



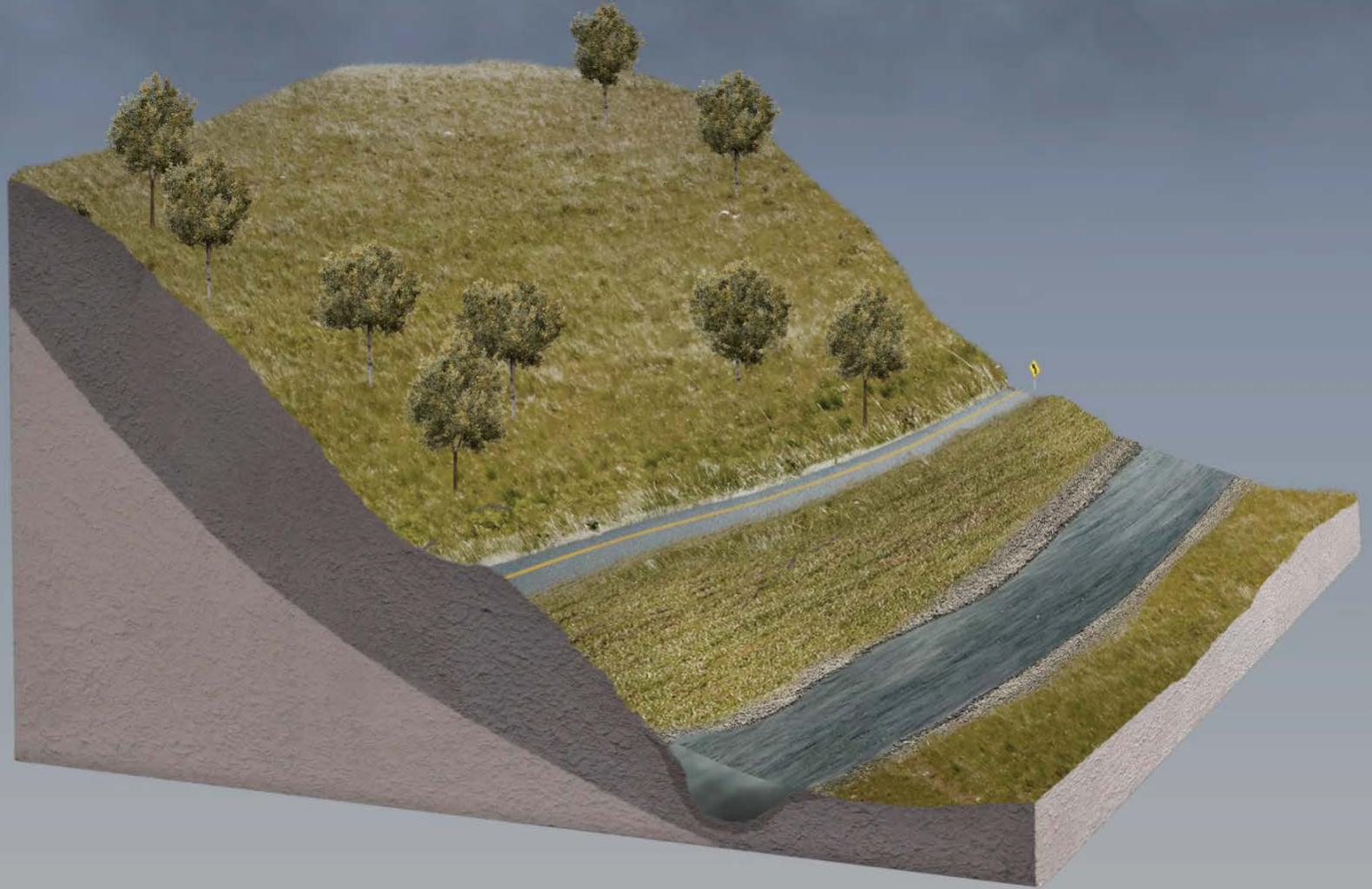
# A Global Landslide Hazard Assessment Model for Situational Awareness

Dalia Kirschbaum<sup>1</sup>  
Thomas Stanley<sup>2,1</sup>

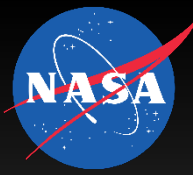
*1. NASA Goddard Space Flight Center*

*2. USRA*

# Landslides 101



We can estimate the processes that create potential for landslides and observe their impact remotely



