Moody's R

An Overview of RMS' Flood Event Response and Forecasting

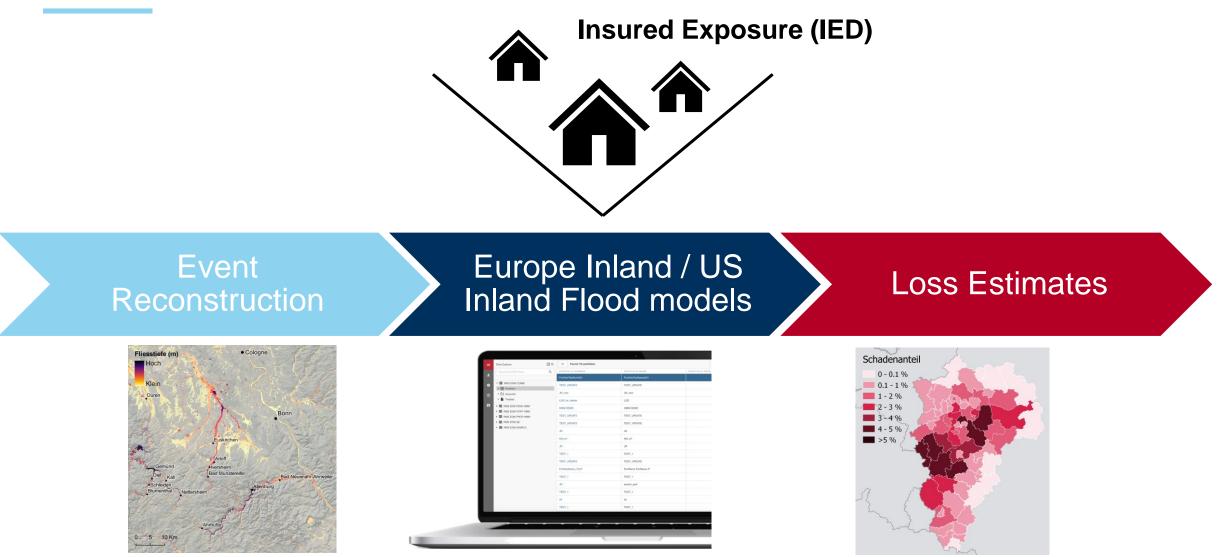
Jose Salinas

24th April 2023 – Vienna, Austria European Geosciences Union General Assembly

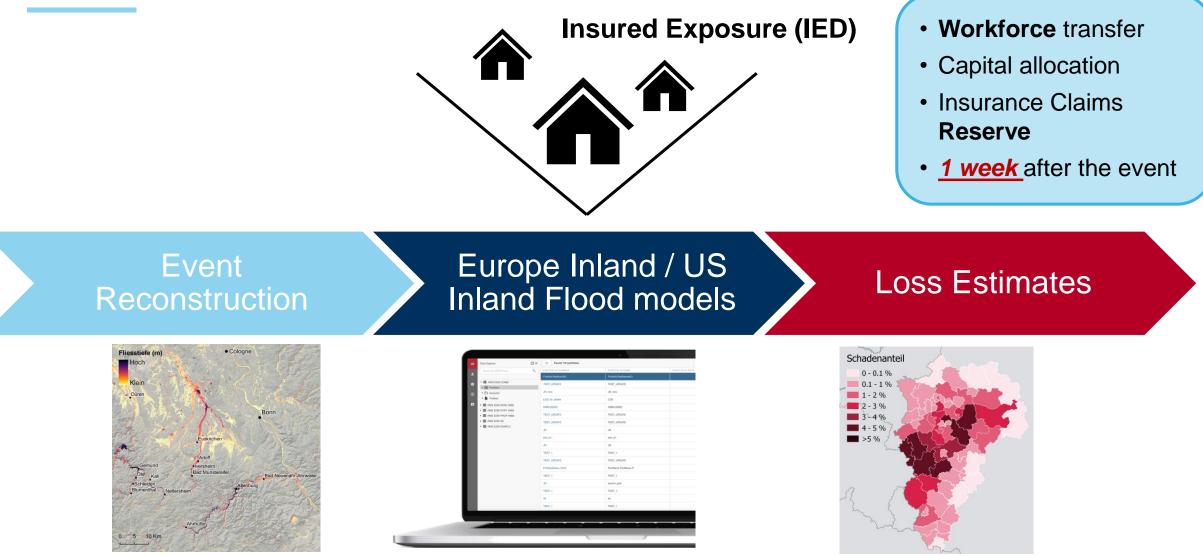


Event Response Workflow

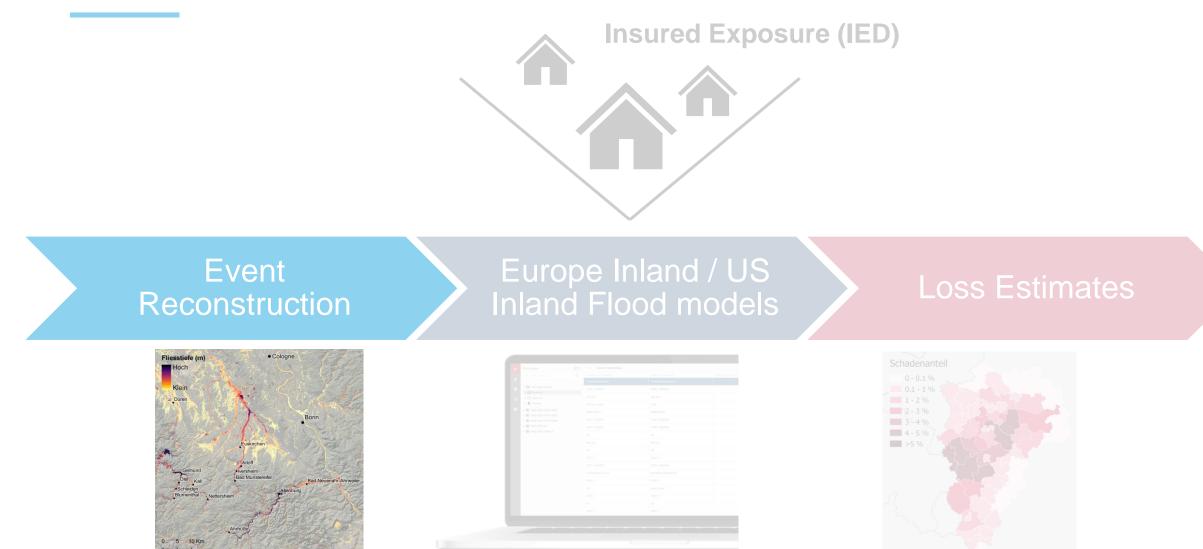
From Event to Industry Loss Estimate



From Event to Industry Loss Estimate



From Event to Industry Loss Estimate



Timelines of RMS Event Response



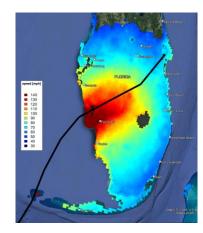


TC track and Precipitation Forecasts

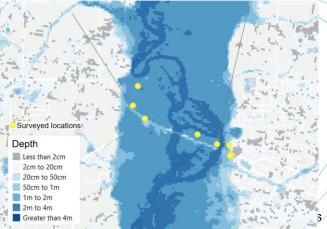
Landfall Information

Quasi Real-Time highresolution precipitation

Footprint Reconstruction & Validation







Timelines of RMS Event Response





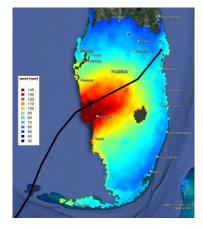
TC track and Precipitation Forecasts

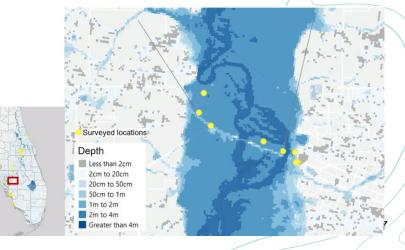
Landfall Information

Quasi Real-Time highresolution precipitation

Footprint Reconstruction & Validation

- NCEP precip forecast
- ~ 5-7 days before forecasted landfall
- Re-run the model with new forecast every 24hr





