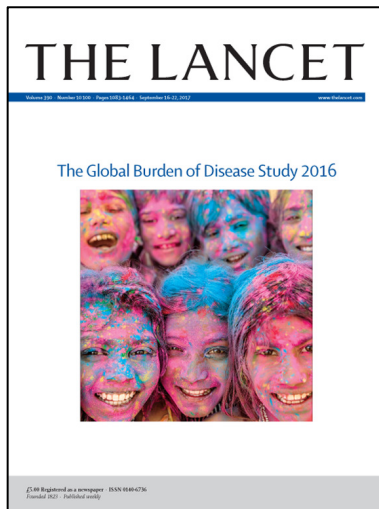
<sup>d</sup>University of Iowa

APOLO-19  
Lille, France



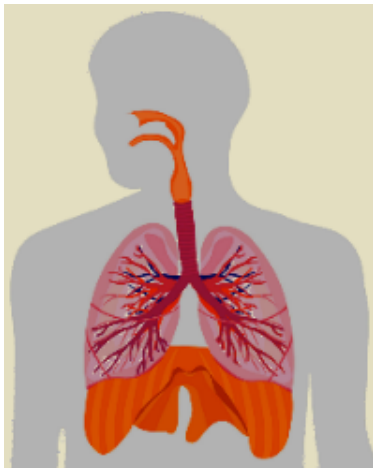
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# Airborne particulate matter (PM): a major risk to human health



4.1 million premature deaths per year —  
the top environmental risk factor worldwide

MODIS and MISR used to determine PM exposure



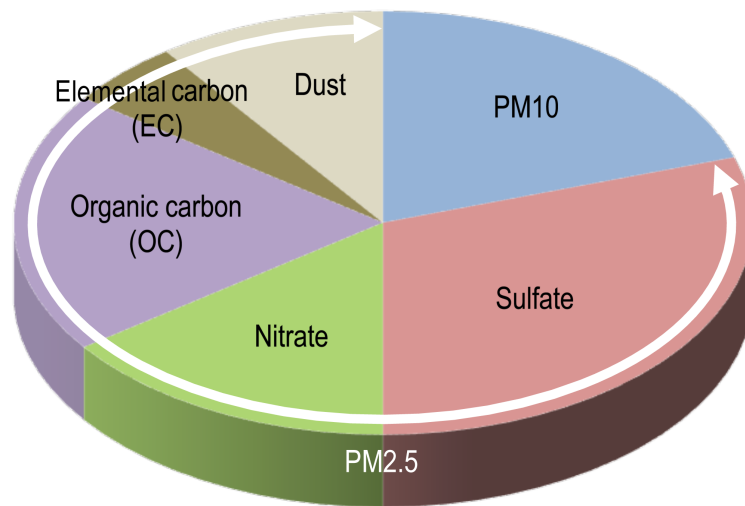
Airborne PM has been associated with

- cardiovascular disease and mortality
- respiratory disease
- pregnancy complications and low birth weight
- lung cancer
- many other adverse health outcomes

# Motivation for MAIA

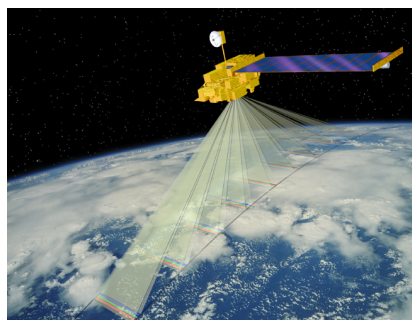


While PM is a known health risk, the relative toxicity of different PM types—mixtures of particles with different sizes, shapes, and compositions—is not well understood.



MAIA's primary objective is to link exposure to different types of PM with human health.

