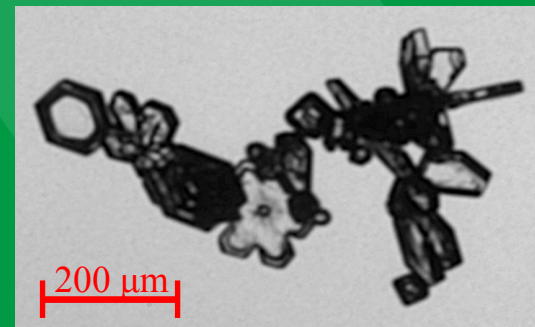




# Chain Aggregates Observations during Recent Field Campaigns

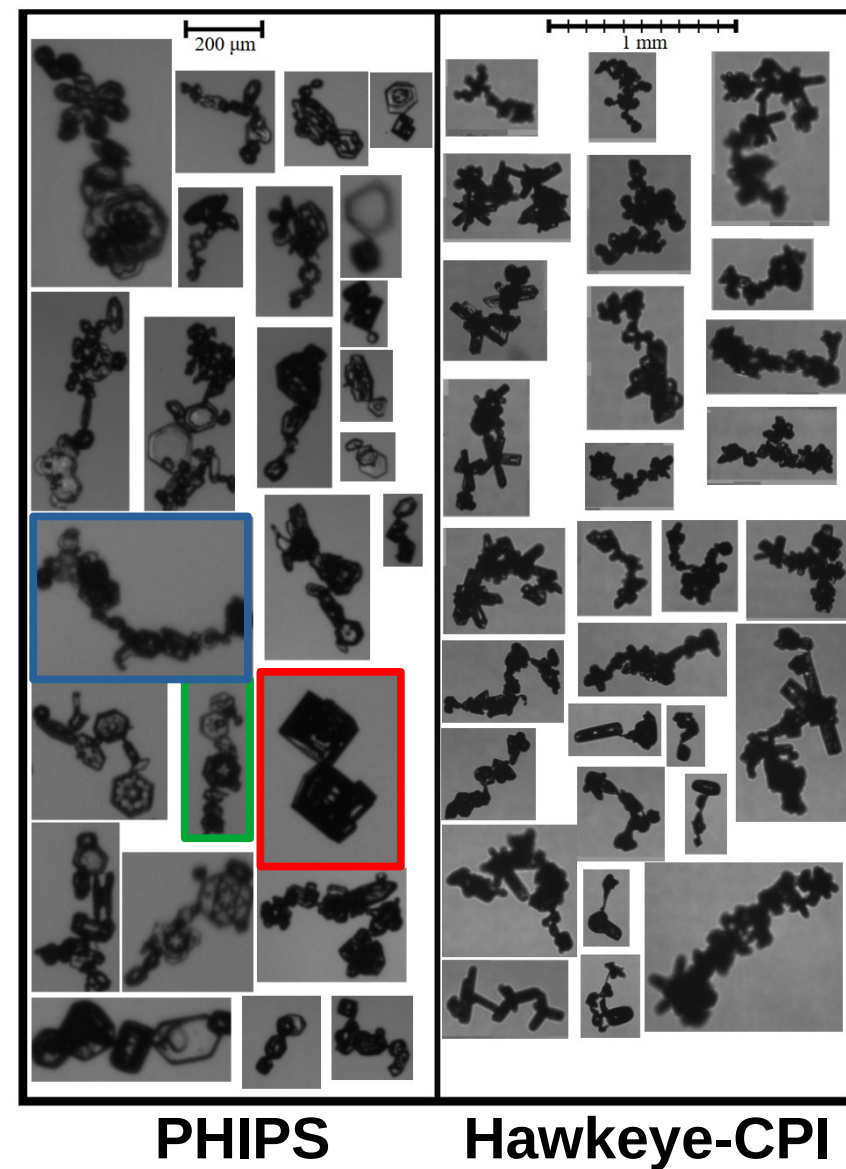


David Delene, Christian Nairy, Marwa Majdi, Andrew  
Detwiler, Shawn Wagner, and Youngsuk Oh

Busan IAMAS-IACS-IAPSO Joint Assembly 2025 (BACO-25), M04, C101-C102,  
July 22/23 - Cloud-Precipitation-Aerosol Studies Symposium, 14:45-1500 Tuesday  
22 July 2025 in Convention Hall 1F, C101 – 102, Busan, Republic of Korea