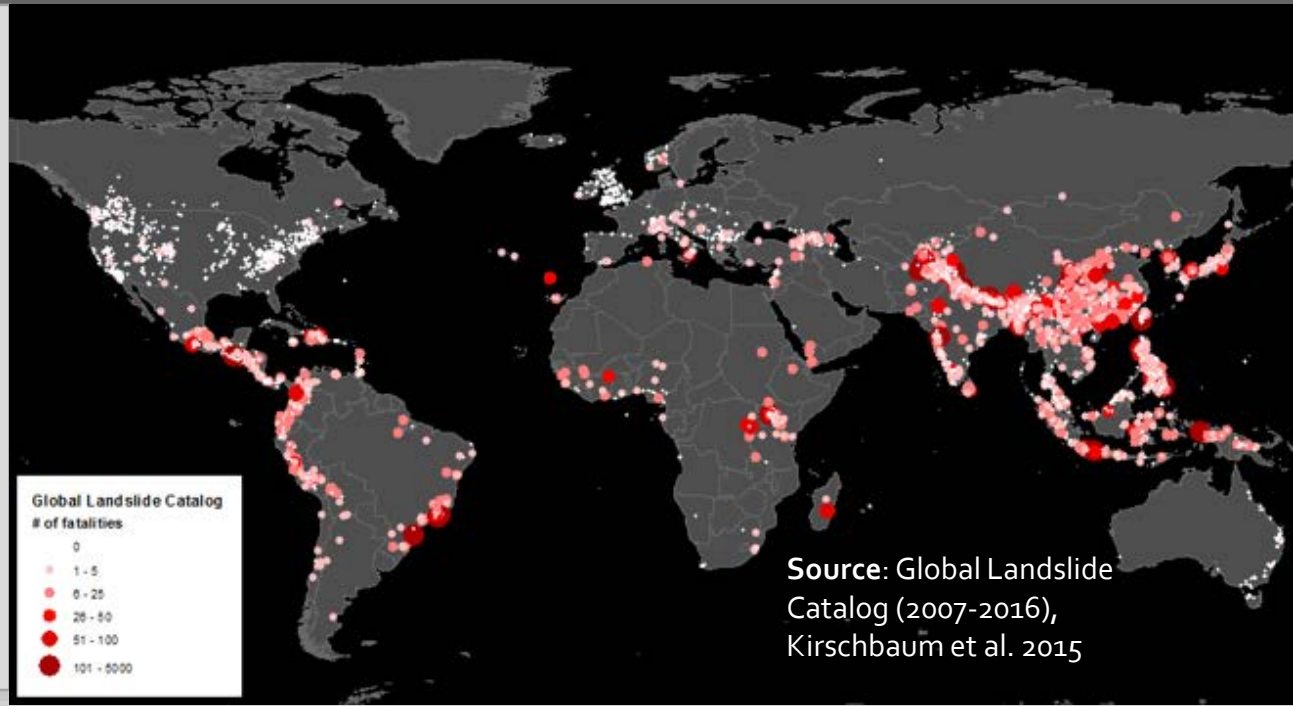
# Motivation and Challenges

1. Rainfall-triggered landslides **impact nearly every country in the world**, but we lack sufficient global information to provide situational awareness
2. This type of information could help to **guide local, national and international awareness** of this hazard, and improve potential response and planning

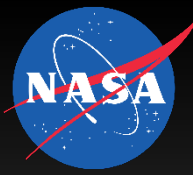
-8,000+ rainfall-triggered landslide reports

-Compiled from media sources, online databases, etc.

-<http://ojo-streamer.herokuapp.com/>

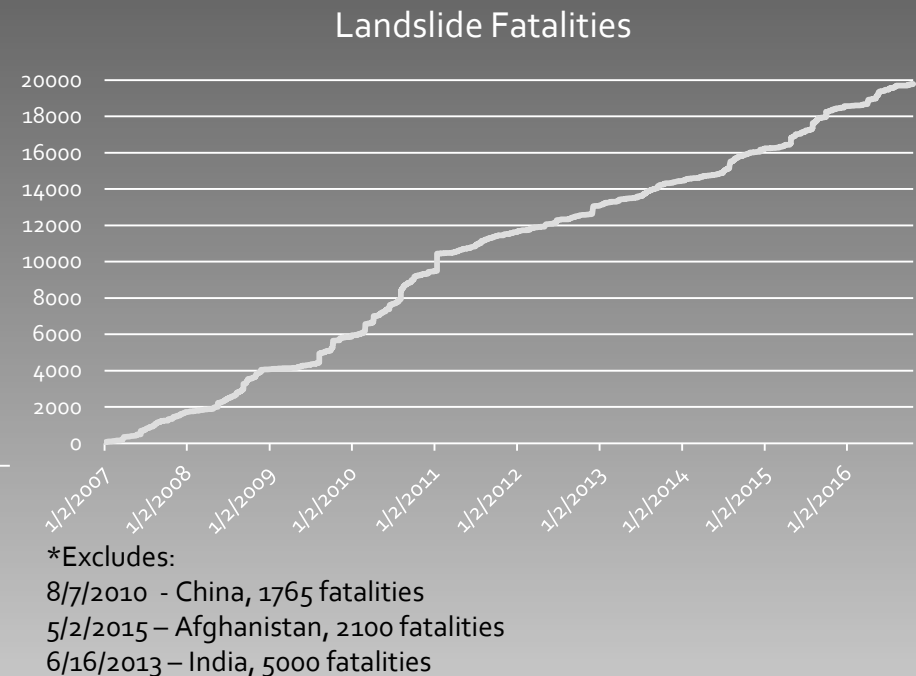
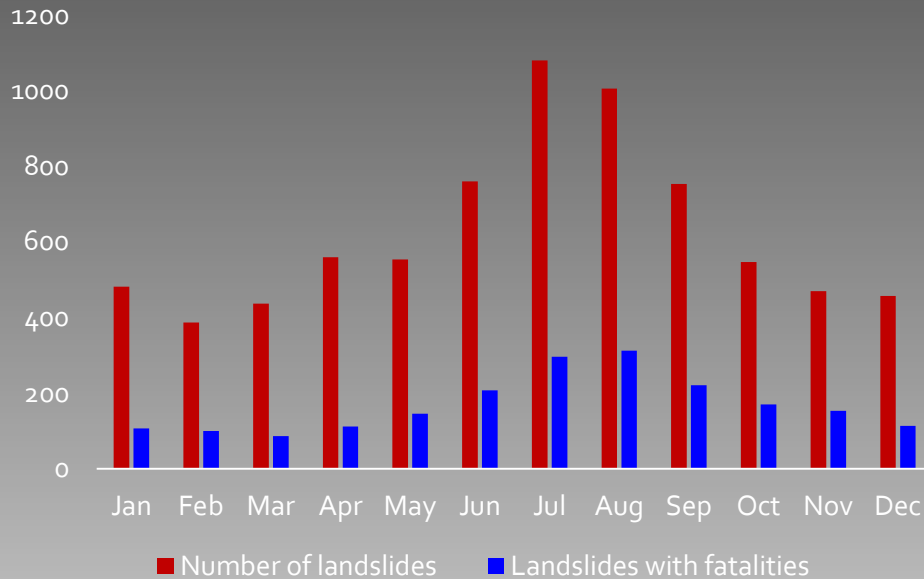


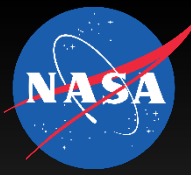
Source: Global Landslide Catalog (2007-2016), Kirschbaum et al. 2015