Timelines of RMS Event Response



- First gage observations
- CPC rainfall
 data
- MRMS rainfall data



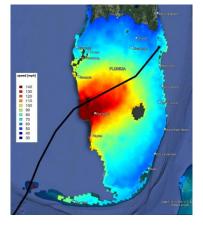
TC track and Precipitation Forecasts

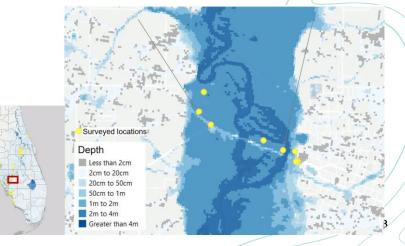
Landfall Information

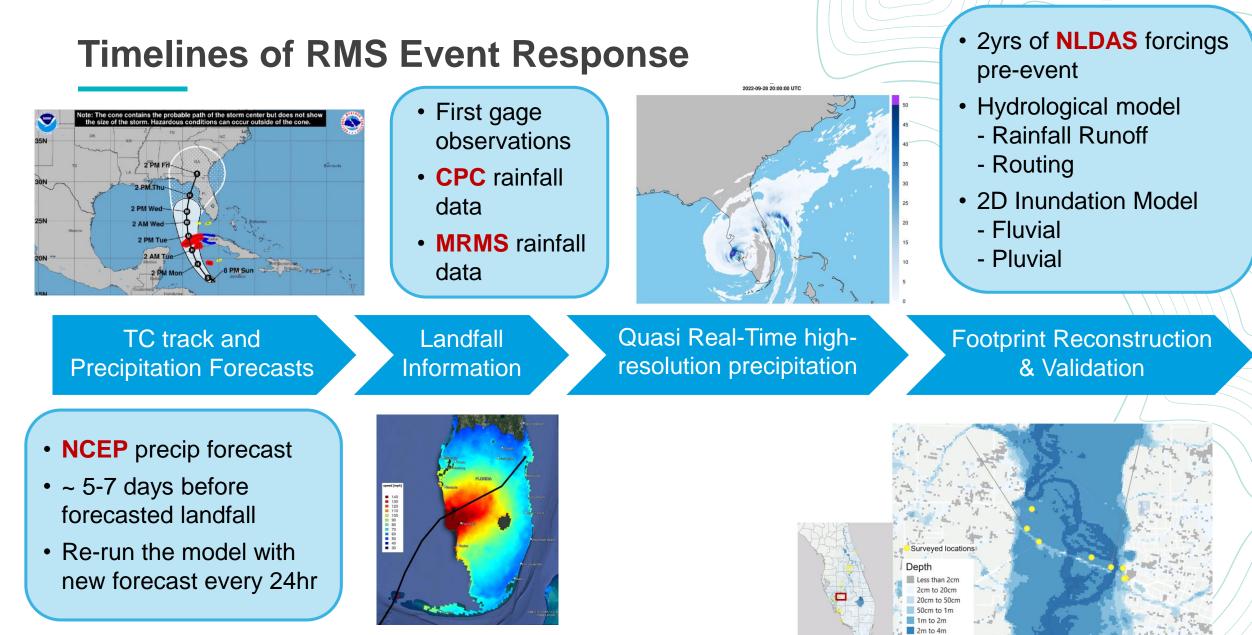
Quasi Real-Time highresolution precipitation

Footprint Reconstruction & Validation

- NCEP precip forecast
- ~ 5-7 days before forecasted landfall
- Re-run the model with new forecast every 24hr







Hurricane Ian – September 2022

Wind Hazard (peak 3-sec gust) Return Period

RMS Best Footprint

Hazard and Loss Return Periods

Wind Hazard

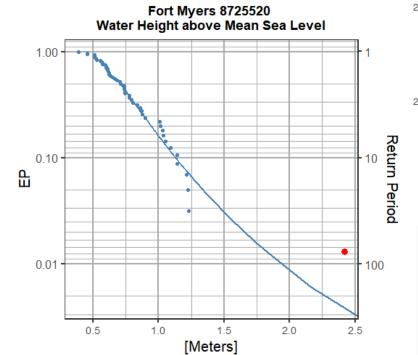
- 100+ year RP from Venice to south of Cape Coral
- 1000+ year RP around Port Charlotte

Storm Surge Hazard

- 100+ year RP for Key West
- 200+ years for Naples and Fort Myers

Inland Flood

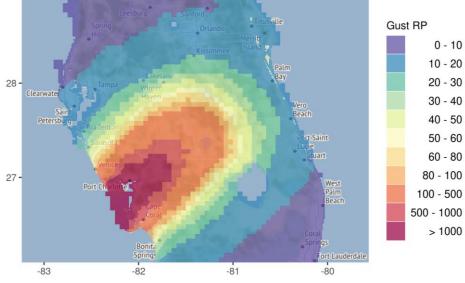
 1000+ return period rainfall totals in DeSoto County

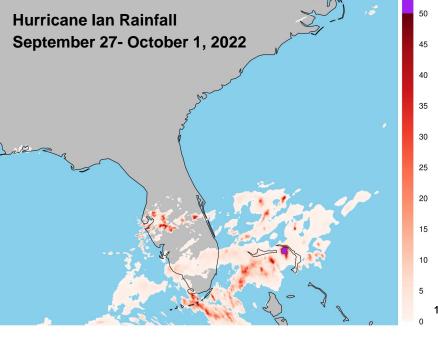


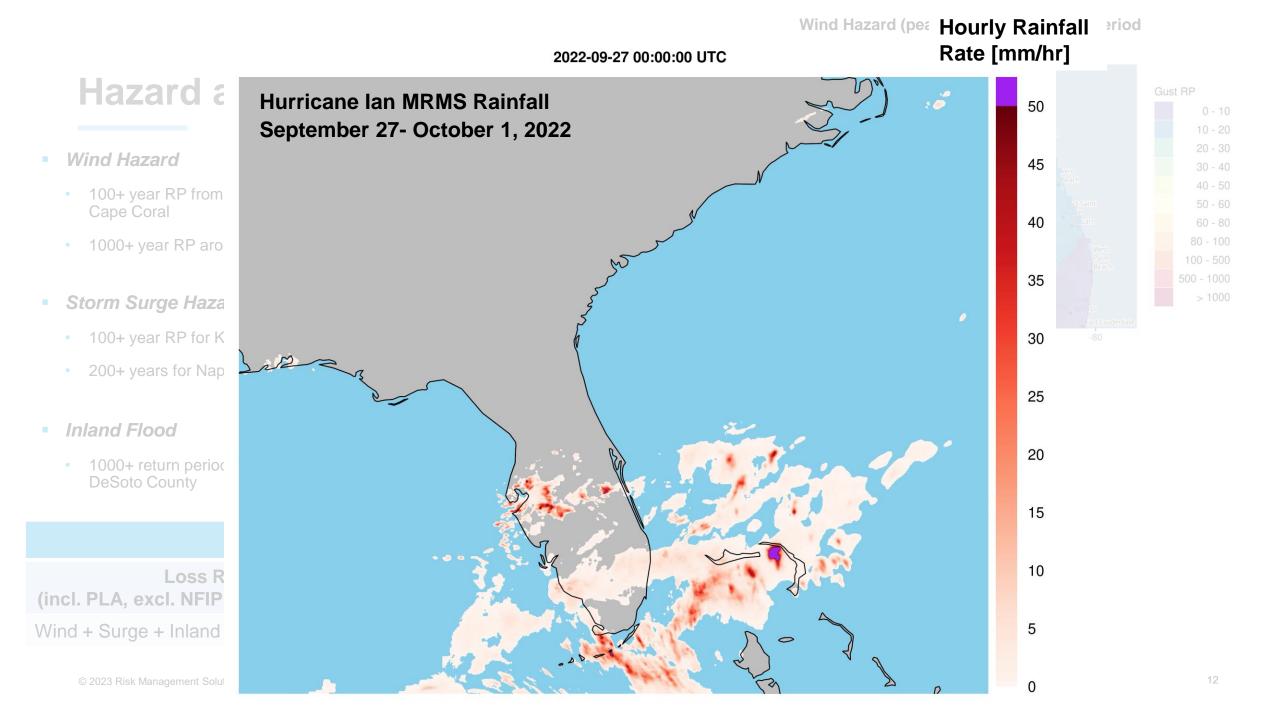
Loss	All U.S.	Florida Only
Loss Return Period (incl. PLA, excl. NFIP and Non-Modeled Factors)	OEP RP (All Lines)	OEP RP (All Lines)
Wind + Surge + Inland Flood	10-15 years	15-30 years

© 2023 Risk Management Solutions, Inc. and/or its affiliates and licensors ("Moody's RMS"). All rights reserved.