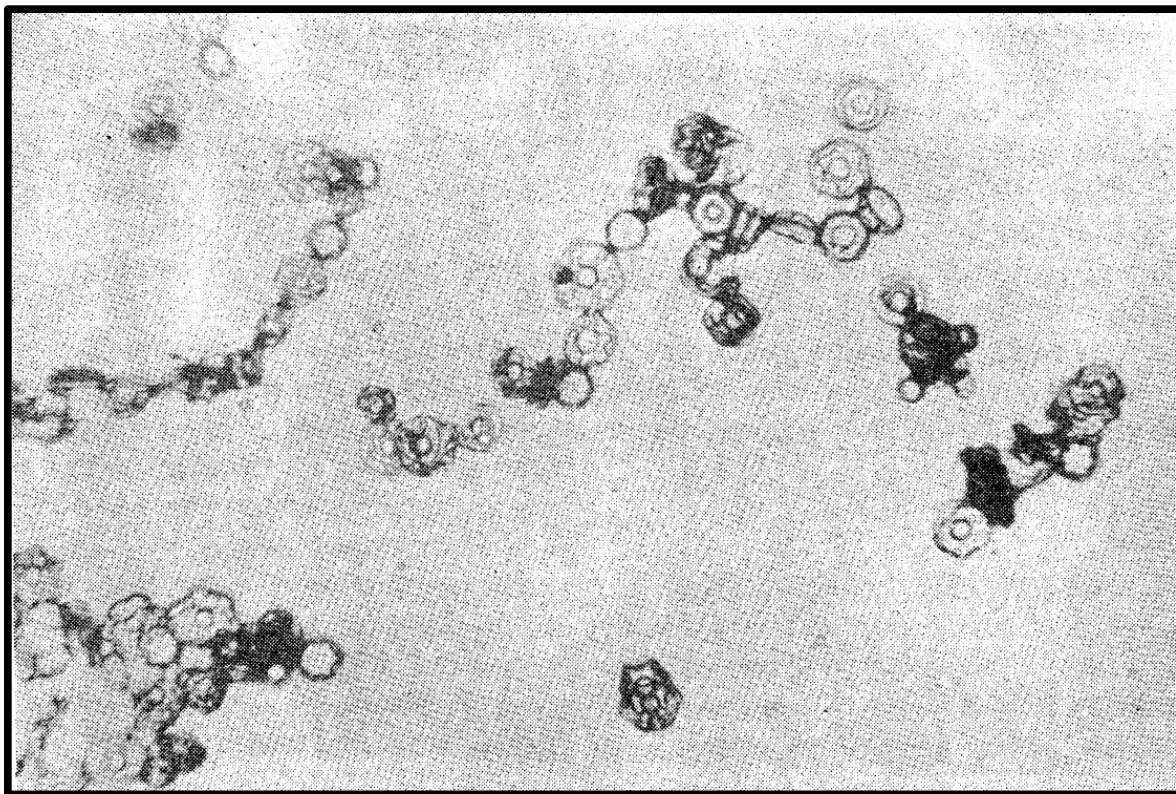
# Motivation for Research

- Cloud aggregation is a fundamental process important for precipitation.
- Chain aggregates are **long**, **linear** aggregates that are made of **similar sized** monomers crystals.
- Not well understood.
  - Where and How? Importance of electrical forces?
  - Inconsistencies exists between cloud chamber experiments and aircraft observations.



# Laboratory Observations of Chain Aggregates

- In High Electric Fields
- Ice Crystal Concentrations Between  $3$  and  $4 \times 10^6 \text{ m}^{-3}$
- Chain aggregation seems to require a minimum field.
  - $60 \text{ kV m}^{-1}$
- Chain aggregation found to be temperature dependent.
  - Maximum efficiency found at  $\sim -8^\circ \text{C}$



Chain Aggregates on form var slides that were generated in a cloud chamber. Adapted from Saunders and Wahab, 1975.

# Observational Research Objectives

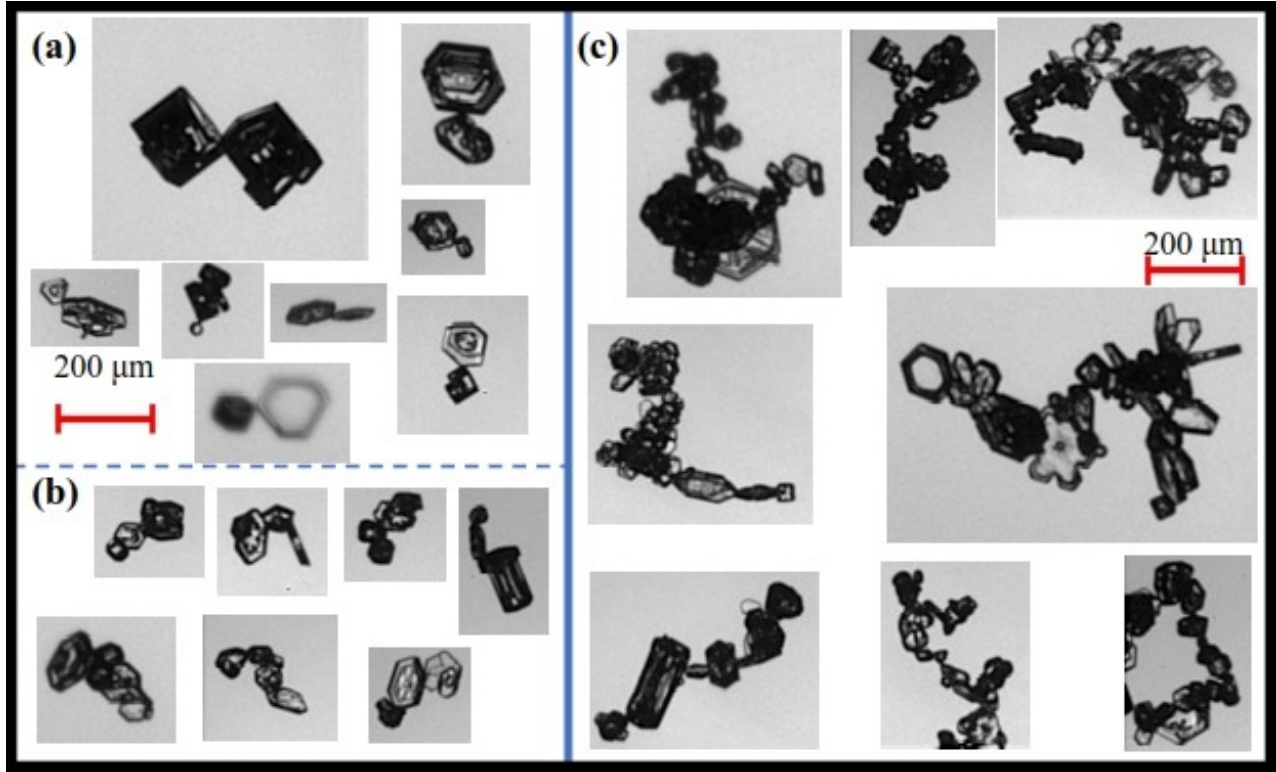
- Understand the context of where and when chain aggregates are observed in terms of the time evolution of cloud systems to provide information related to possible formation processes.
- Machine Learning methods are a critical tool for identifying the millions of aggregate images obtained during a single research flight.
- Place chain aggregate observations into context with other measurements and relate them to the storm's life cycle.