# Motivation and Challenges

- Very little global landslide event information
- Coarse resolution or heterogeneous quality for in situ products for things like geology or soil types
- Limited characterization of rainfall triggering relationships outside of local to regional scales



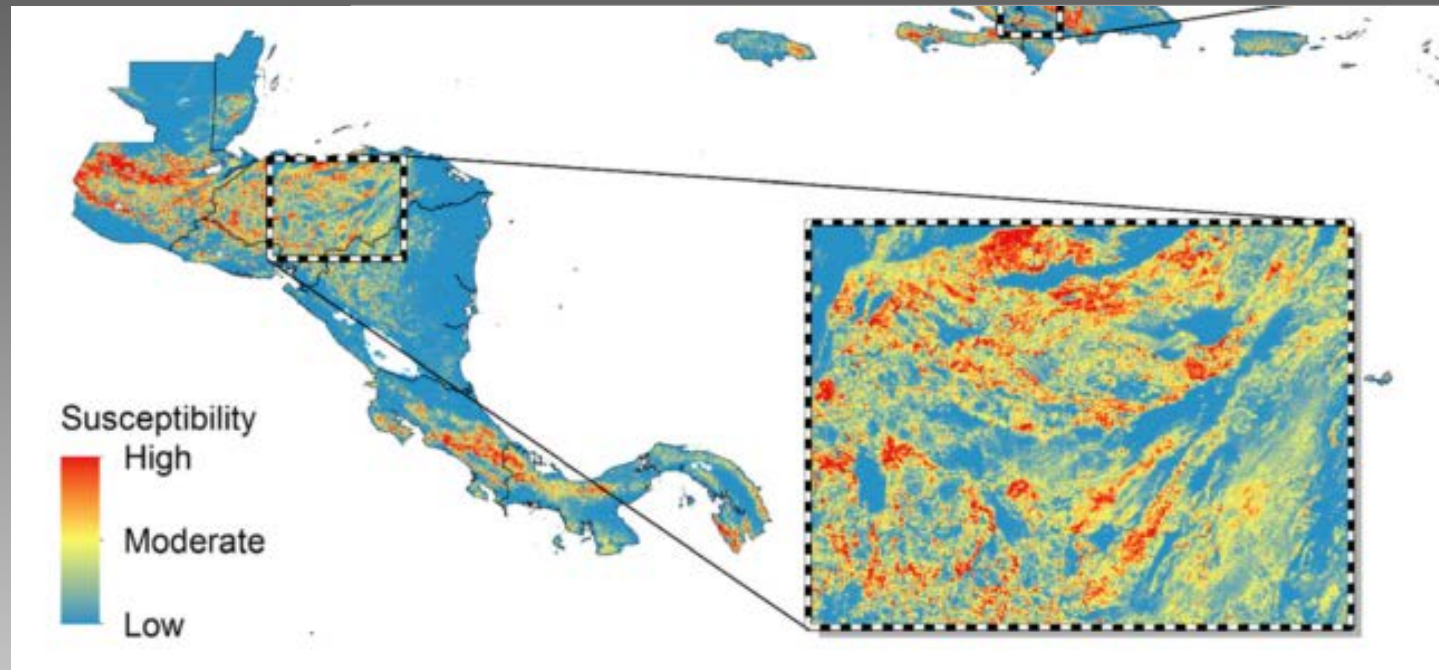


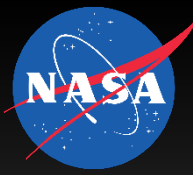
# Landslide Hazard Assessment for Situational Awareness (LHASA)

- **Goal:** Develop landslide model based primarily on remotely sensed data that can provide a relative awareness of potential landslide activity at a regional scale in near real-time
- **Approach:** Merge a regional landslide susceptibility map with satellite-based rainfall information to represent potential hazard every day

Regional susceptibility mapping approach, Kirschbaum et al. 2016, *Landslides*

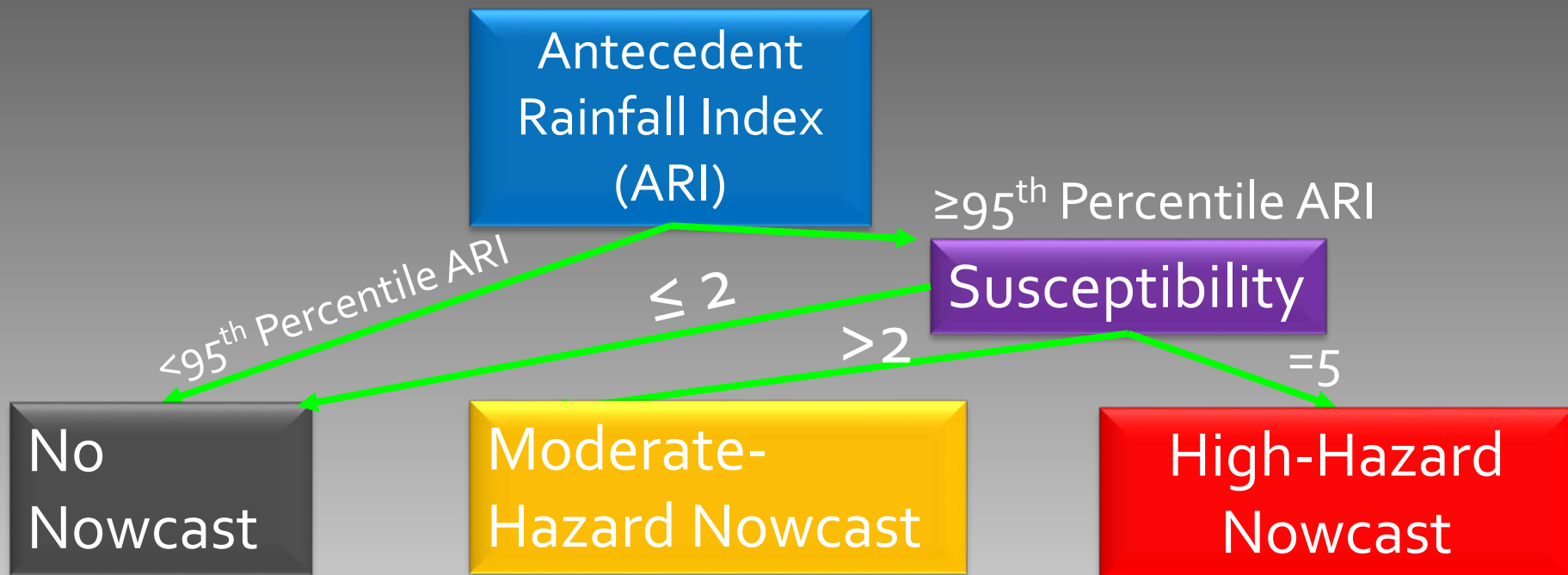
Regional LHASA Model, Kirschbaum et al 2015, NHESS