Sources: RMS

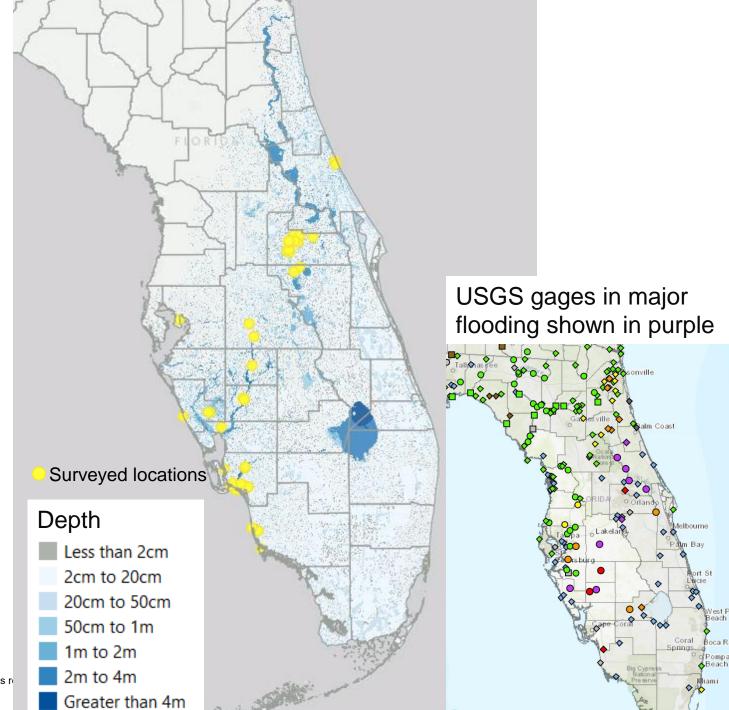






Inland Flood Validation

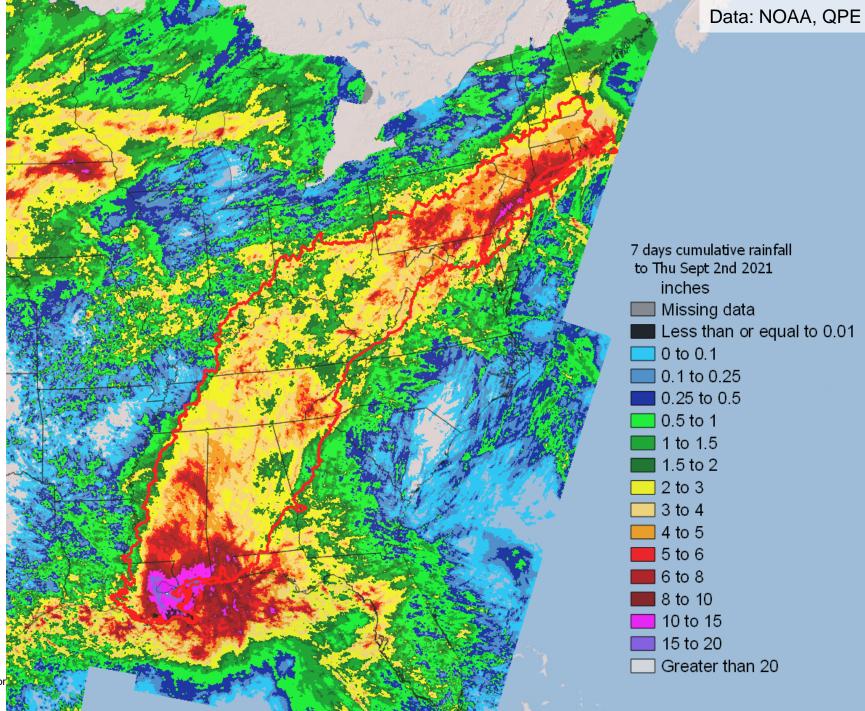
- RMS surveyed a number of points for evidence of inland flooding
- Survey methods included geolocated news reports and field survey
- High resolution MRMS Radar Rainfall showed the best modelled results when compared to observations
- Both CPC (quasi-real time) and NCEP forecasts strongly underestimated the flood extent and flood depths.



Hurricane Ida – August 2021

Ida Rainfall Pattern

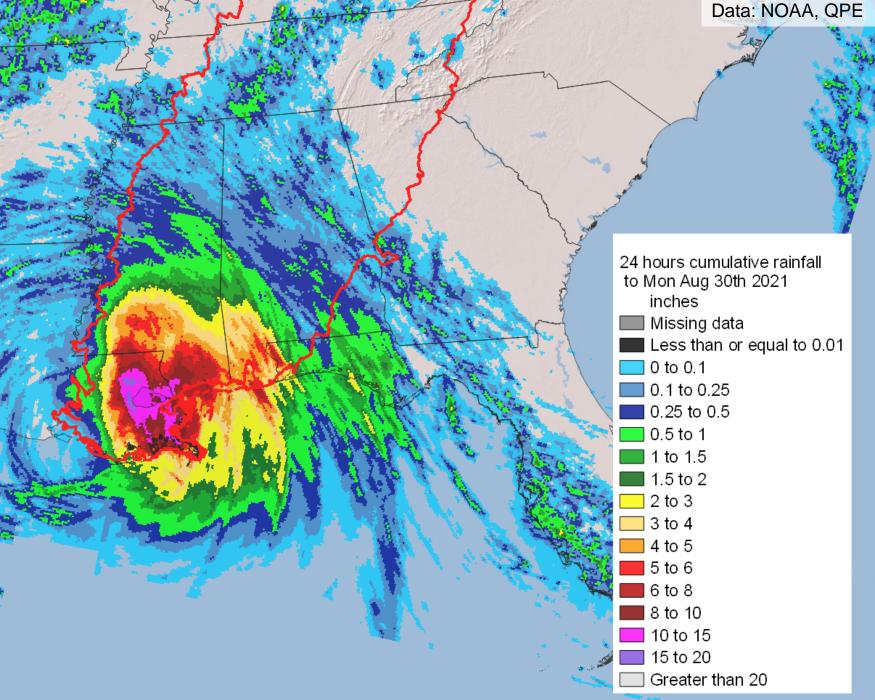
- Extreme precipitation in landfall area
- Concentrated between 29th and 30th of August
- Storm moved north producing rainfall extremes along its path
- On September 1st unprecedented rainfall extremes over Mid-Atlantic and Northeast regions



© 2023 Risk Management Solutions, Inc. and/or its affiliates and licensor

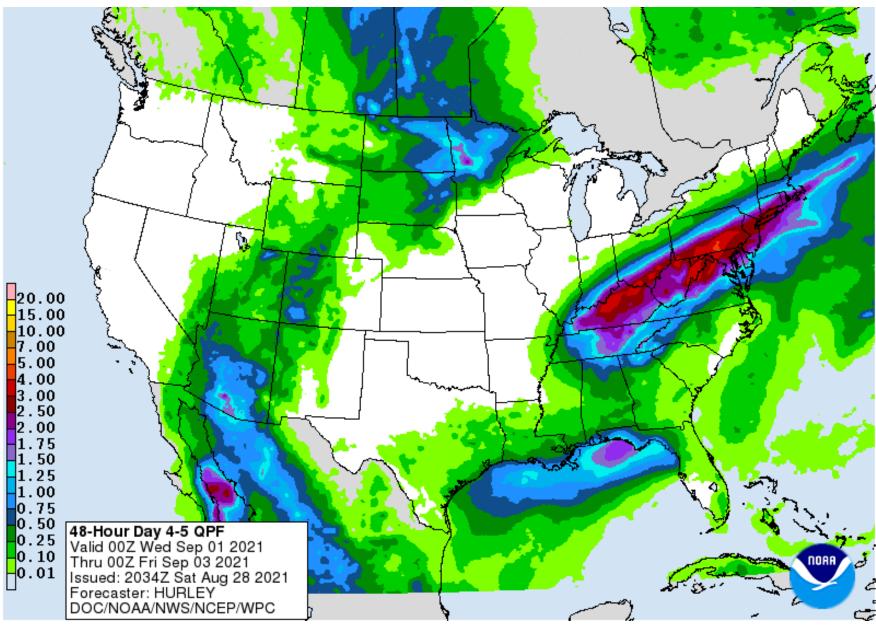
Landfall Area

- Extreme rainfall accumulation
- 9" rain registered at Lake Maurepas USGS gauge on Aug 29
- Evacuation and preparedness for the storm arrival
- NLDAS, CPC, and MRMS were very similar in magnitude for Louisiana