# Aircraft Observations of Chain Aggregates

- PHIPS images of chain aggregates (a and b) comprised of ice crystals found in Florida cirrus anvil clouds produced by summertime convection observed during the CapeEx19 field campaign.
- CPI images of chain aggregates (c) found near convective band associated with wintertime convection off the New England coast.



Nairy, C. M., D. J. Delene, A. G. Detwiler, J. M. Schmidt, P. R. Harasti, M. Schnaiter, E. Järvinen, T. D. Walker, Ice Crystal Chain Aggregates in Florida Cirrus Cloud Anvils – 3 August 2019 Case Study. *Journal of Geophysical Research: Atmospheres*. In Review, 2025.

Nairy, Christian M., David J. Delene, Joseph A. Finlon, John E. Yorks, Emma Järvinen, Martin Schnaiter, Andrew J. Heymsfield, Andrew G. Detwiler, Lynn A. McMurdie, Unveiling In-situ Observations of Ice Crystal Chain Aggregates in Winter Storms. *Journal of Geophysical Research Letter*, In Review, 2025`

# CapeEx19 Dataset and Instrumentation

## 12 Flights

2019/7/22

2019/7/24

2019/7/25

2019/7/26

2019/7/29

2019/7/30

2019/7/31

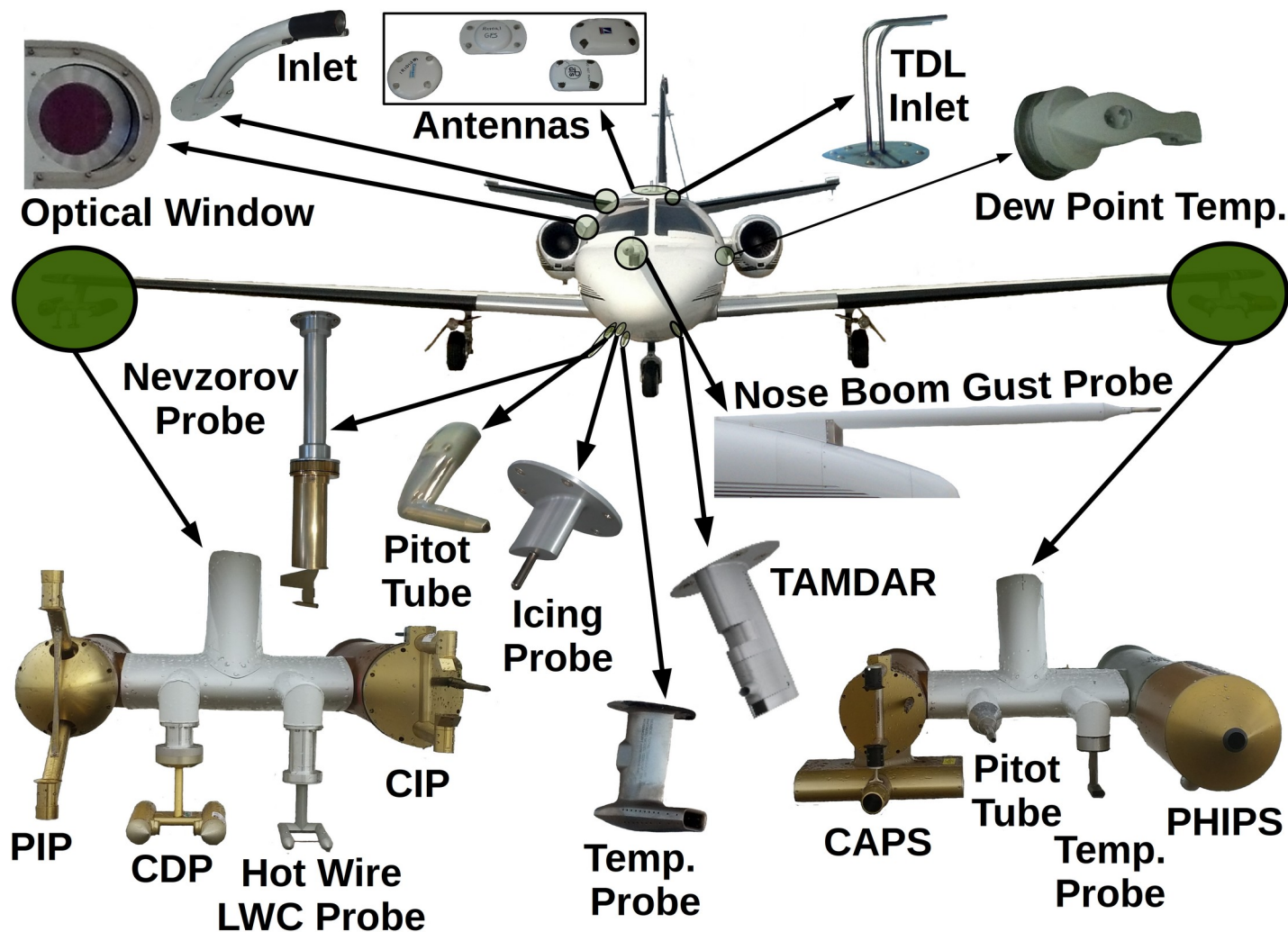
2019/8/01

2019/8/2a

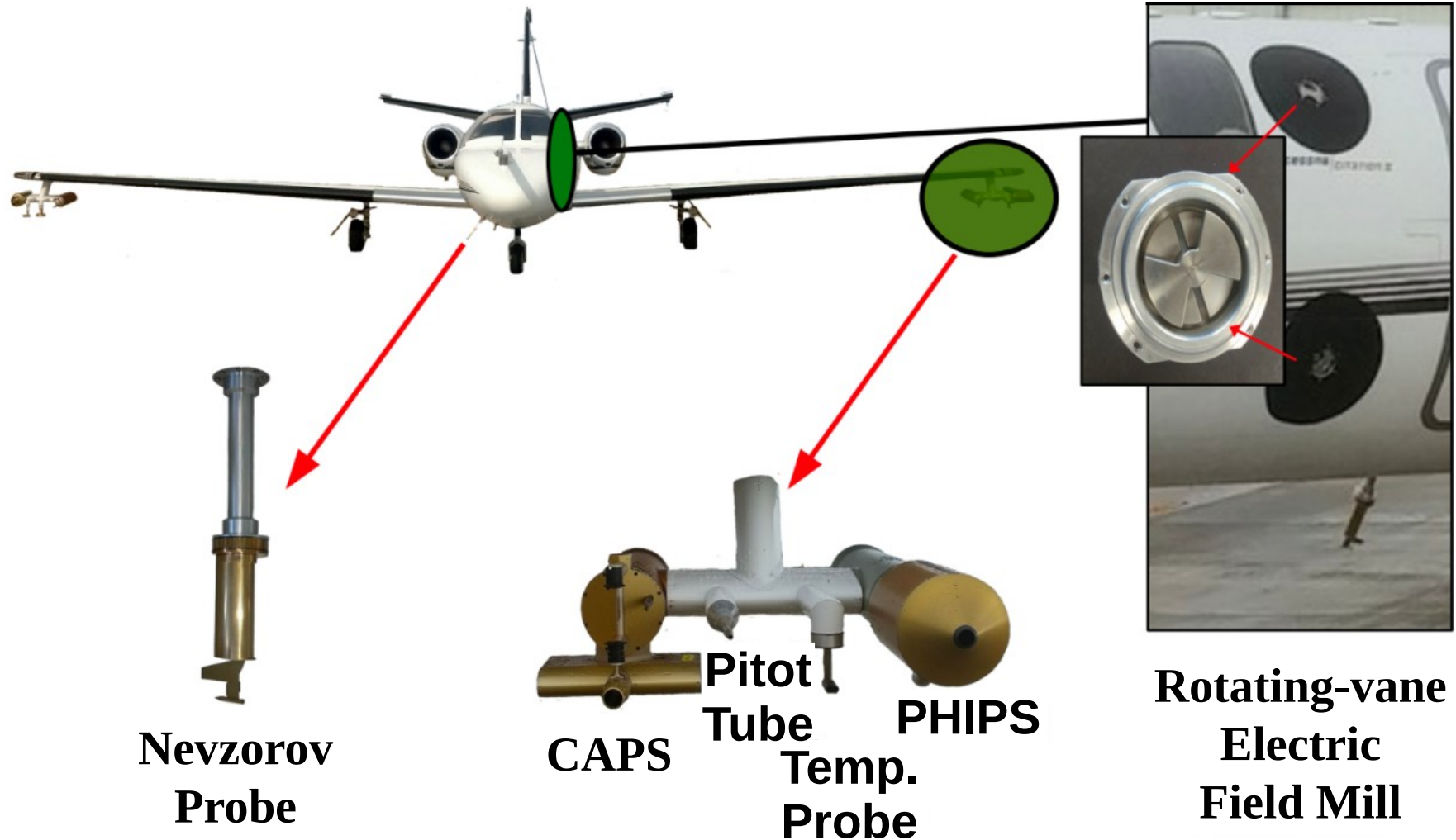
2019/8/2b

2019/8/3a

2019/8/3b

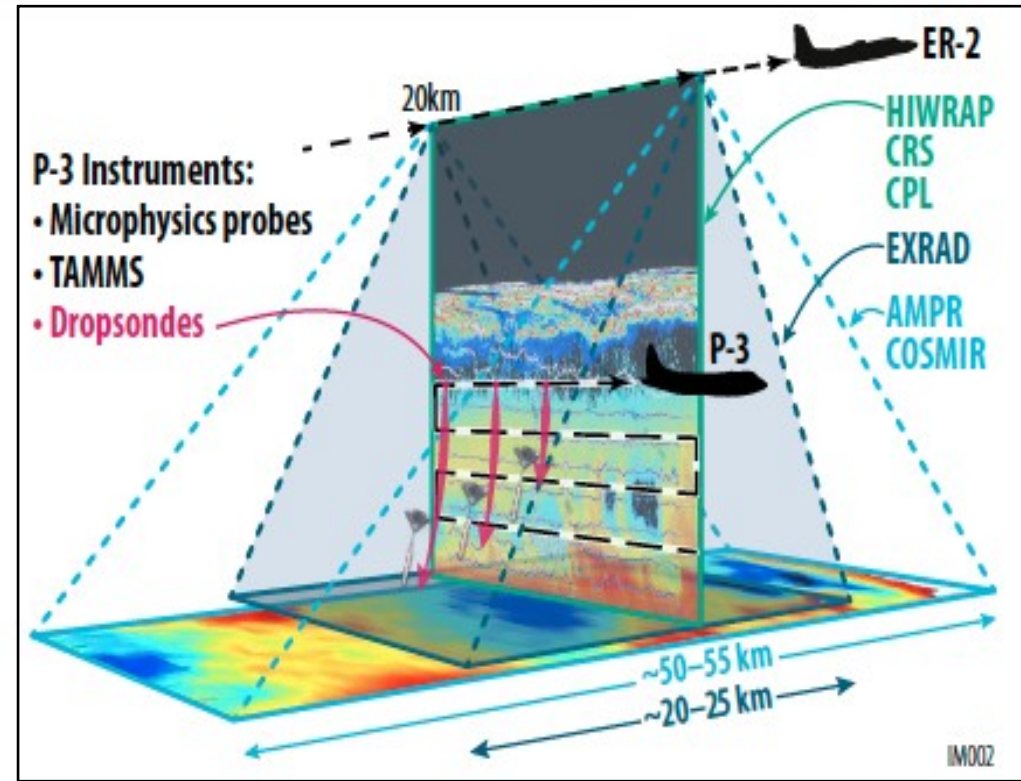
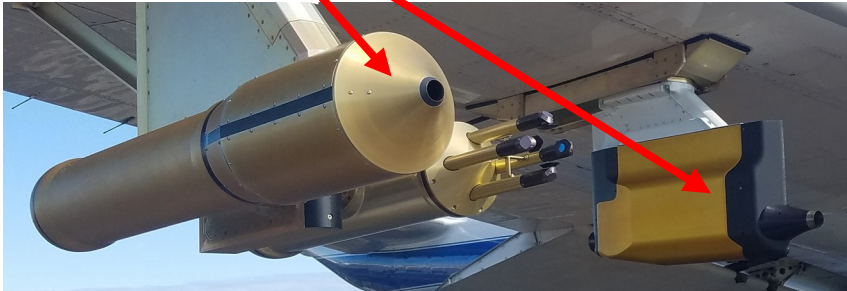
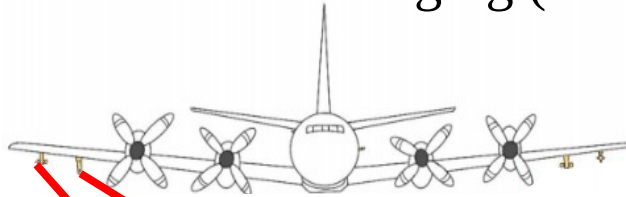


# CapeEx19 Unique Measurements



# IMPACTS Field Project and Instrumentation

- Investigation of Microphysics and Precipitation for Atlantic Coast-Threatening Snowstorms (IMPACTS).
- NASA P-3 Orion Research Aircraft
  - Particle Habit Imaging and Polar Scattering probe (PHIPS)
  - Hawkeye-Cloud Particle Imaging (CPI)