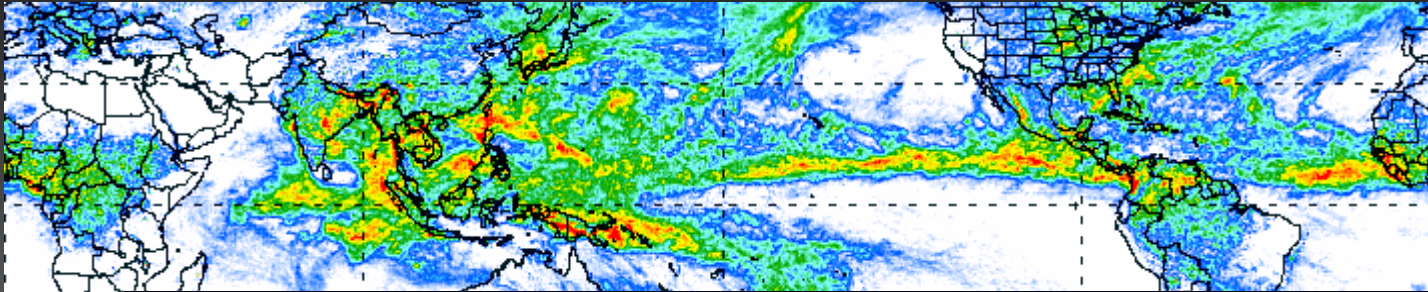


# Global LHASA - Framework

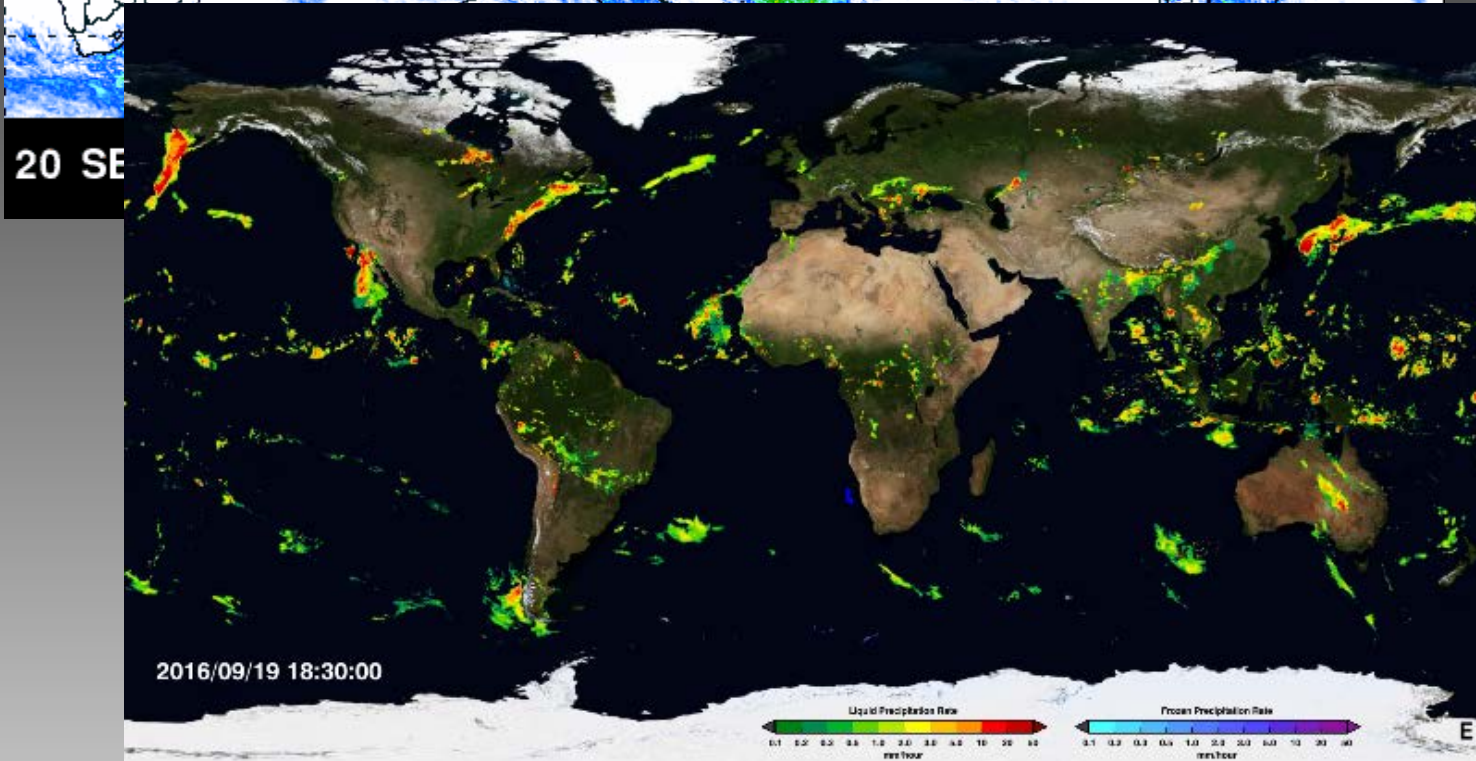
1. Calculate 7-day Antecedent Rainfall Index (ARI) using near real-time IMERG precipitation data
2. Compare ARI to thresholds (derived from TMPA)
3. Identify susceptible areas
4. Create near real-time nowcasts (moderate, high)