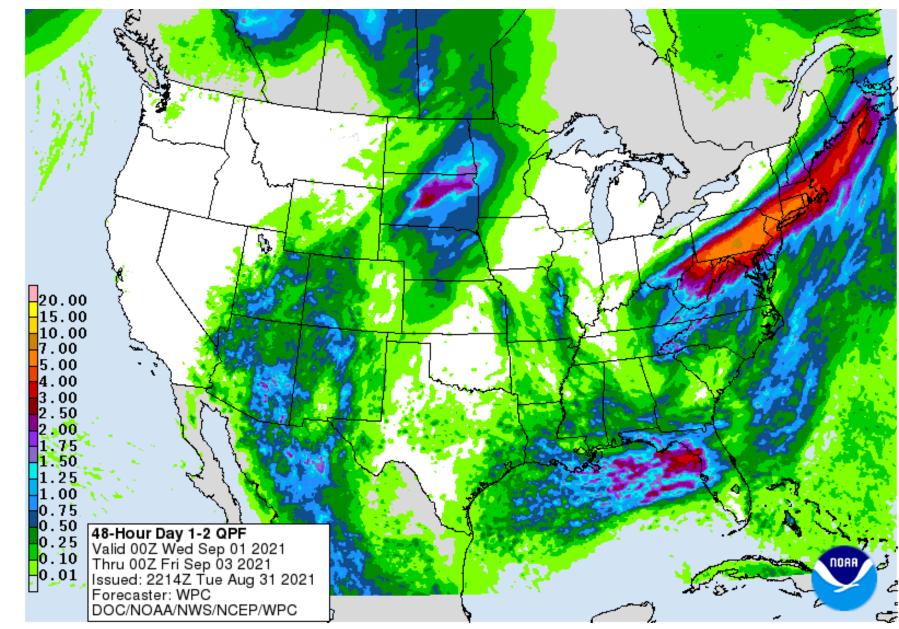
Rainfall Forecast

- Issued on 29th of August
- It started to become clear that the rainfall front would affect Northeast U.S.
- Forecast high rainfall over PA, 2-day totals of up to 5"



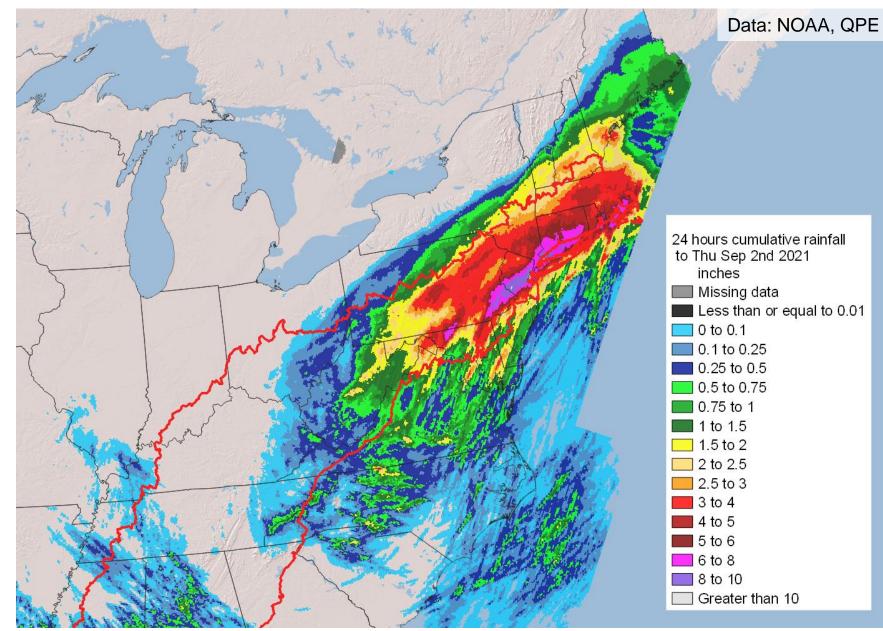
Forecast Evolution

- 2 days later
- Forecast issued 31st of Aug
- Up to 5-7" of rainfall
- Also affecting NJ, NY, CT



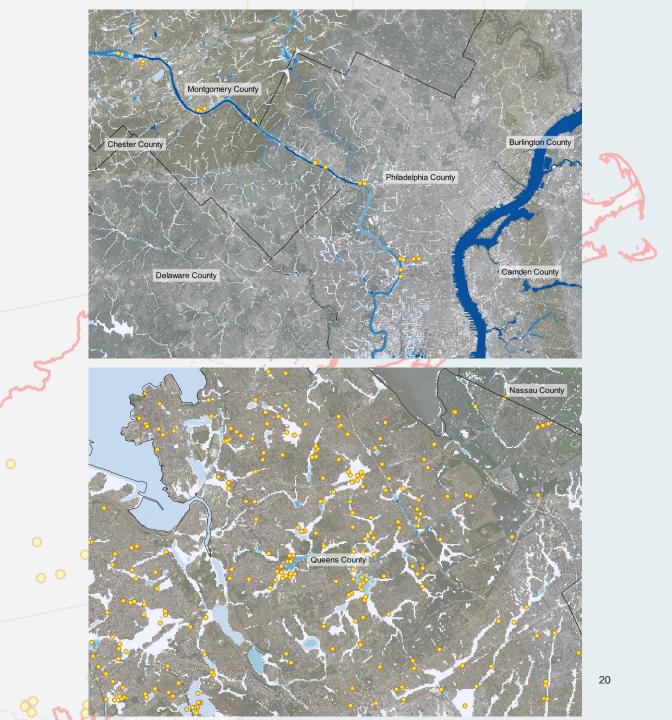
Then it started raining...

- Actual rainfall amounts largely exceeded NCEP forecasts
- Record-breaking rainfall over NJ, NY, PA, CT
- Several records broken for max hourly rainfall, max daily rainfall
- High resolution MRMS Radar Rainfall was much higher than CPC, NLDAS in the Northeast



Ida Flood Footprint Validation

- Flooding along Schuylkill River in Philadelphia
- Pluvial flooding in NYC
- ~70% of reported locations within 100m radius from modeled inundation in the map
- High resolution MRMS Radar Rainfall showed the best modelled results when compared to observations



Summary & Conclusions

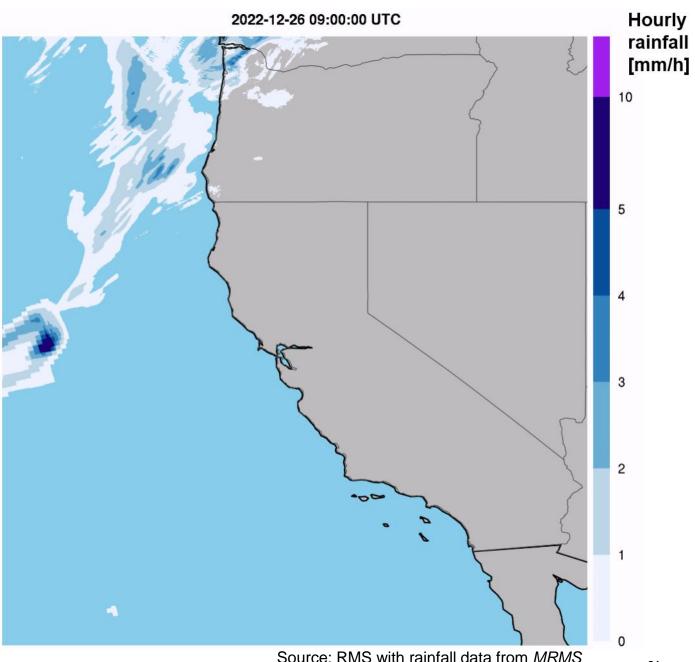
Summary and Conclusions

- Using high resolution MRMS Radar Rainfall as model input produces the best modelled results when compared to observations (flood extent and flood depths)
 - MRMS tends to resolve well very localised, short duration high intensity rainfall events
 - Relevant when the main driver of loss is pluvial flooding in urban areas (or fluvial in small catchments)
- NLDAS rainfall works well for large areal estimates but tends to underestimate short duration high intensity rainfall events
 - Best product when the main driver of loss is fluvial flooding in middle to large sized catchments
- Both CPC (quasi-real time) and NCEP forecasts strongly underestimated the flood extent and flood depths.
- Other examples in the appendix: California Atmospheric Rivers (Jan 2023), Fort Lauderdale (April 2023), Low pressure front Bernd (July 2021, Germany and Belgium)