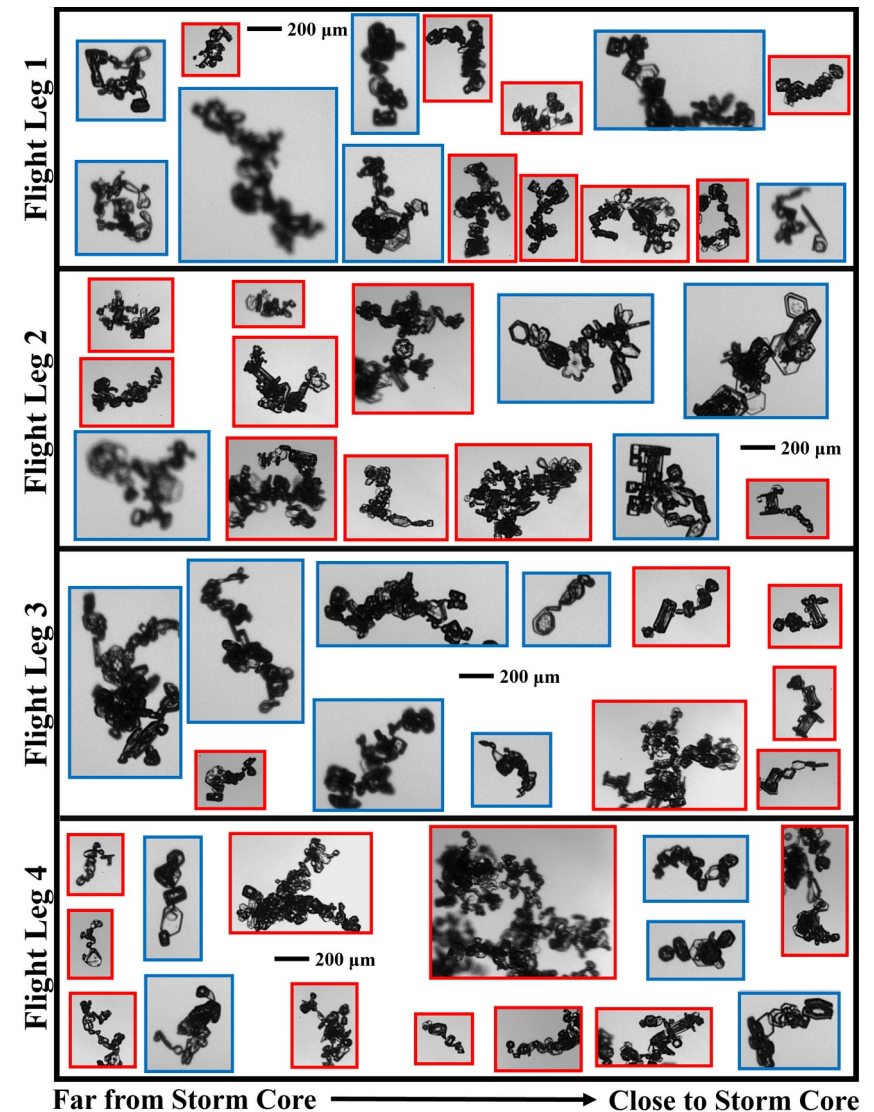
Adapted from the NASA IMPACTS executive summary (<https://espo.nasa.gov/impacts/>).





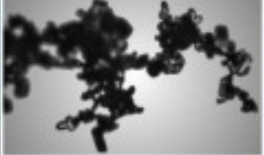

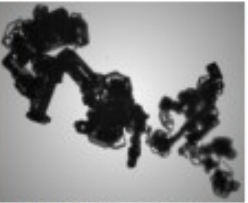













# CapeEx19

## Chain Aggregates

- Illustration showing representative chain aggregate images observed during the CapeEx19 field campaign grouped by Flight Leg obtained while sampling anvil cirrus clouds.
- The flight legs are at 10 km AGL from 2019/08/03a research flight, and images are