# Satellite Precipitation



TMPA  
0.25 Degrees  
2001-present

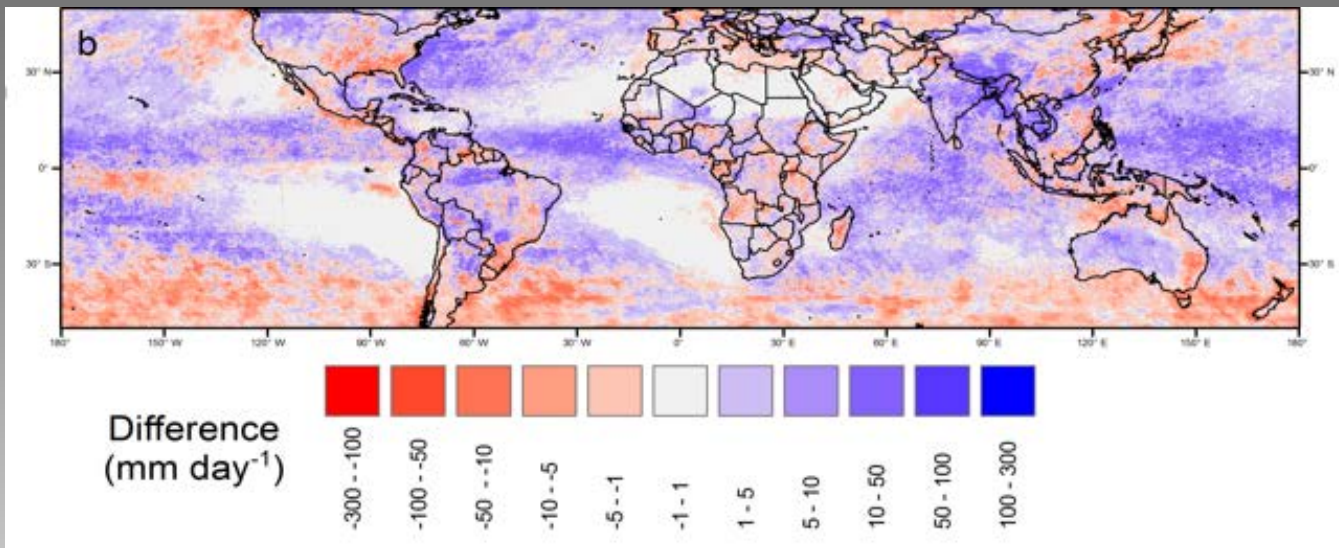


IMERG  
0.1 Degrees  
2014-present

# Step 1: ARI Calculation

- Weighted average of the most recent 7 days of rainfall, including the current date if possible.
- $ARI = \frac{\sum_{t=0}^6 p_t w_t}{\sum_{t=0}^6 w_t}$ , where  $t$  = the number of days before the present,  $p_t$  = the precipitation at time  $t$ , and  $w_t = (t + 1)^{-2}$

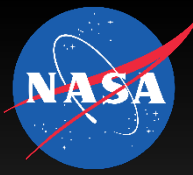
95<sup>th</sup> Percentile



TMPA-RT – IMERG  
from March 2015 -  
2016 for daily rainfall

**RED** – IMERG is higher  
**BLUE** – TMPA is higher



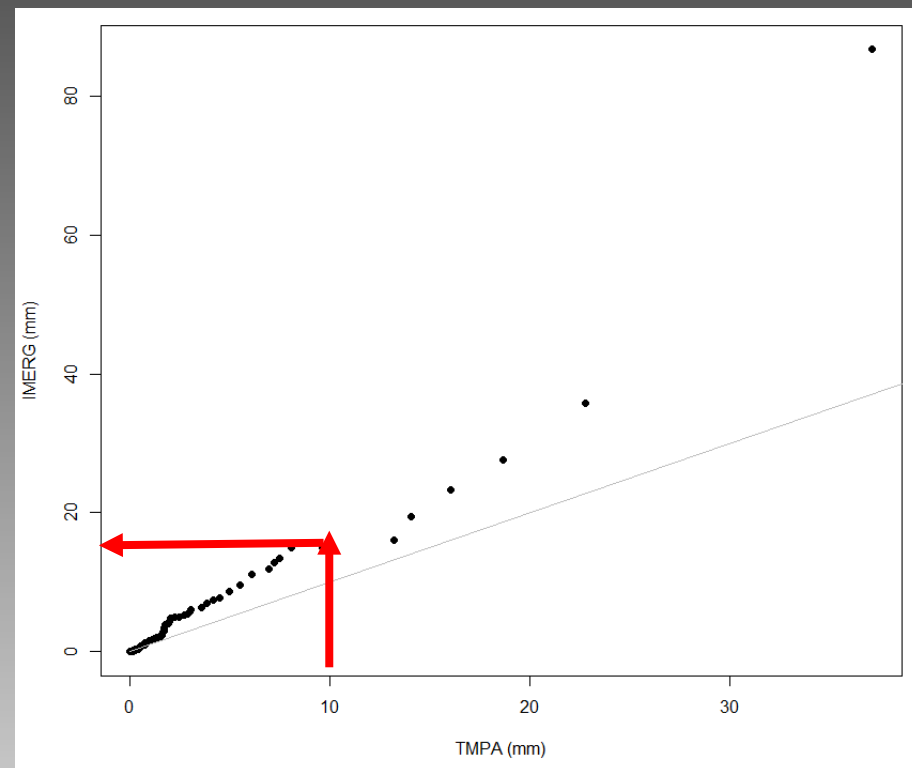


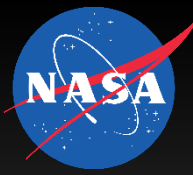
# Step 2: Compare ARI to thresholds

- 7-day ARIs were calculated for IMERG and compared historically with TMPA for 2001-2014
- ARI values at each pixel were re-mapped based on the differences between IMERG and TMPA