California – Atmospheric Rivers Jan 2023

Drivers of the flood: precipitation

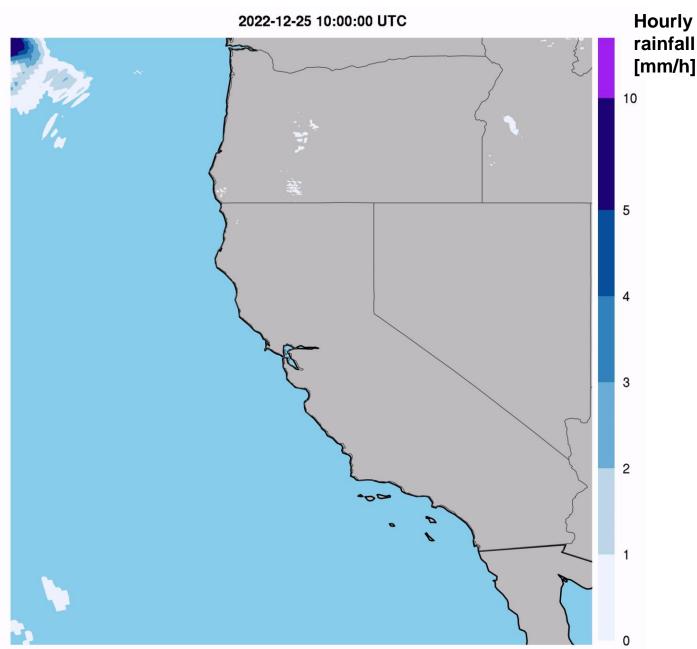
- One of the most distinguishing features of the recent California floods is the clustering pattern of ARs, from
 December 25, 2022 to January 12. The most heavily impacted areas include:
- San Francisco Bay Areas: 12+ inches in San Francisco and Oakland between Dec 26 to Jan 9
- (2) Sacramento Valley: **8+ inches** in Sacramento, and **4+ inches** in Los Angeles between Dec 26 to Jan 9,
- (3) Southern California: 16+ inches in Ventura and Santa Barbara counties.
- (4) Central California



(Multi-Radar / Multi-sensor), NOAA

Drivers of the flood: precipitation

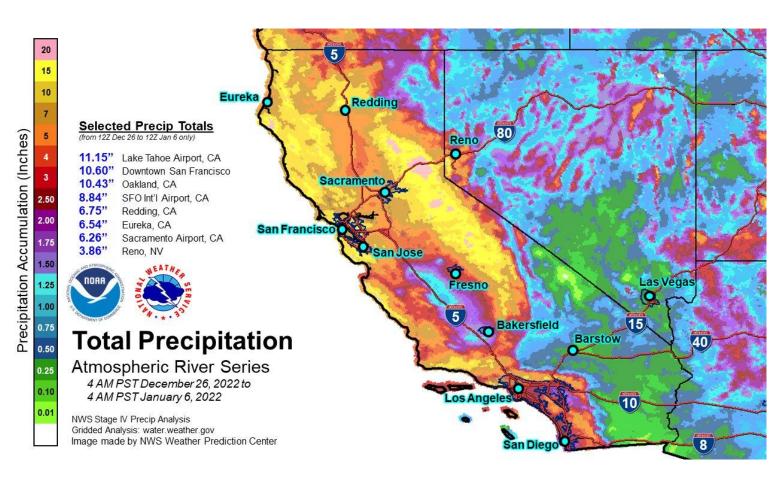
- One of the most distinguishing features of the recent California floods is the clustering pattern of ARs, from
 December 25, 2022 to January 12. The most heavily impacted areas include:
- San Francisco Bay Areas: 12+ inches in San Francisco and Oakland between Dec 26 to Jan 9
- Sacramento Valley: 8+ inches in Sacramento, and 4+ inches in Los Angeles between Dec 26 to Jan 9,
- (3) Southern California: 16+ inches in Ventura and Santa Barbara counties.
- (4) Central California



Source: RMS with rainfall data from *MRMS* (Multi-Radar / Multi-sensor), NOAA

Drivers of the flood: precipitation

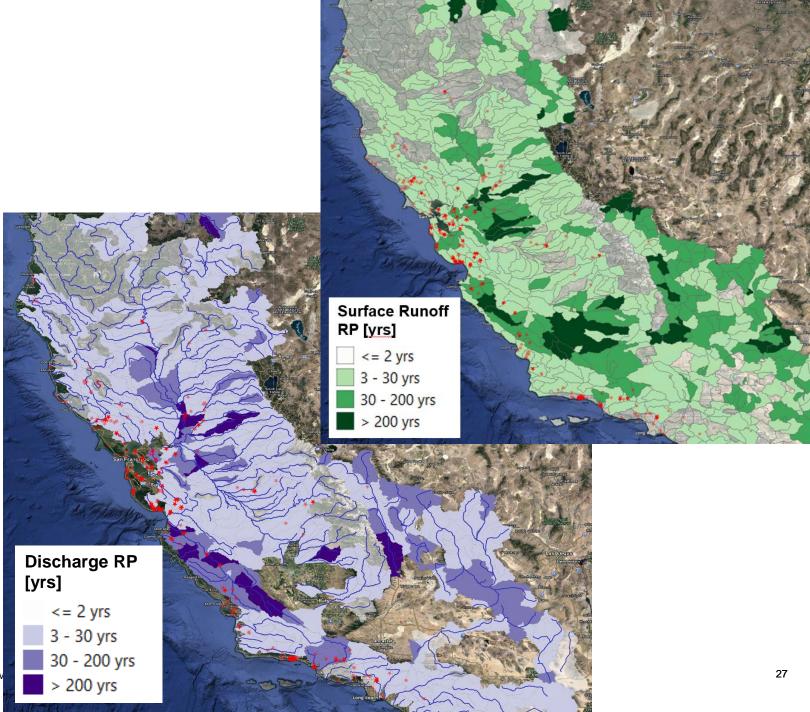
- One of the most distinguishing features of the recent California floods is the clustering pattern of ARs, from
 December 25, 2022 to January 12. The most heavily impacted areas include:
- San Francisco Bay Areas: 12+ inches in San Francisco and Oakland between Dec 26 to Jan 9
- (2) Sacramento Valley: 8+ inches in Sacramento, and 4+ inches in Los Angeles between Dec 26 to Jan 9,
- (3) Southern California: 16+ inches in Ventura and Santa Barbara counties.
- (4) Central California



Hydrology

- Hydrological response after continuous rainfall: saturated soils
- Surface Runoff generation
 - RPs between *50-100yrs* in most affected areas
 - Locally exceeding *RP* > 200yrs
- Leads to flooding of smaller streams and creeks
- Riverine flooding in large rivers
 - Only locally RPs > 30yrs
 - Salinas River / Monterrey County
 - Eastern tributaries to the Sacramento River

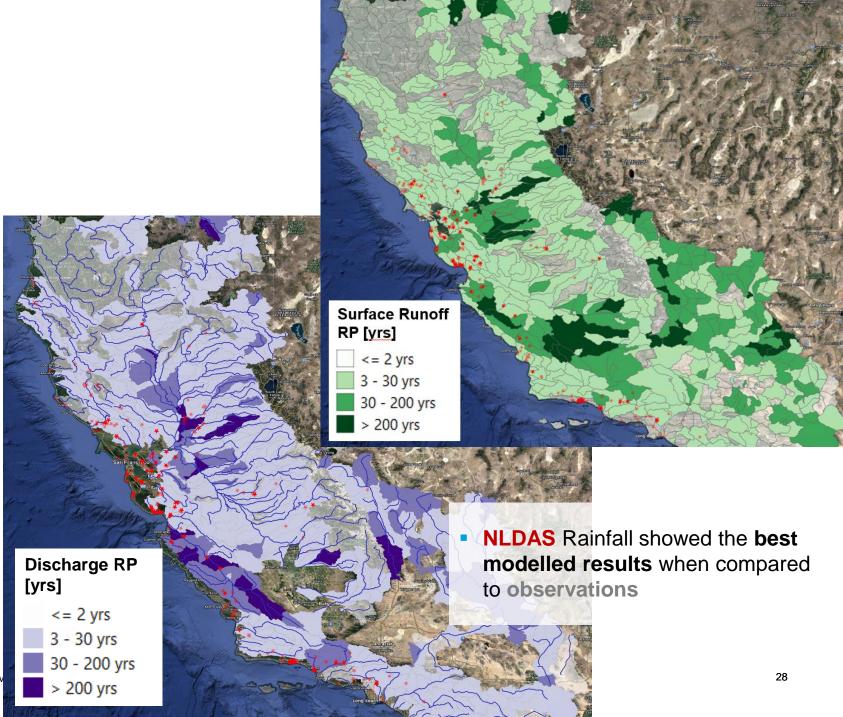
 $\ensuremath{\mathbb{C}}$ 2023 Risk Management Solutions, Inc. and/or its affiliates and licensors ("M