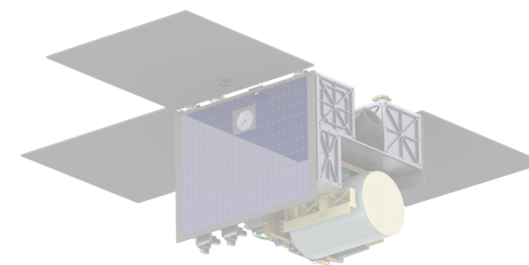
# From MISR to MSPI to MAIA



**Multi-angle Imaging SpectroRadiometer (MISR)**



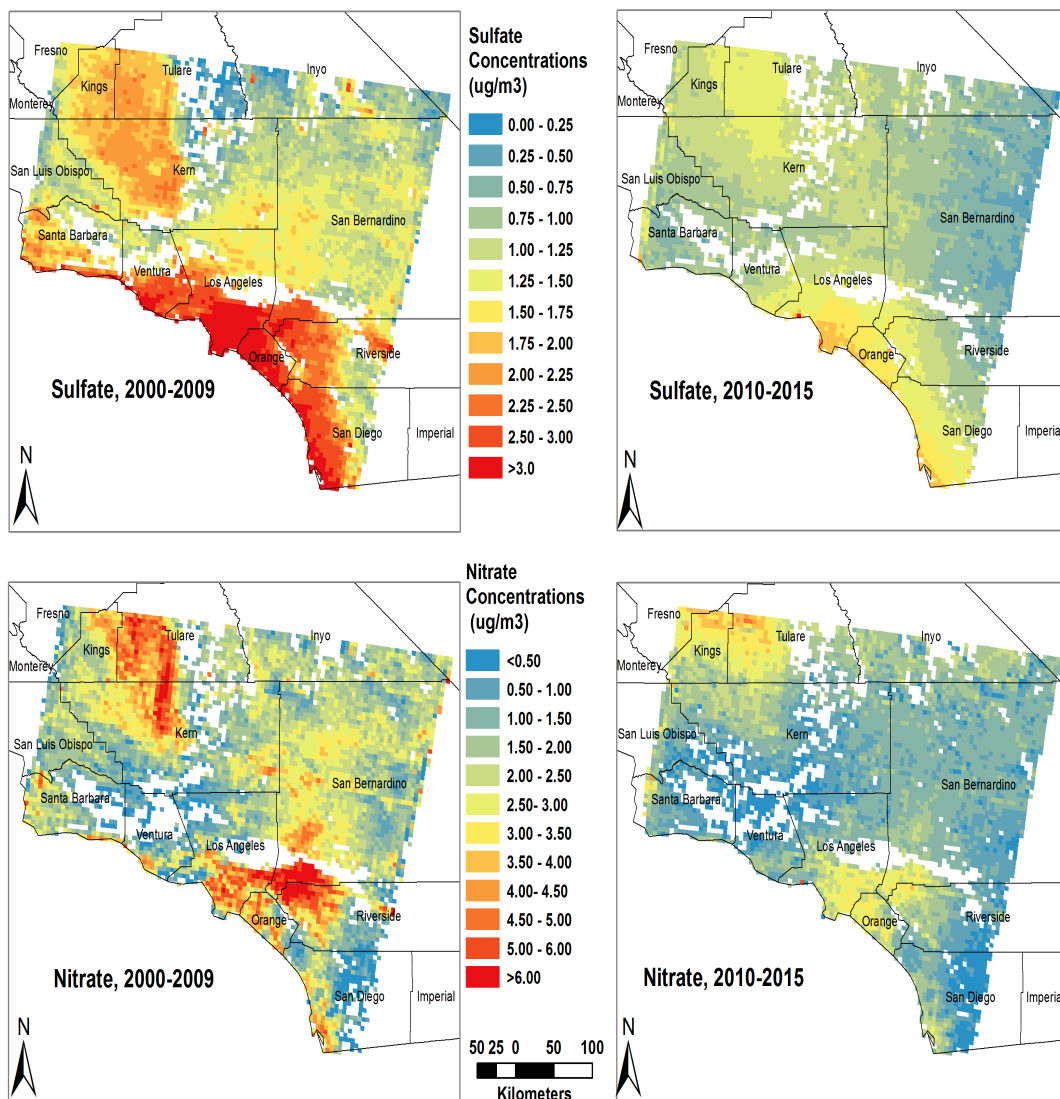
**Airborne Multiangle SpectroPolarimetric Imagers (AirMSPI/AirMSPI-2)**



**Multi-Angle Imager for Aerosols (MAIA)**

Mission start	1999 (still operating)	Since 2010	~2022 (3 year mission)
Platform	NASA/Terra	NASA/ER-2 aircraft	General Atomics/OTB-2
Coverage	Global	Targeted	Targeted
Revisit frequency	~once per week	N/A	~3.5 times per week
Multi-angle viewing method	9 fixed cameras	Pointable camera	Pointable camera
Number of spectral bands	4 (VNIR)	AirMSPI: 8 (UV/VNIR) AirMSPI-2: 12 (UV/VNIR/SWIR)	14 (UV/VNIR/SWIR)
Polarization	No	3 bands (AirMSPI) 5 bands (AirMSPI-2)	3 bands
Aerosol resolution	4.4 km	Sub-km	1 km

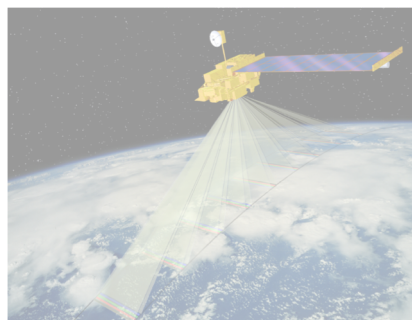
# Speciated PM<sub>2.5</sub> mapping with MISR



Multi-year means of predicted sulfate and nitrate PM<sub>2.5</sub> concentrations

*Meng et al. (2018)*

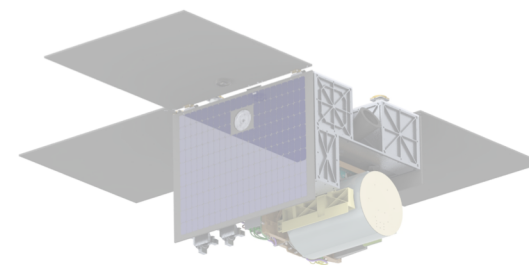
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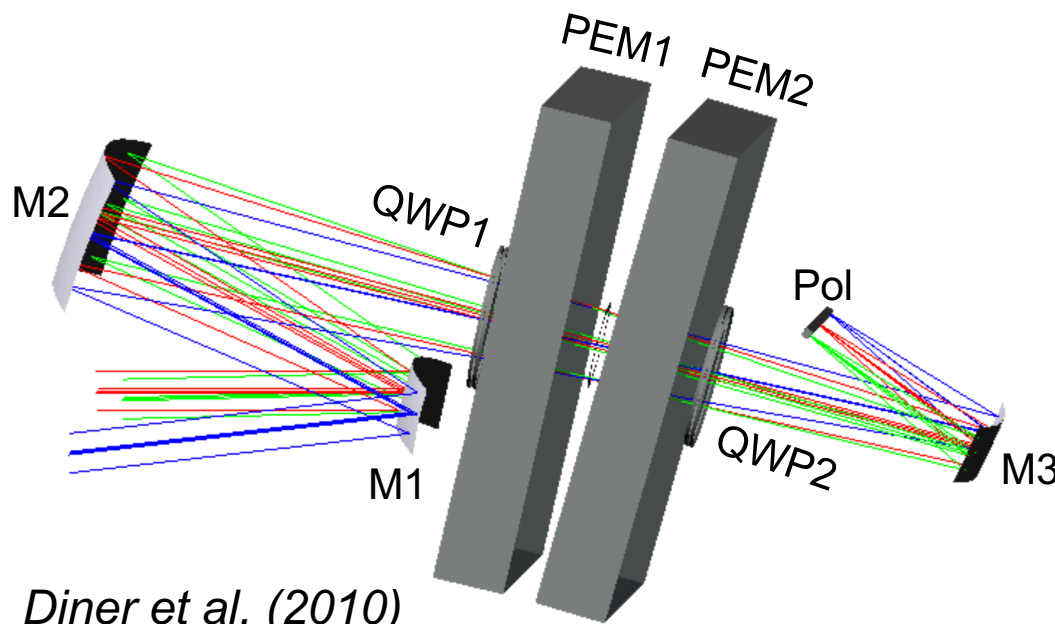
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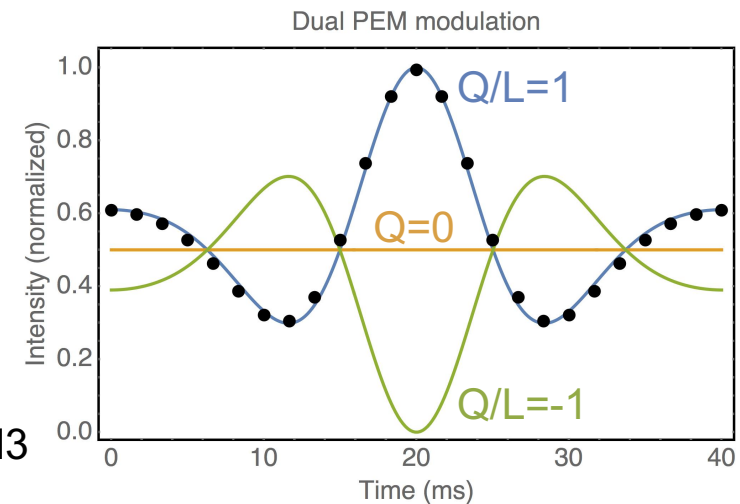
# Polarization measurement technique