Stanley et al., *accepted*

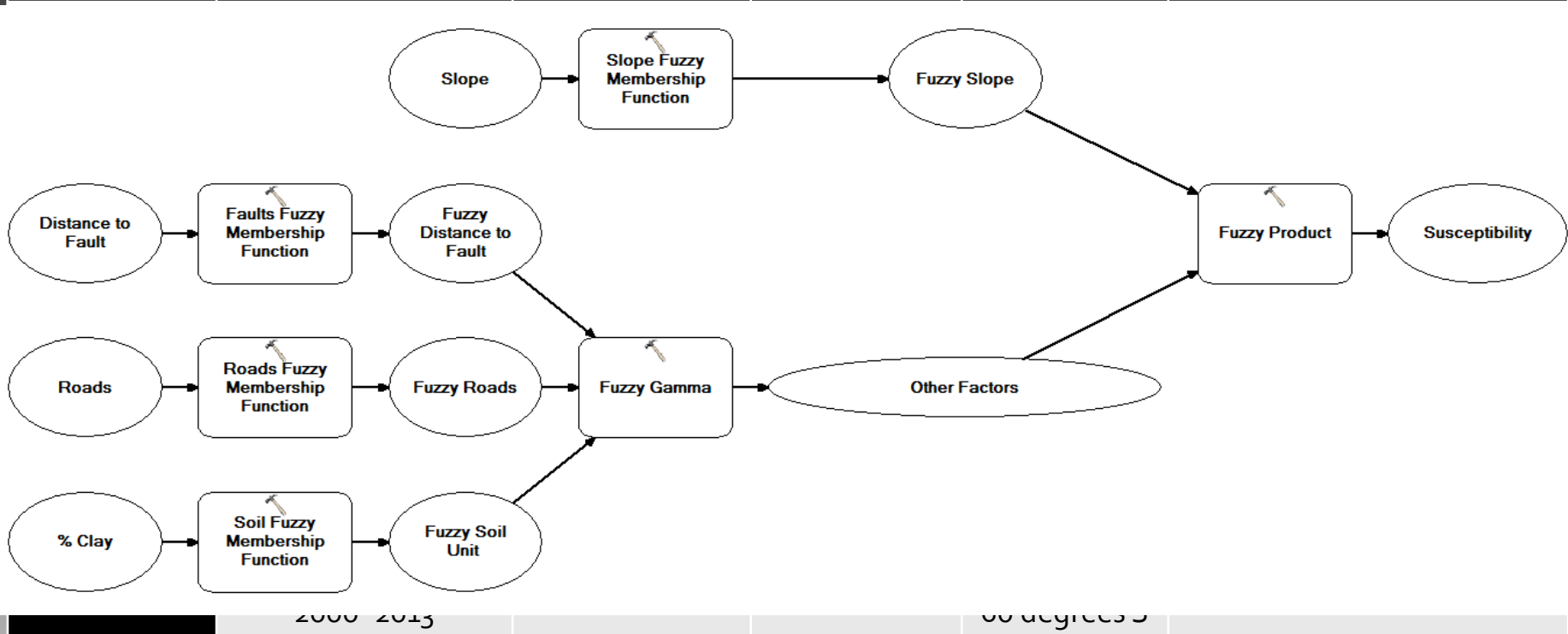
Quantile-quantile plot example for one pixel, where the value from one product is used to look up the value of the second product at the same quantile.