group from far way from the convective storm core to close to the convective storm core.



# IMPACTS Representative Chain Aggregates

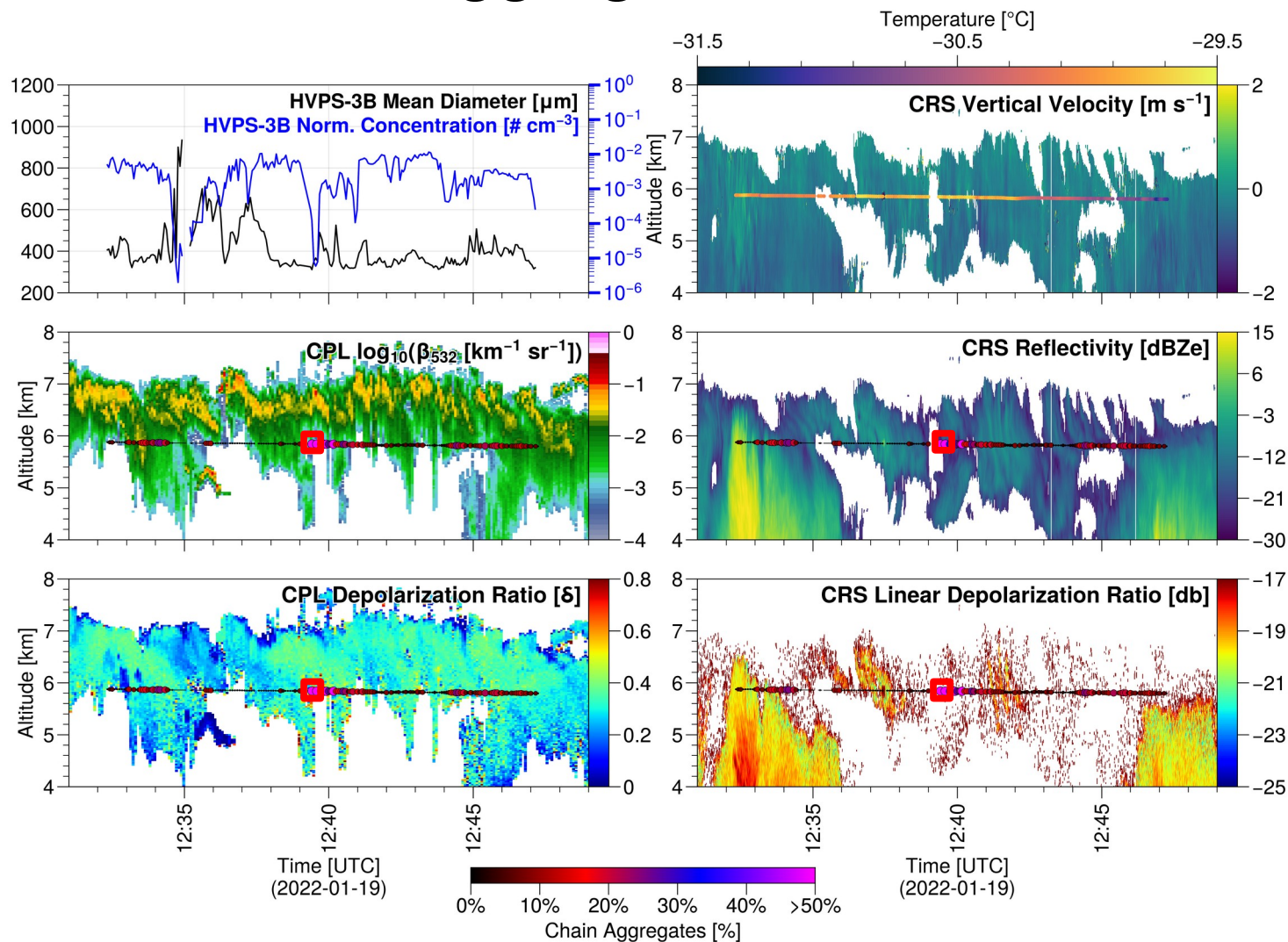
CPI	2023	 20230212_151332 	 20230115_171815	 20230215_001544	 20230115_160716	 20230129_142114
	2022	 20220203_193917	 20220204_145507	 20220129_233349	 20220217_183524 	 20220117_171454
	2020	 20200213_080411	 20200201_140644	 20200125_203325	 20200220_211516	 20200206_003248 
		> -10 °C	-10 to -15 °C	-15 to -20 °C	-20 to -25 °C	< -25 °C