- Dual photoelastic modulators (PEMs)
- Achromatic quarter-wave plates (QWPs) to modulate linear polarization
- Fixed 0°, 45° wire grid polarizer strips on adjacent detector rows
- Total and polarized radiance (Q or U) from same pixel → ratio independent of optical transmittance or detector gain
- Linear signal equation

$$S(t) = L + Q F(t)$$

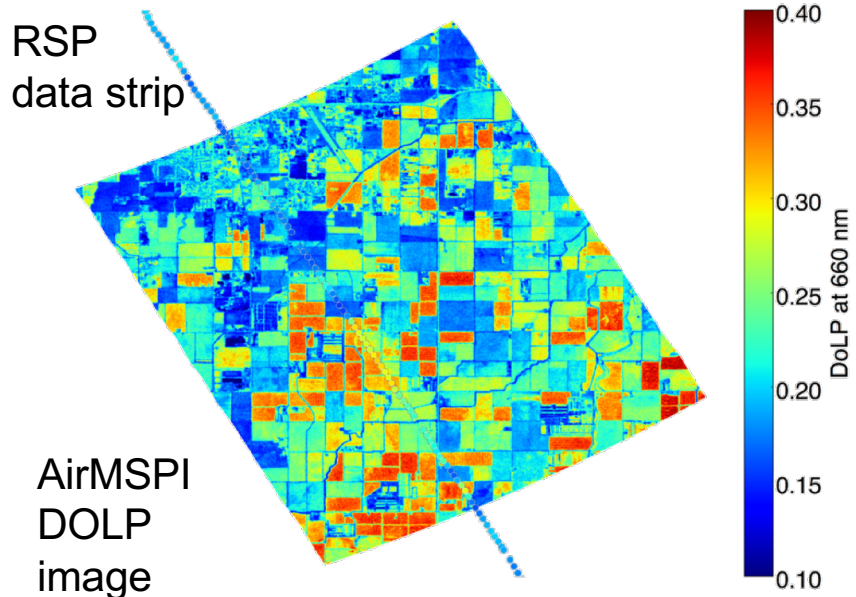


*Diner et al. (2010)*

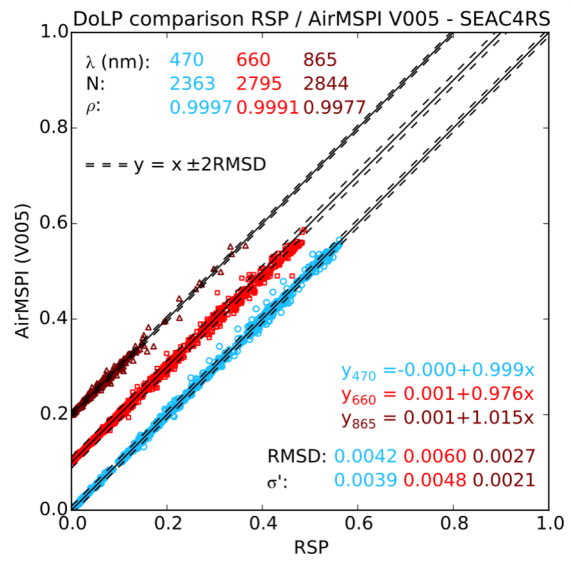
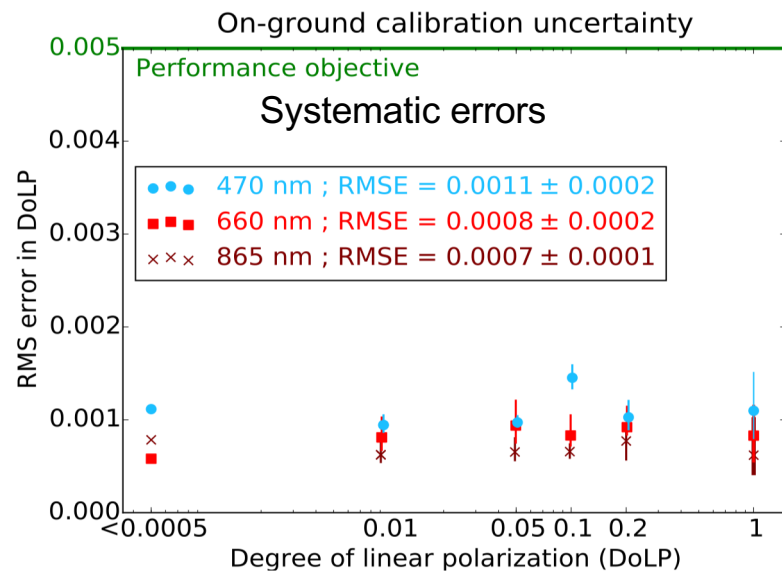