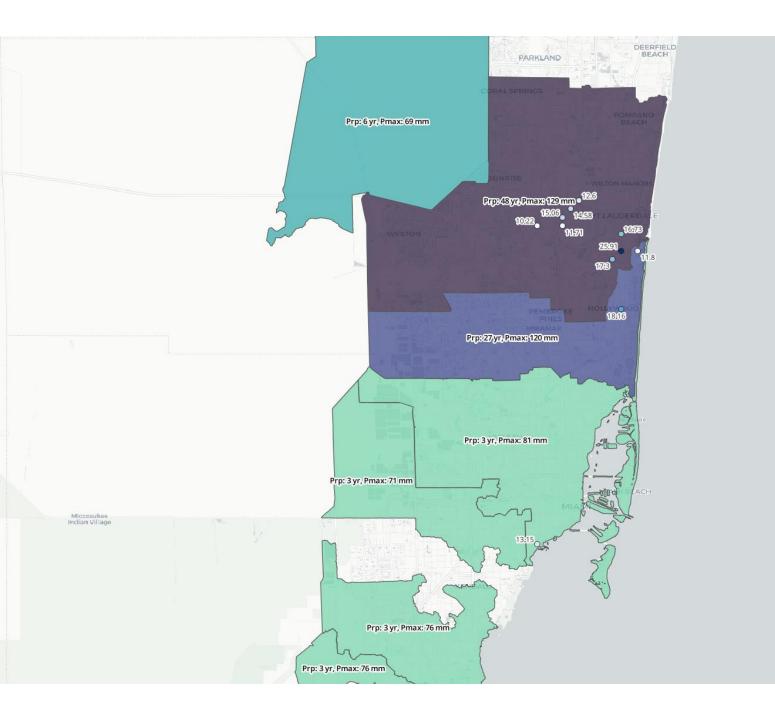
Hydrology

- Hydrological response after continuous rainfall: saturated soils
- Surface Runoff generation
 - RPs between *50-100yrs* in most affected areas
 - Locally exceeding *RP* > 200yrs
- Leads to flooding of smaller streams and creeks
- Riverine flooding in large rivers
 - Only locally RPs > 30yrs
 - Salinas River / Monterrey County
 - Eastern tributaries to the Sacramento River

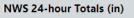
 $\ensuremath{\mathbb{C}}$ 2023 Risk Management Solutions, Inc. and/or its affiliates and licensors ("M

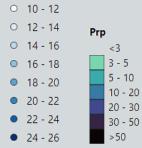


Fort Lauderdale – April 2023



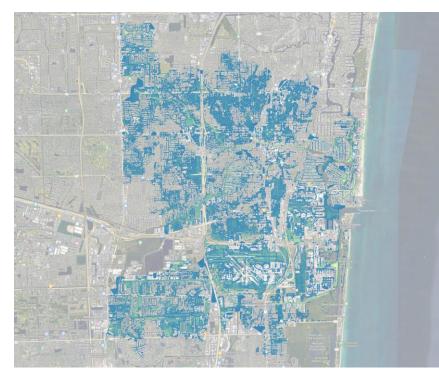
NWS Observations & Catchment P_{RP}

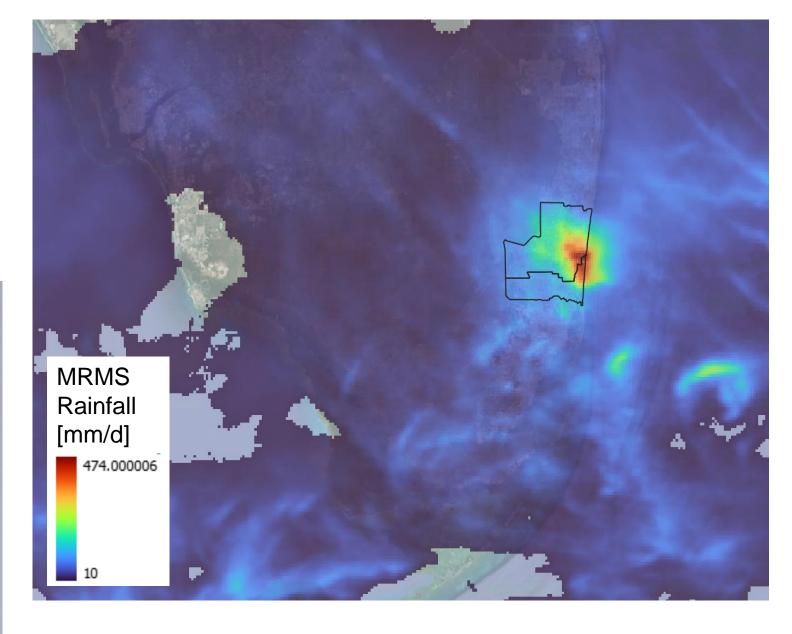


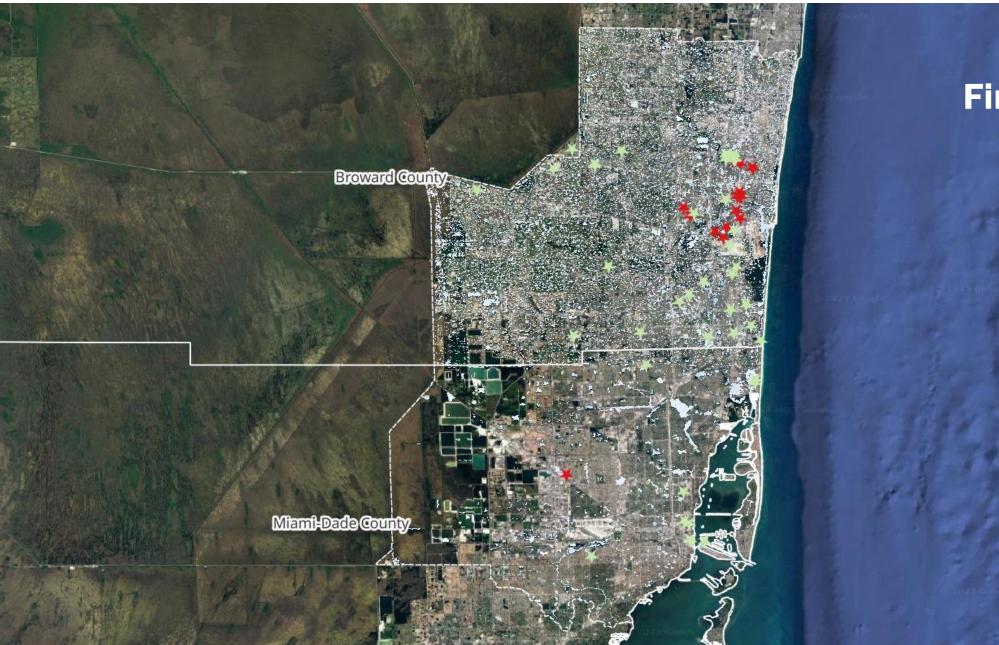


Fort Lauderdale

- ~ 500mm in 12hr
- Catchment aggregation makes the max Precip decrease to 180mm/d







Final Footprint

Depth (m)

<= 0.1000 0.1000 - 0.2000 0.2000 - 0.5000 0.5000 - 0.7500 0.7500 - 1.0000 1.0000 - 1.2500 1.2500 - 1.5000 2.0000 - 2.5000 2.5000 - 3.0000 3.0000 - 3.5000 > 3.5000 **APPENDIX – FOOTPRINT VALIDATION**

California – Atmospheric Rivers Jan 2023

Pajaro flood caused by levee breach



© 2023 Risk Management Solutions, Inc. and/or its affiliates and licensors ("Moody's RMS"). All rights reserved.