Representative chain aggregate images observed during IMPACTS grouped by temperature and deployment year.

# Contextualization of Chain Aggregate Observations

The colocated in-situ and remote sensing observations obtained by the NASA P-3 and ER-2 on 19 January 2022.

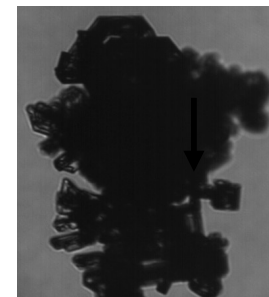
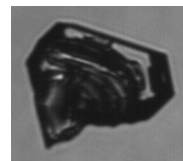
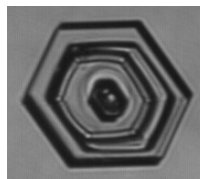
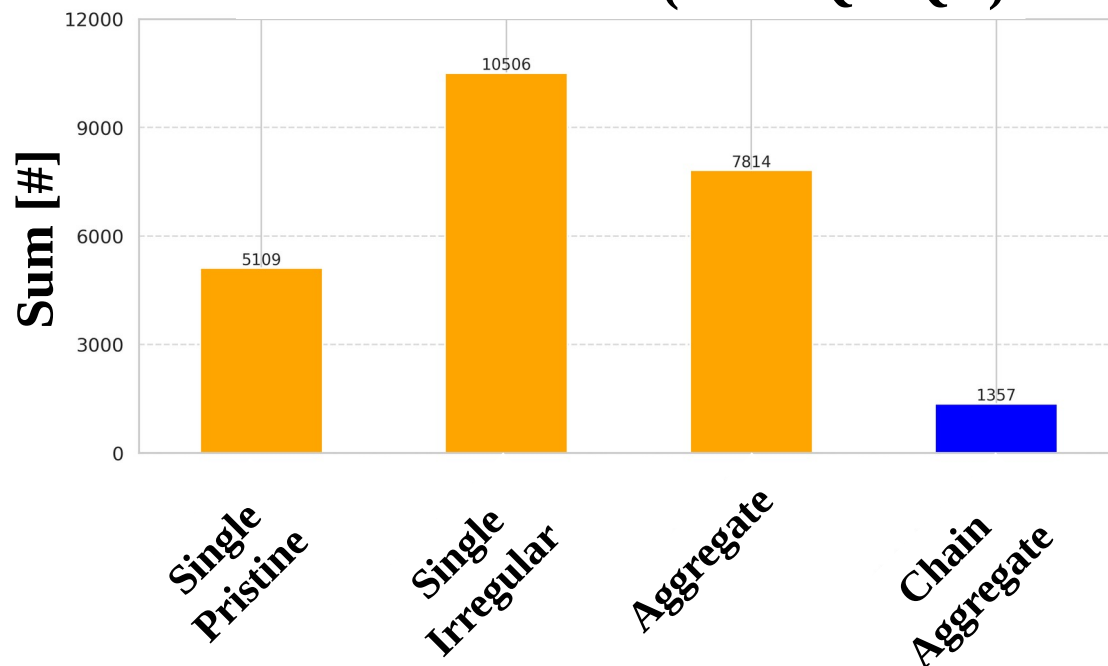
The **Red Box** highlights an area of high chain aggregates percentage.