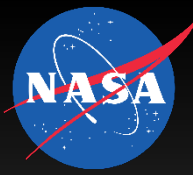


# Step 3: Identify susceptible areas

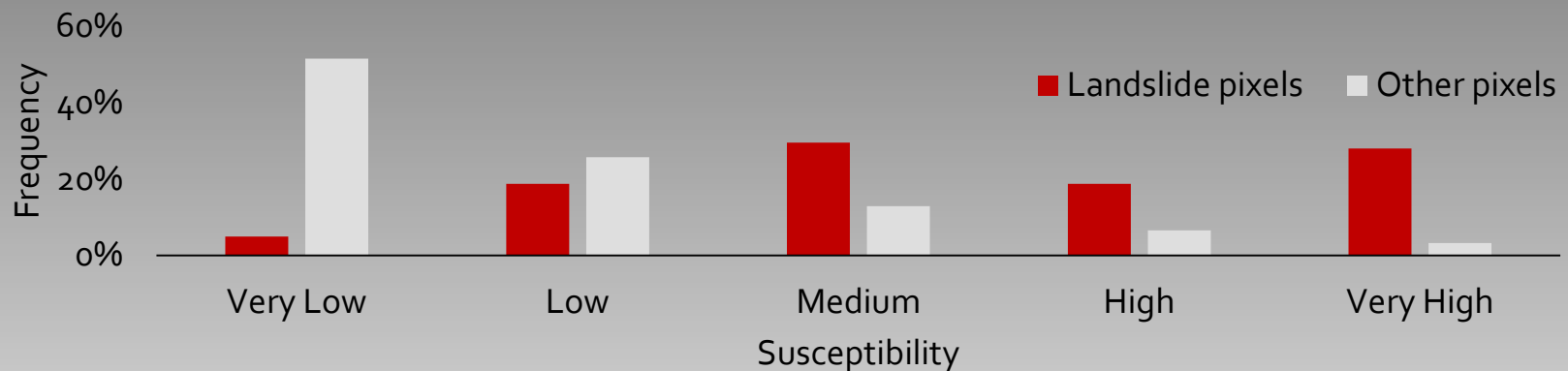
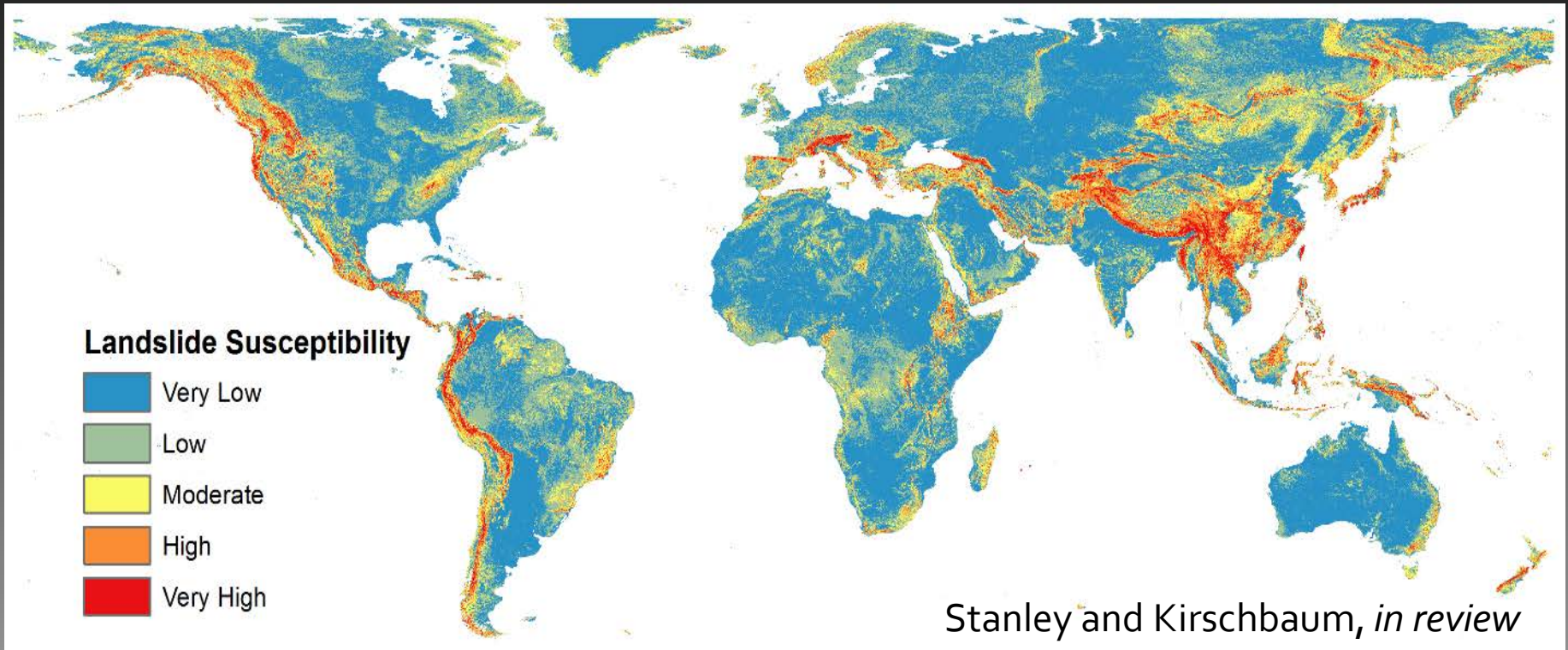
Data Type	Data Set	Resolution/ Accuracy	Explanatory Variable	Extent	Source and Details
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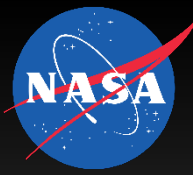