Layers Browser Zoom to Coordinate

🔹 🗸 才 US CA Band 1 (Gray) <= 0.1000

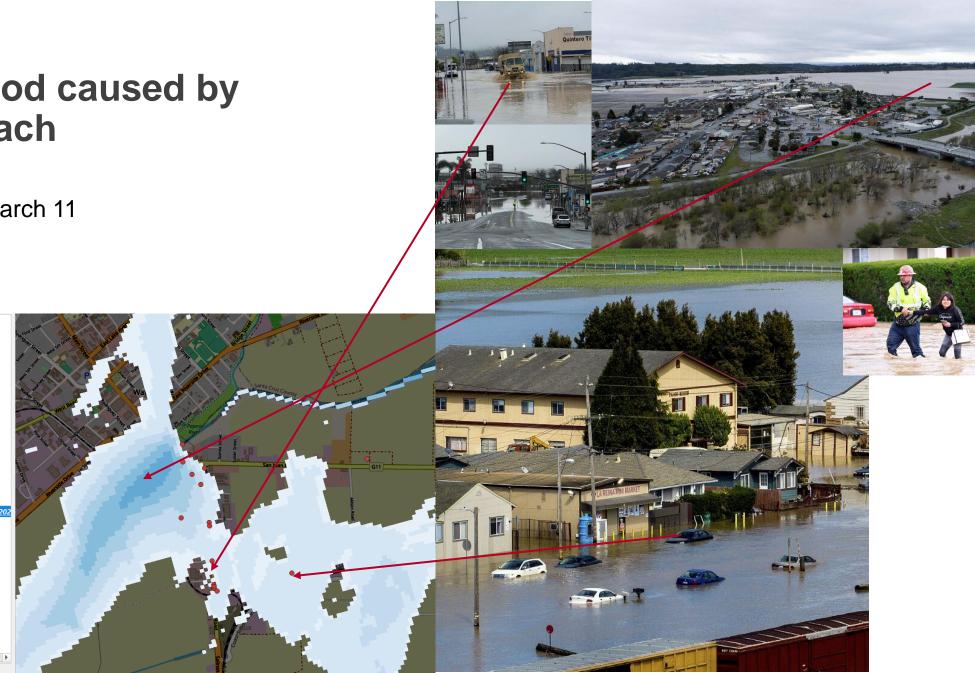
> > 3.5000 📲 US CA

CA_hazard hazardRP

Pajaro flood caused by levee breach

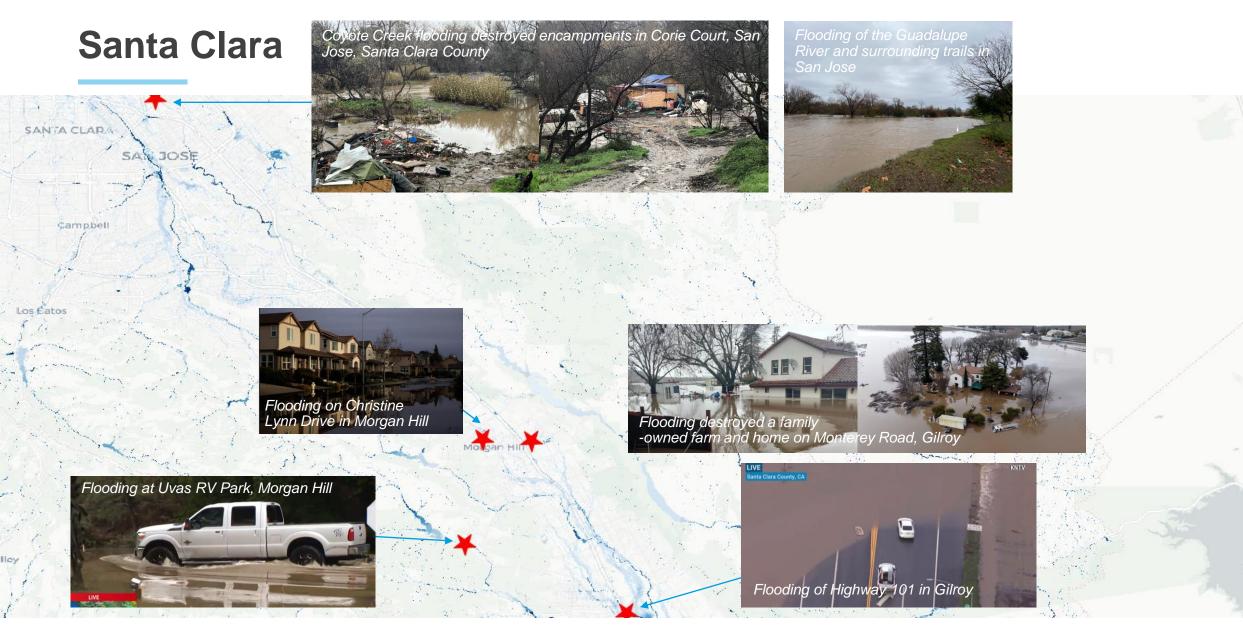
Photos from march 11

v	2023 Flood California March	10
- V	F US_CA	a Ford Su
	Band 1 (Gray)	origues .
	<= 0.1000	a
	0.1000 - 0.2000	- Sala - Sala
	0.2000 - 0.5000	Met St.
	0.5000 - 0.7500	Se a
	0.7500 - 1.0000	atter Si
	1.0000 - 1.2500	
	1.2500 - 1.5000	- AR
	1.5000 - 2.0000	TUR
	2.0000 - 2.5000	10
	2.5000 - 3.0000	2
	3.0000 - 3.5000	all.
	> 3.5000	Drive
	US_CA	C.
	Papzen Global Terrain	M
	FL_California_US_FloodExtent_GISFiles_24Jan202	//
	🗭 CA_hazard	•/
	hazardRP	
	ca_catchments_dlm	
v	F OpenStreetMap	
		F



Browser Zoom to Coordinate Layers

San Mateo Flooding at Elegant Hair & Nail Salon, San Carlos Flooding at La SAN MAT CO Foster City Pinata on North B St FREMONT . Mewark REDWOOD CITY, CA En Palo Ments Park MUDITAS Cordilleras Creek in Redwood City MCU TAIN SUNNYVALE 1 SANTA CLARA SA 30 CUPERTINO A partial collapse of the 4100 block of Stage Road, Campbell Saratogá Pescadèro Flooding in Pescadero



© 2023 Risk Management Solutions, Inc. and/or its affiliates and licensors ("Moody's RMS"). All rights reserved.





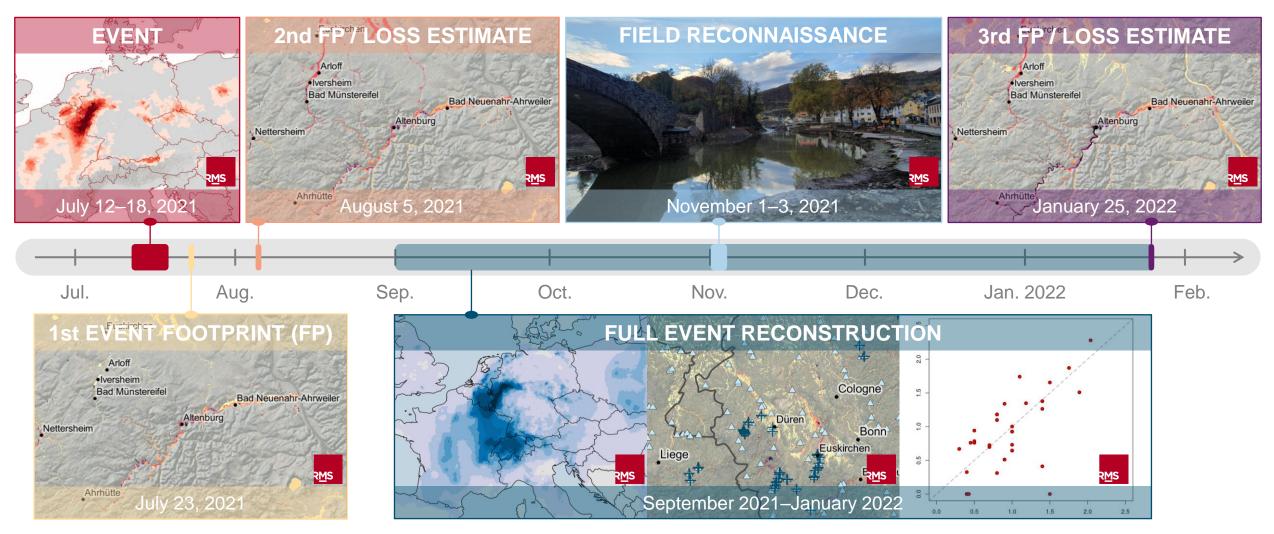
and mudslides



APPENDIX – Europe Inland Flood Event Response

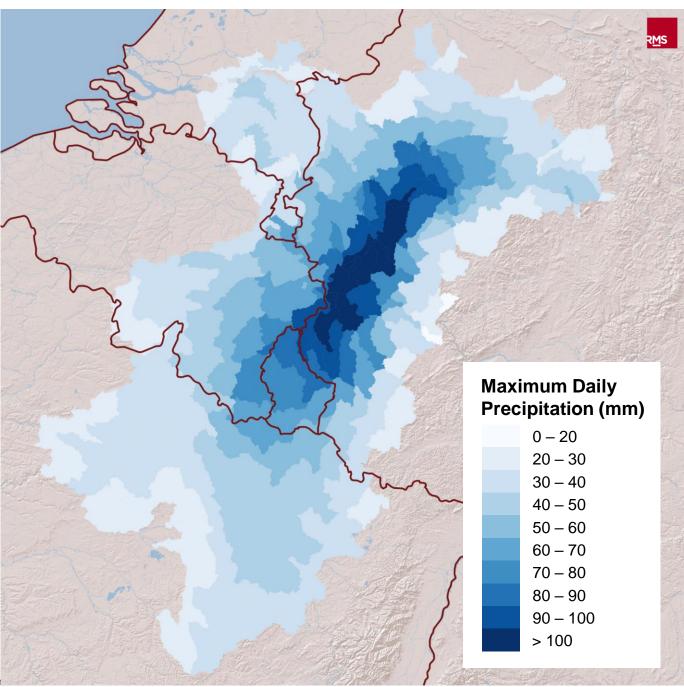
Low pressure front Bernd – July 2021

Timeline



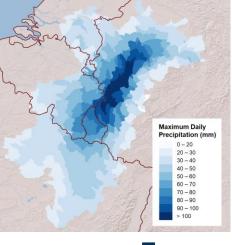
Precipitation per Catchment

- E-OBS precipitation sums aggregated to the catchments of the RMS[®] Europe Inland Flood HD Models
- Maximum daily observed precipitation between July 13– 15, 2021
- Data used as input for the full event reconstruction