# AirMSPI performance evaluations

Laboratory: comparison to polarization state generator



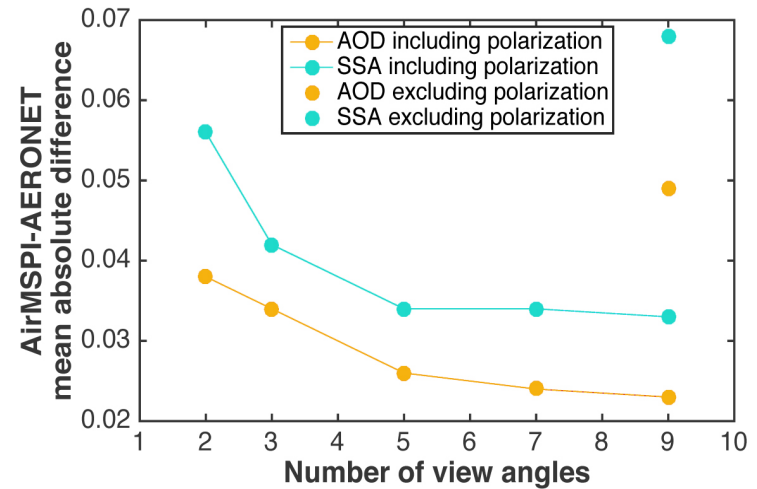
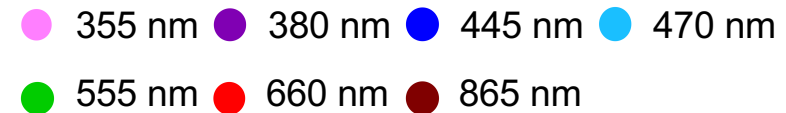
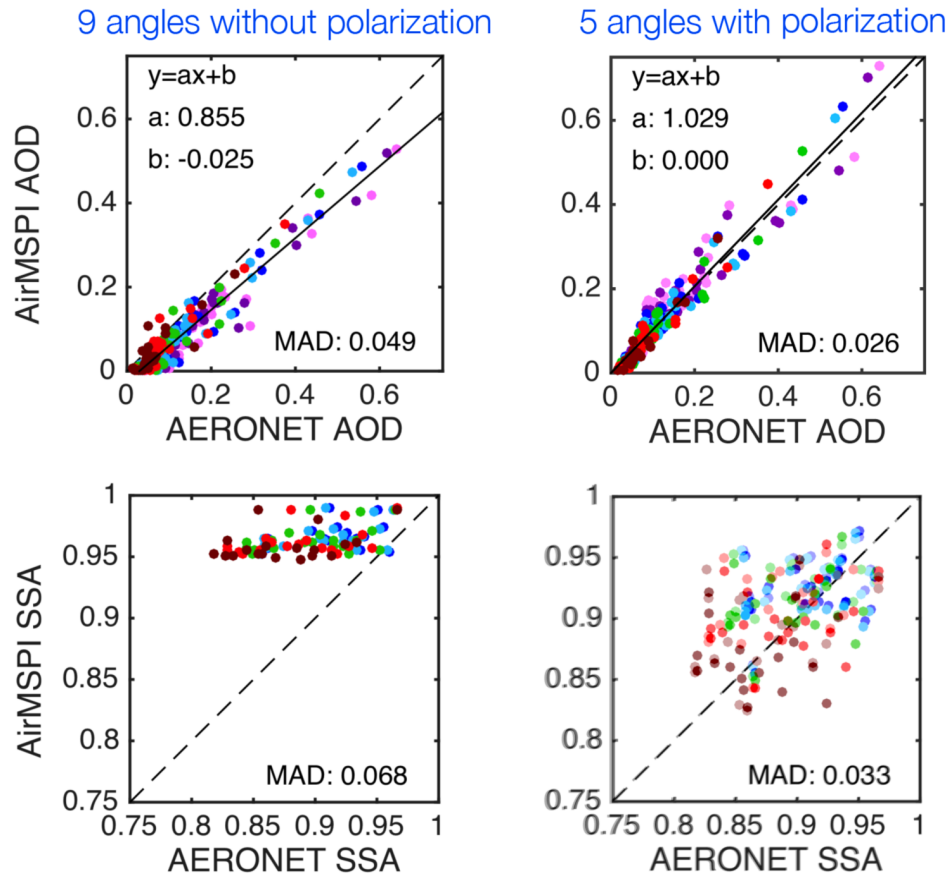
Flight: comparison to Research Scanning Polarimeter (RSP)



van Harten et al. (2018)



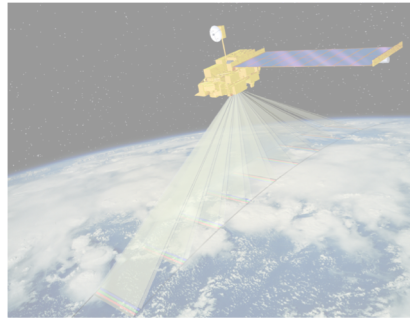
# Aerosol retrieval sensitivity to number of view angles, polarization