# Crystal Habit Classifications

- 5 Flight Segments Classified:
- *Total Time Coverage:*  
1hr 40m 49s
- *Temperature Range:*  
-36 to -5 °C
- Total # of Particles Classified (after QA/QC):  
24,786
- # of Chain Aggregates Classified (after QA/QC):  
1,357

**Dominant Habits (After QA/QC)**

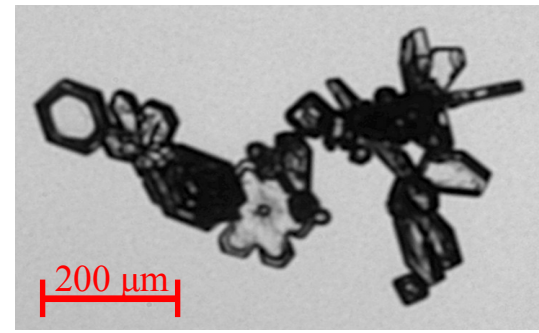


**\*NOT TO SCALE\***



# Conclusions

- First high-resolution observations of ice crystal chain aggregates in winter storms.
- Chain aggregates observed in winter storms show similar characteristics to chain aggregates observed in upper-level clouds associated with summertime convective storms.
- Formation process are uncertain, which can be improved with the localization of chain aggregates in relationship to in-cloud electric field and remote sensing measurements.



# Publications, References, and Acknowledgments

- Majdi, Marwa, Christian Nairy, and David Delene, Classification of Ice crystal Images from In-situ, High-resolution Cloud Probes using a Convolutional Neural Network, Poster presentation given at Fall 2024 AGU Annual Meeting in Washington, D.C.
- Nairy, Christian, David J. Delene, Joseph Finlon, John E. Yorks, K. Lee Thornhill, Applying and Evaluating Random Forest Classification to Identify Ice Crystal Chain Aggregates During the IMPACTS Field Campaign, Talk presentation given on Wednesday 15 January 2025 at 8:45-9:00 AM in Room 224 at American Meteorological Society's Second Symposium on Cloud Physics at the 105th AMS Annual Meeting, from January 12 - 16, 2025 in New Orleans, LA.
- Nairy, C. M. (2022). Observations of Chain Aggregates in Florida Cirrus Cloud Anvils on 3 August 2019 during CAPEEX19 (Master's thesis), Dept. of Atmospheric Sciences, University of North Dakota, Grand Forks, North Dakota. Retrieved from <https://commons.und.edu/theses/4363/>
- Osmani, Imteaz, Victor Ojo, Lance Roadifer, Christian Nairy, Aaron Kennedy, David Delene, Hallie Chelmo, Siddharth Bhatnagar, Yidi Gao, Joseph J. Lavalley, Matthieu Shelby, Eleanor C. Hostetler, Matthew S. Leight and Joseph S. Jewell, 2025: Investigating Atmospheric Ice Crystal Formation and Their Impacts on Hypersonic Vehicles, Novel and Emerging Applications in Ground Testing, American Institute of Aeronautics and Astronautics (AIAA), DOI: 10.2514/6.2025-1328.
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- Schmitt, C. G., and A. J. Heymsfield (2014), Observational quantification of the separation of simple and complex atmospheric ice particles, *Geophys. Res. Lett.*, 41, 1301–1307, doi:10.1002/2013GL058781.
- Stith, J. L., Avallone, L. M., Bansemer, A., Basarab, B., Dorsi, S. W., Fuchs, B., et al. (2014). Ice particles in the upper anvil regions of midlatitude continental thunderstorms: the case for frozen-drop aggregates. *Atmospheric Chemistry and Physics*, 14(4), 1973–1985. <https://doi.org/10.5194/acp-14-1973-2014>

This research was supported by a NASA research grant to the University of North Dakota. Grant #: 80NSSC19K0328. The IMPACTS dataset is publicly available at the NASA GHRC <http://dx.doi.org/10.5067/IMPACTS/DATA101>. We would also like to thank Andrew Heymsfield, Stephen Nicholls, Mircea Grecu, Andrew Detwiler, & Patrick Britt for their added expertise in this work.

# Forth Coming Publications

*Nairy, C. M., D. J. Delene, A. G. Detwiler, J. M. Schmidt, P. R. Harasti, M. Schnaiter, E. Järvinen, T. D. Walker, Ice Crystal Chain Aggregates in Florida Cirrus Cloud Anvils - 3 August 2019 Case Study. Journal of Geophysical Research: Atmospheres. In Review, 2025.*

*Nairy, Christian M., David J. Delene, Joseph A. Finlon, John E. Yorks, Emma Järvinen, Martin Schnaiter, Andrew J. Heymsfield, Andrew G. Detwiler, Lynn A. McMurdie, Unveiling In-situ Observations of Ice Crystal Chain Aggregates in Winter Storms. Journal of Geophysical Research Letter, In Review, 2025*

## Future Work (NASA Grant 80NSSC25K7971)

- Apply Machine Learning (XGBoost, Random Forest, Convolutional Neural Network) across all research flights conducted during the IMPACTS field campaign.
- Contextualize chain aggregates within storm life-cycles for improved understanding in the chain aggregation process.