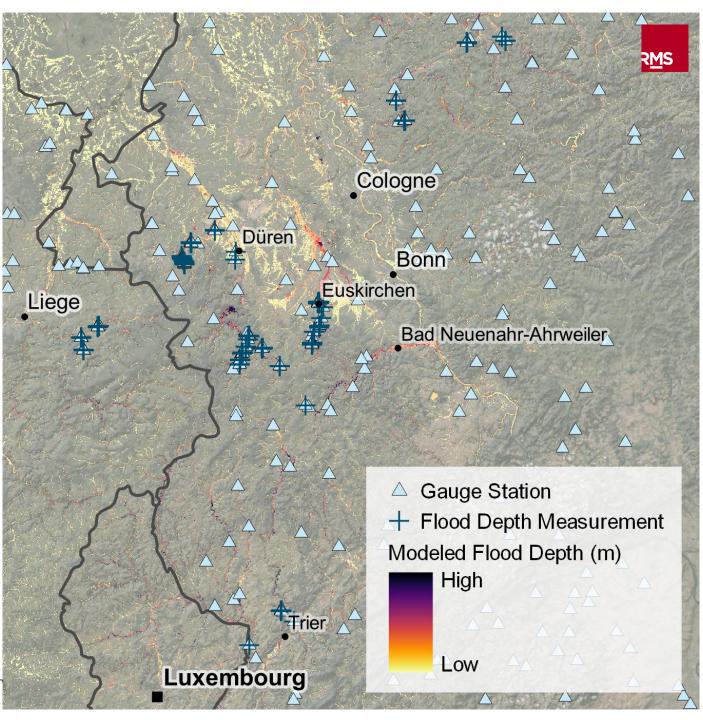
Full Event Reconstruction

- Focus on most affacted areas (e.g., Bavaria, Saxony excluded)
- Maximum precipitation from E-OBS dataset between July 13–15, 2021



- Leveraging components of the Europe Inland Flood HD Models
- Inclusion of data from roughly 700 gauge stations, mainly along small and medium rivers
- Incorporation of own ~200 flood depth measurements inferred from observed flood marks

© 2023 Risk Management Solutions, Inc. and/or its affiliates and licensors ("Moody's RMS"). All rights reserved



APPENDIX – EVENT RECONSTRUCTION

Hurricane Ida – Northeast US

© 2023 Risk Management Solutions, Inc. and/or its affiliates and licensors ("Moody's RMS"). All rights reserved.

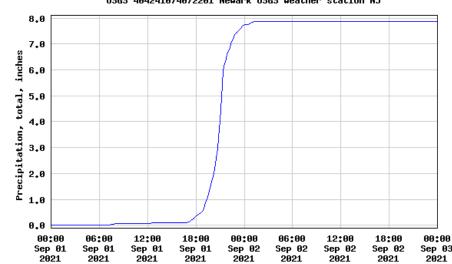
Then it started raining...

- Lack of warning made it harder to anticipate
- Record-breaking rainfall over NJ, NY, PA, CT
- Emergency alerts arrived when it was already raining
- Based on past events, 7.5" in 6h represents
 1,000-year RP event

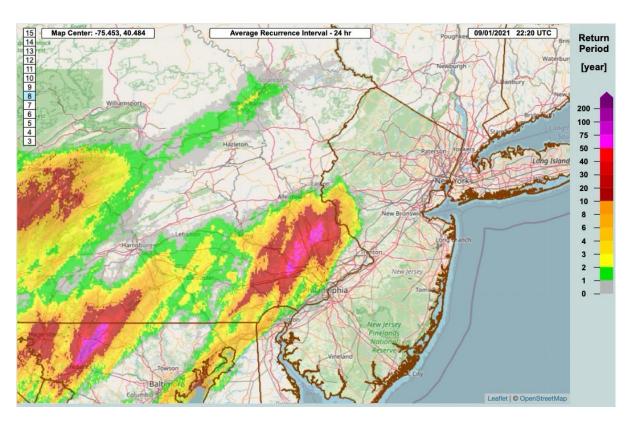
Emergency alert: Severe Sep 01, 19:35 PM

National Weather Service: A FLASH FLOOD WARNING is in effect for this area until 9:45 PM EDT. This is a dangerous and life-threatening situation. Do not attempt to travel unless you are fleeing an area subject to flooding or under an evacuation order.

ОК



⁻⁻⁻ Provisional Data Subject to Revision ----



USGS 404241074072201 Newark USGS weather station NJ

Then it started raining...

- Lack of warning made it harder to anticipate
- Record-breaking rainfall over NJ, NY, PA, CT
- Emergency alerts arrived when it was already raining
- Based on past events, **7.5**" in **6h** represents 1,000-year RP event
- High-intensity, short-duration precipitation over saturated soils
- Led to localized fluvial flooding (e.g. Raritan River, Passaic River, Schuylkill River) and widespread precipitation-induced flash floods

Emergency alert: Severe

National Weather Service: A FLASH FLOOD WARNING is in effect for

this area until 9:45 PM EDT. This is a

Do not attempt to travel unless you are

OK

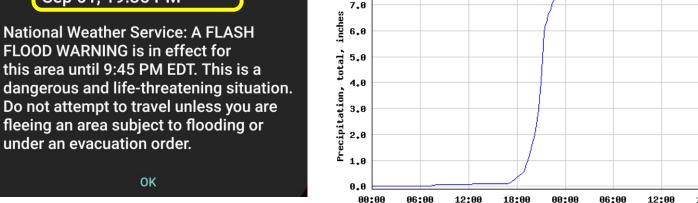
fleeing an area subject to flooding or

under an evacuation order.

Sep 01, 19:35 PM

- Particularly severe in urban areas.
 - NYC 100-year hourly rainfall depth 2.87" from backward-looking NOAA Atlas 14 analytics.
 - 3.15" max hourly rainfall measured at Central Park during Ida

USGS 404241074072201 Newark USGS weather station NJ



2021

8.0

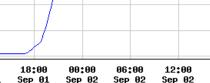
Sep 01

2021

Sep 01

2021

2021



2021

2021

2021

Sep 03

2021

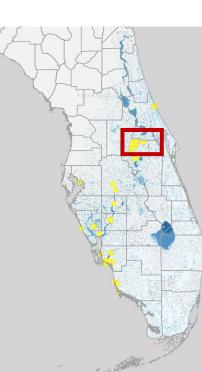
APPENDIX – FOOTPRINT VALIDATION

Hurricane Ian – Pluvial vs Fluvial

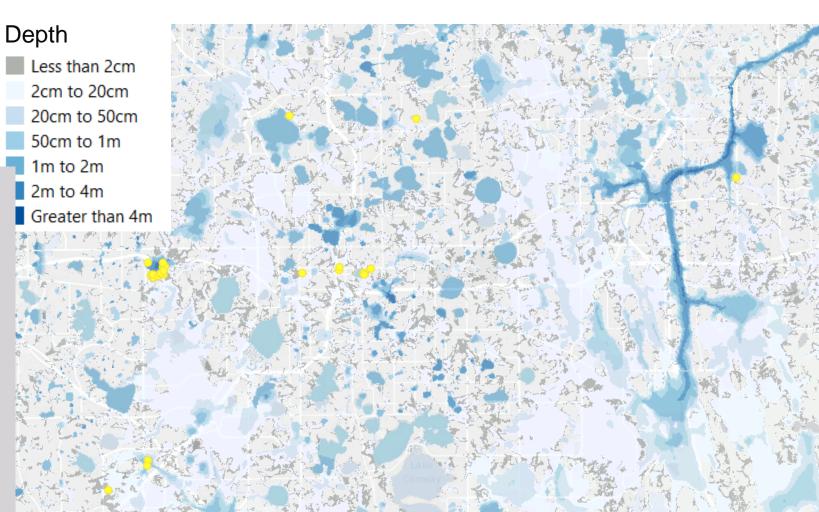
© 2023 Risk Management Solutions, Inc. and/or its affiliates and licensors ("Moody's RMS"). All rights reserved.

Pluvial flooding, Orlando

- Flat topography and shallow water table
- Requires detailed pluvial modeling to capture street level flooding and overflow of lakes



Surveyed locations



Fluvial flooding on the Peace River

- Major flooding stage on the Peace river lasted several days
- Surveyed damaged locations validated the extent of the fluvial inundation