*Xu et al. (2017)*

Substantial improvement from 2-5 angles, smaller gain for >5 angles (cf. *Hasekamp & Landgraf, 2007*; *Wu et al. 2015*)

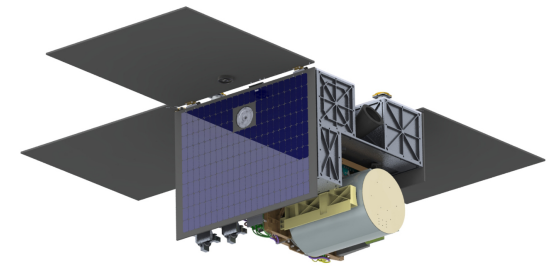
# From MISR to MSPI to MAIA



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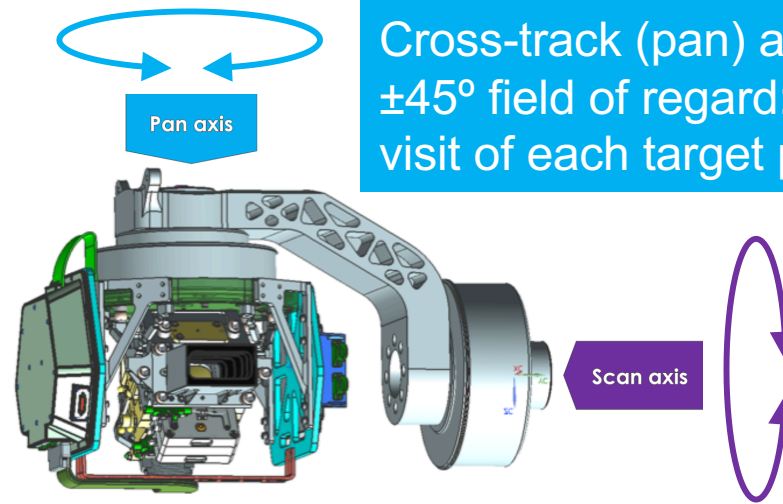
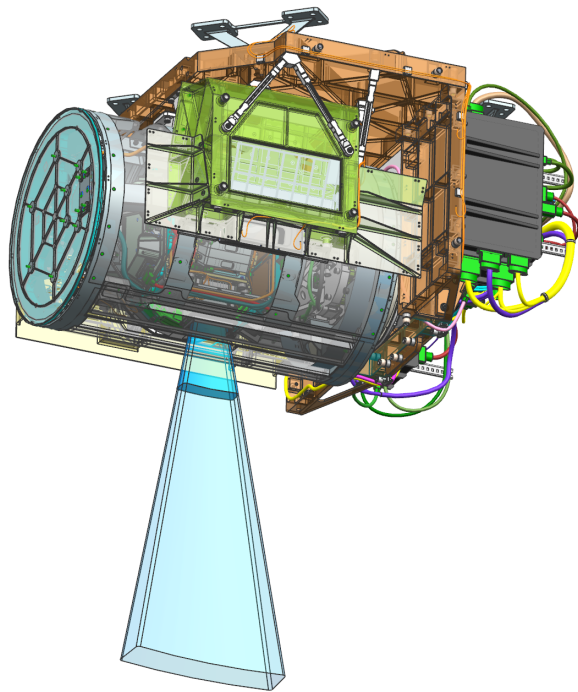
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# MAIA instrument provides multiangular, multispectral, polarimetric imagery



Cross-track (pan) axis provides  $\pm 45^\circ$  field of regard: 3-4 repeat visit of each target per week

Scan axis provides along-track multiangle imagery ( $\pm 60^\circ$  at instrument)

Detector	Silicon										HgCdTe			
Band (nm)	365	387	415	442	550	645	749	762.5	866	945	1040	1610	1885	2125
Polarimetric				pol		pol					pol			

aerosol absorption

fine particles

O<sub>2</sub>

H<sub>2</sub>O

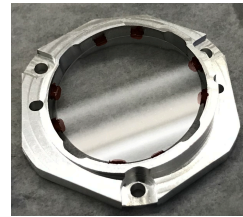
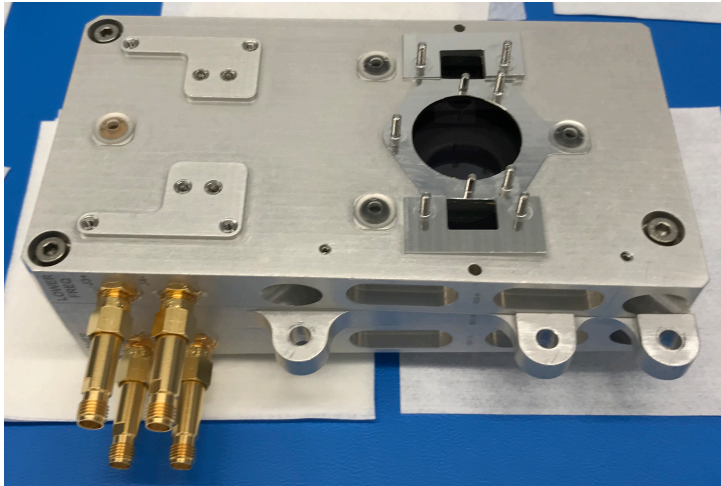
cirrus

coarse particles

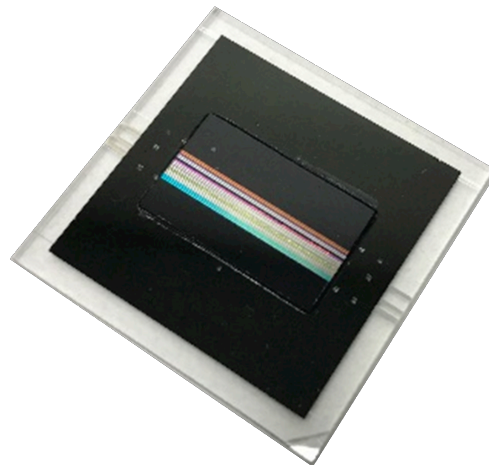
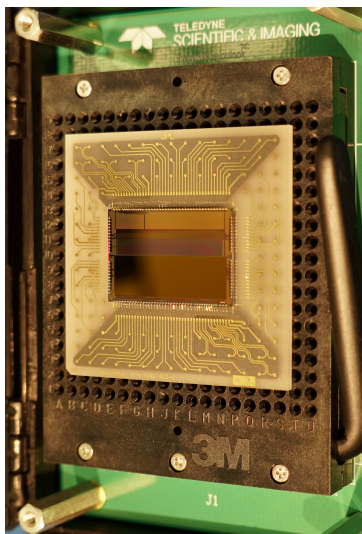
cloud screening



# MAIA polarization imaging hardware



Dual photoelastic modulator assembly and quarter-wave plate test unit



Integrated UV/VNIR/SWIR focal plane array and stripe filter/polarizer assembly

# MAIA will observe discrete, globally distributed target areas

- Primary Target Areas (PTAs): epidemiological studies
- Secondary Target Areas (STAs): air quality/climate studies or other applications
- Calibration/Validation Target Areas (CVTAs): instrument calibration and product validation



## Primary Target Areas

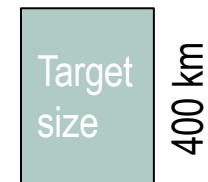
- USA-LosAngeles
- USA-Atlanta
- USA-Boston
- ESP-Barcelona
- ITA-Rome
- ZAF-Johannesburg
- ISR-TelAviv
- ETH-AddisAbaba
- IND-Delhi
- CHN-Beijing
- TWN-Taipei

## Secondary Target Areas

- USA-Hilo
- PAC-OceanStCu
- USA-SanFrancisco
- USA-Phoenix
- USA-Denver
- MEX-MexicoCity
- CAN-Toronto
- PER-Lima
- CHL-Santiago
- BRA-SãoPaulo
- SEN-Dakar
- ATL-OceanStCu
- NGA-Lagos
- ZAF-CapeTown
- SRB-Belgrade
- KWT-KuwaitCity
- IND-Chennai
- BGD-Dhaka
- VNM-Hanoi
- MNG-Ulaanbaatar
- KOR-Seoul
- AUS-Sydney

## Calibration/Validation Target Areas

- USA-RailroadValley
- LBY-Libya4
- NAM-Gobabeb

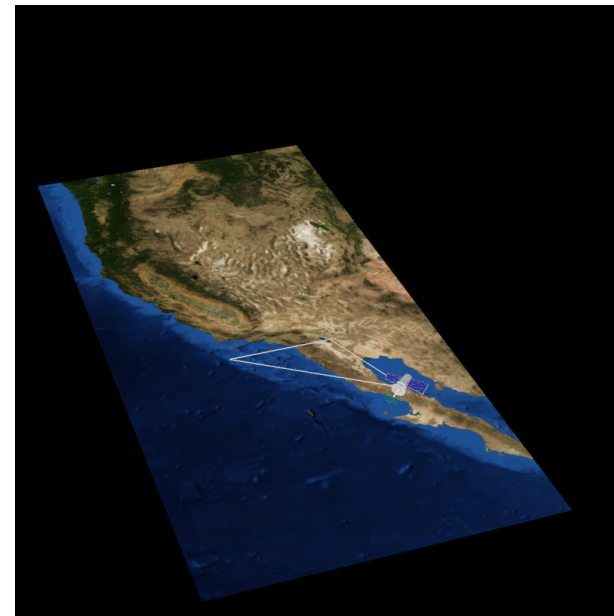
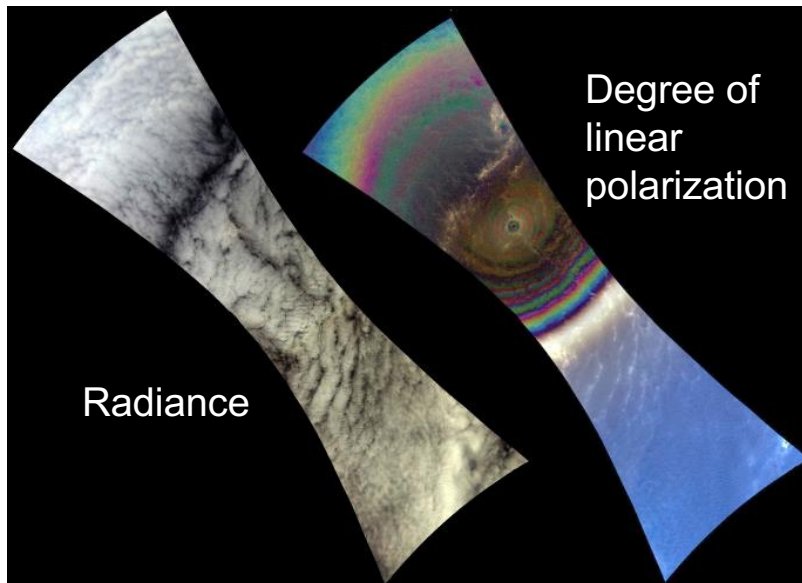


300 km

400 km

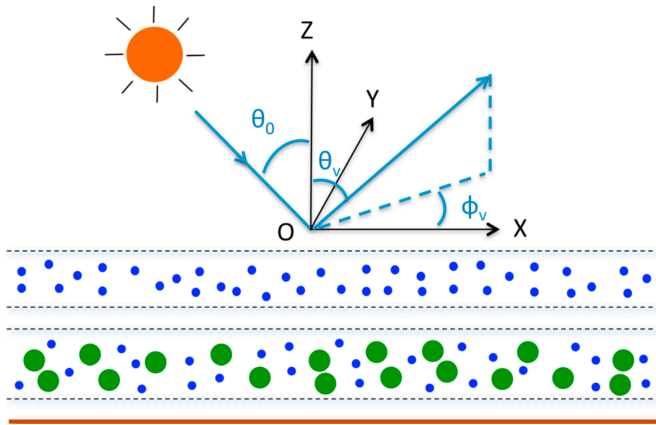
# Earth observation modes

- Most Earth targets will be observed in “step and stare” mode



Sweep mode is used for study of cloud microphysics

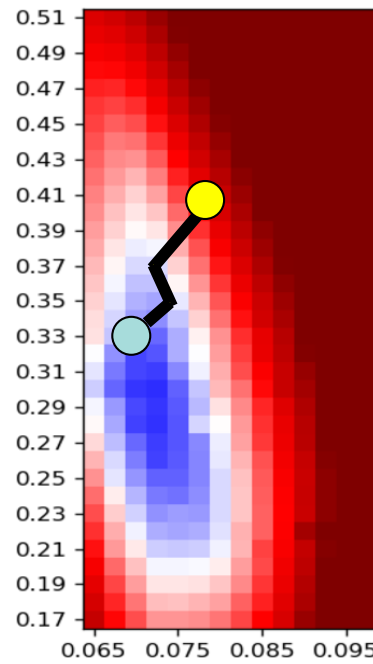
# Radiative-transfer based aerosol retrievals



Light scattering models  
 Surface reflectance  
 database  
 Smoothness constraints

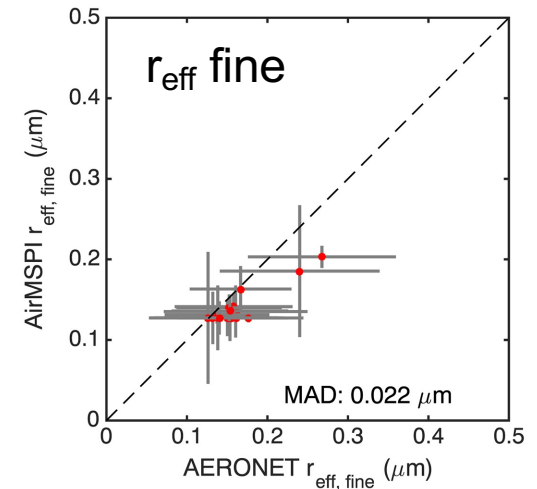
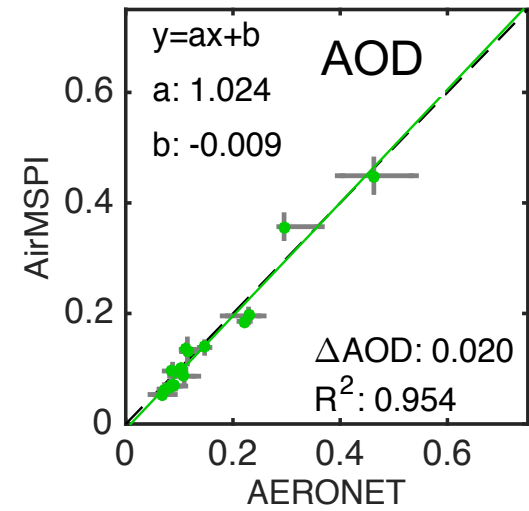
*Xu et al. (2017)*

Multivariate cost  
 function minimization  
 using Jacobians

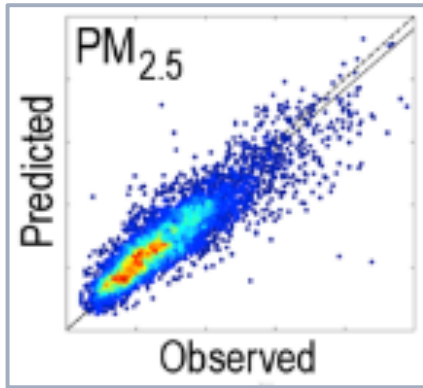


● Starting point

● Solution



# Importance of surface monitors



Regression of retrieved aerosol properties against surface monitor (total and speciated PM) data is used to calibrate the aerosol-to-PM transformation





# Geostatistical Regression Model (GRM)

PM<sub>2.5</sub>, PM<sub>10</sub> monitor data =  $\alpha$  (Spatiotemporal offsets)

+  $\beta$  x Aerosol optical depth

+  $\gamma$  x Geospatial predictors  
(elevation, roads,  
green space)

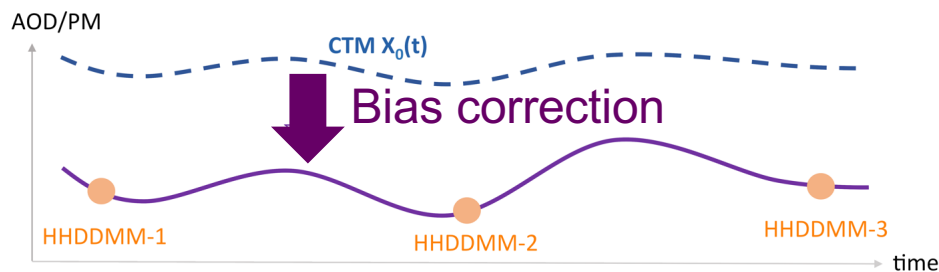
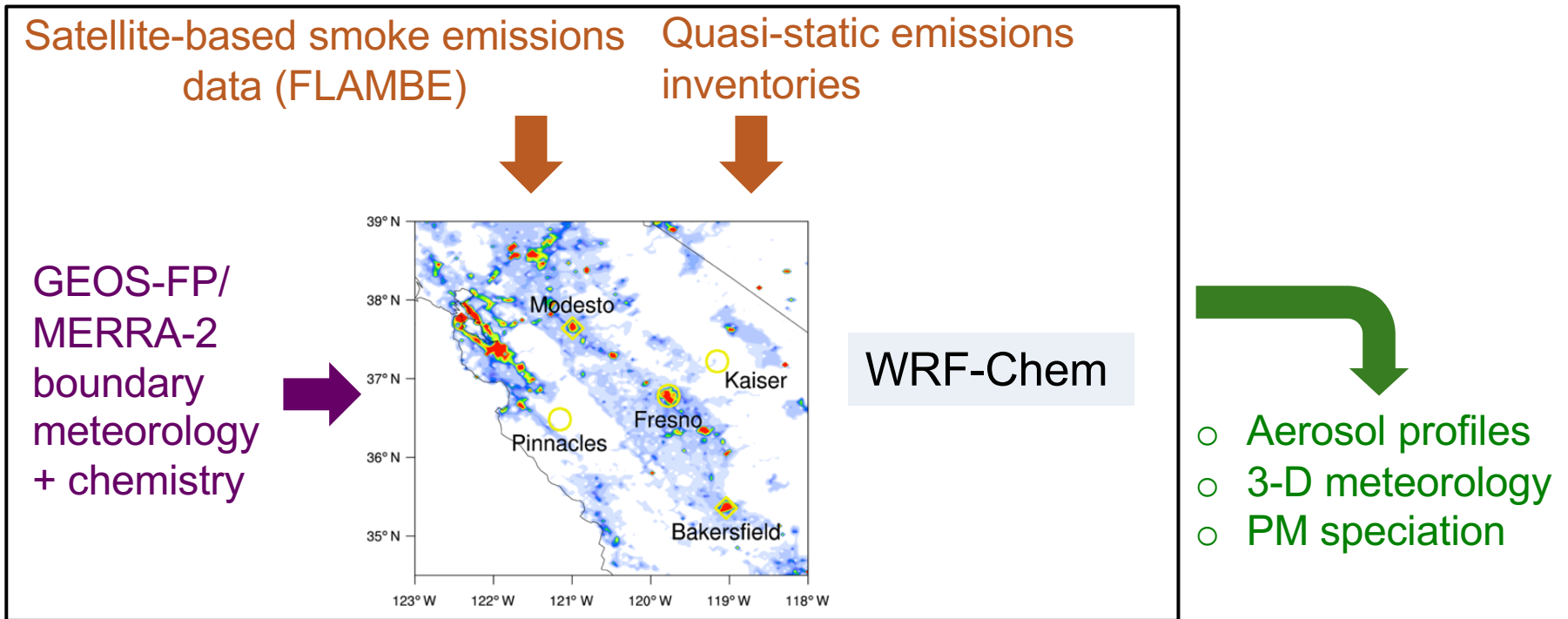
+  $\delta$  x Spatiotemporal  
predictors (RH, PBLH,  
temperature, winds,  
additional aerosol  
parameters)

Collocated PM and predictor data are used to derive coefficients of the GRMs.

A Bayesian multivariate framework is used.

The calibrated GRMs are used to map PM at locations between monitors.

# Bias-corrected chemical transport model (CTM) PM is used for spatial and temporal gap-filling



A separate GRM is used to correct CTM biases and the results are merged with the satellite-based PM

# Planned health investigations

PTA	Acute effects	Subchronic effects	Chronic effects
Southern Calif.		Birth outcomes	Cause-specific mortality
Georgia	Respiratory morbidity		
New England	Mortality, heart attack, stroke, pneumonia	Birth outcomes	Mortality, heart attack, stroke, pneumonia
Spain			Mortality, primary care outcomes physical/mental health outcomes
Italy	Cause-specific mortality, disease-specific hospital admissions		Cause-specific mortality, disease-specific hospital admissions
South Africa	Cause-specific mortality		
Israel	Mortality, heart attack, stroke, pneumonia	Birth outcomes	Mortality, heart attack, stroke, pneumonia
Taiwan		Pregnancy complications, birth outcomes	COPD, heart disease
Ethiopia		Preeclampsia, birth outcomes, childhood mortality/morbidity	Respiratory disease, cognition
China	Cardiovascular disease		
India	Mortality, cardiovascular/ respir. disease		Cardiovascular biomarkers

# MAIA Science Team

## Principal Investigator

David Diner	JPL
-------------	-----

## Co-Investigators: Instrument Characterization

Carol Bruegge	JPL
Russell Chipman	University of Arizona
Veljko Jovanovic	JPL

## Co-Investigators: Aerosol Remote Sensing, Modeling, Validation

Larry Di Girolamo	University of Illinois
Michael Garay	JPL
Edward Hyer	Naval Research Lab.
Olga Kalashnikova	JPL
Alexei Lyapustin	GSFC
Randall Martin	Washington University
Jun Wang	University of Iowa
Feng Xu	University of Oklahoma

## Co-Investigators: PM Exposure, Epidemiology

Michael Brauer	Univ. of British Columbia
Michael Jerrett	UCLA
Yang Liu	Emory University
Bart Ostro	UC Davis
Beate Ritz	UCLA
Joel Schwartz	Harvard University

## Collaborators: Air Quality and Public Health

Sagnik Dey	IIT Delhi
Sina Hashimenassab	SCAQMD
Kembra Howdeshell	NIH
John Langstaff	EPA
Pius Lee	NOAA
Fuyuen Yip	CDC

# Summary

- The MAIA instrument uses multiangle spectropolarimetry to constrain column-integrated aerosol particle properties.
- Instrument fabrication and surface monitor deployments are underway in preparation for mid-2022 launch.
- Retrieved aerosol parameters will be used in conjunction with surface monitor, land use, and CTM data to calibrate the GRMs used to map total and speciated PM.
- Epidemiologists on the MAIA team will conduct health impact investigations in the Primary Target Areas.