Kirschbaum et al. 2016 (methodology)  
 Stanley and Kirschbaum, *in review*

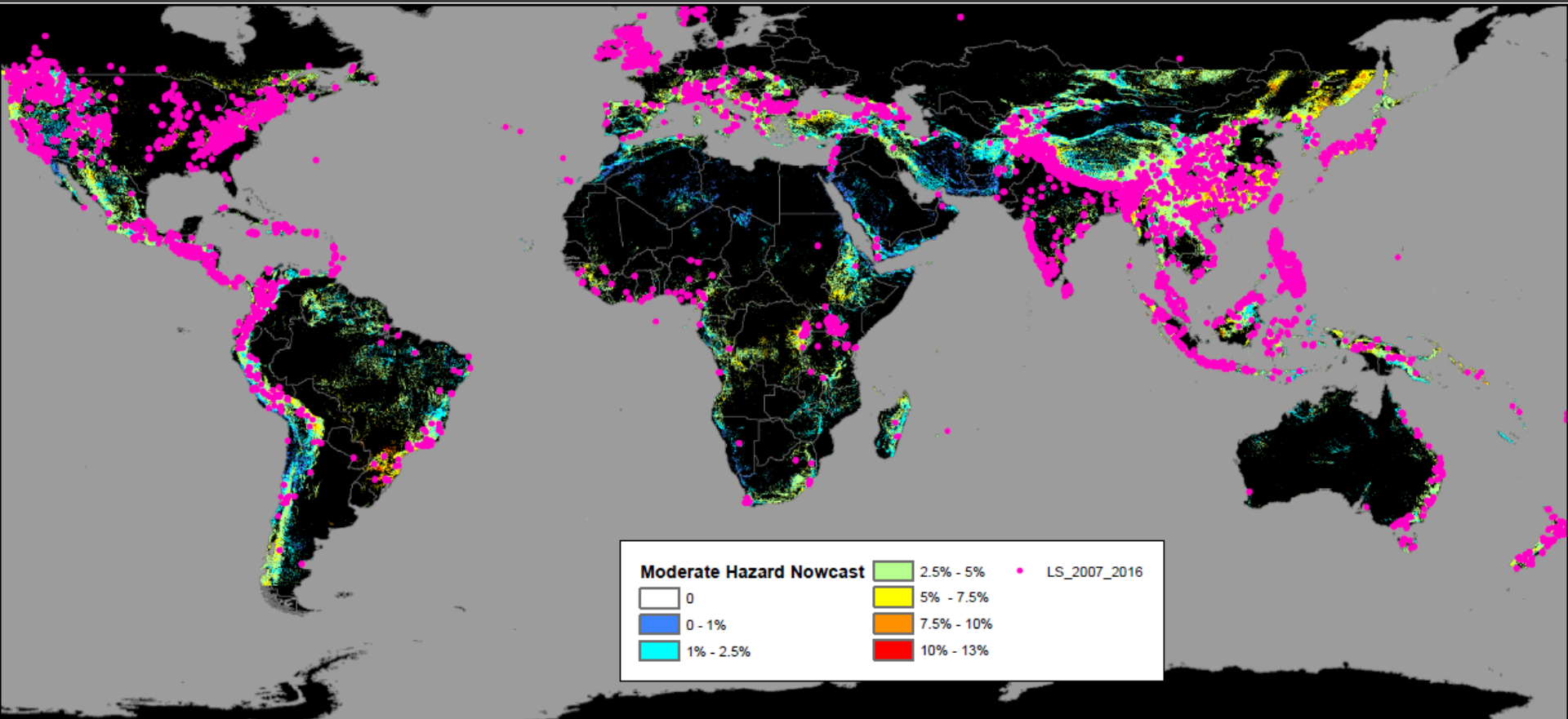


# Global landslide susceptibility





# Average Annual Nowcast Rate (using TMPA thresholds) – 2001-2014





# Model Validation

- For the time span where the GLC is reporting, our TPR averages ~32% for IMERG data at 1 day, this increases to >50% when considering a 7 day window ( $\pm 3$  days)
- There are several areas where the FPR rate is higher, likely due to overestimation of susceptibility or precipitation

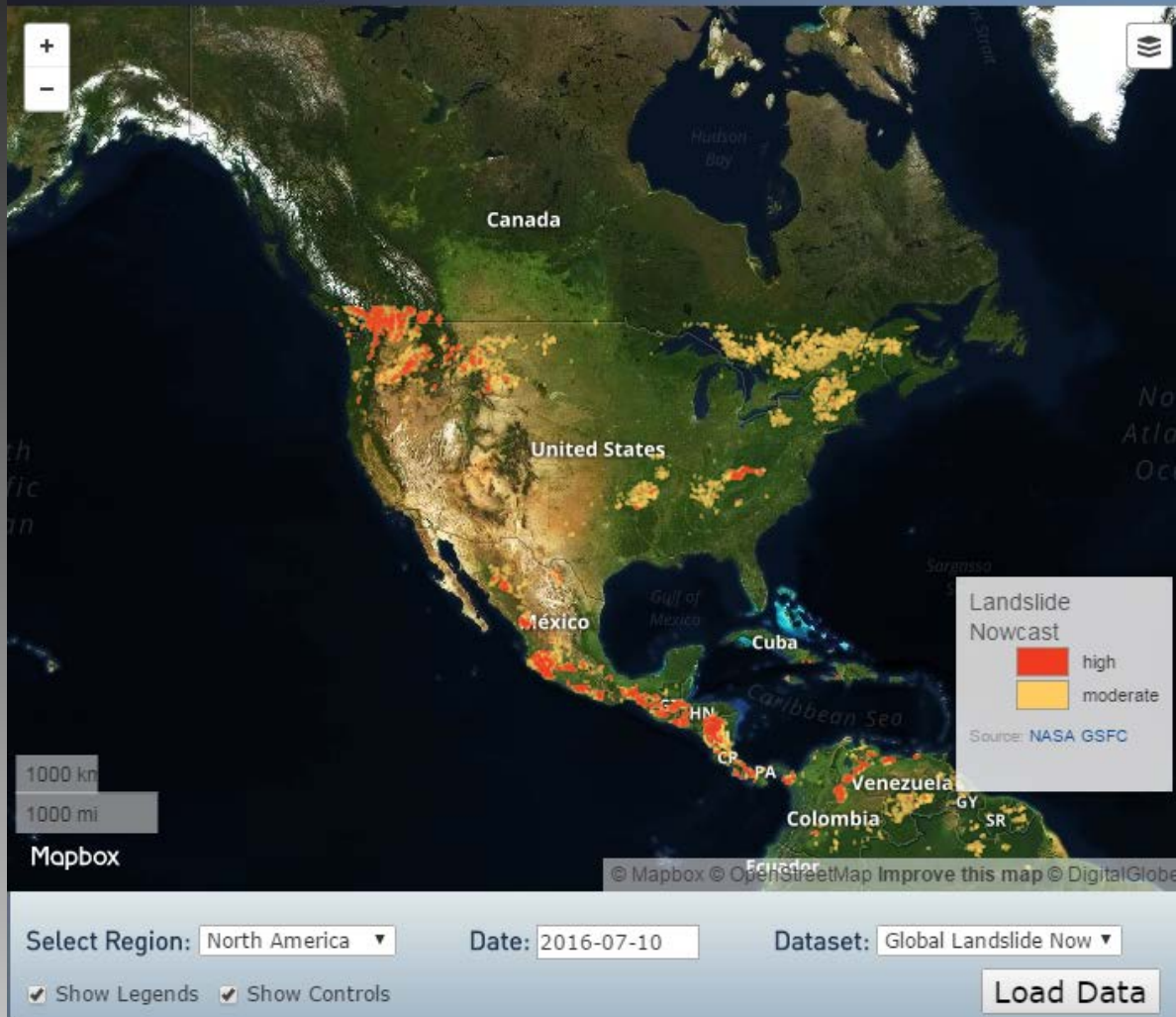
Threshold Values & Range	Forcing Precipitation	1-day TPR	3-day TPR	7-day TPR	FPR	Landslide reports
<b>TMPA 2001-2014</b>	TMPA 2007-2014	26%	36%	47%	1%	3,984
<b>TMPA 2001-2014</b>	TMPA 2015-2016	31%	47%	57% *	1%	289
<b>Adapted TMPA 2001-2014+</b>	IMERG 2015-2016	34%	48%	58% *	1%	289

\* Only 275 landslides were used for this assessment



# New system

## Interactive Precipitation Visualizer



- New interactive viewer that exports landslide nowcasts, flood nowcast, and IMERG precipitation
- Available datasets:
  - IMERG 30mn, 3hr, 1day, 7day
  - Flood Nowcast (GFMS, U of MD)
  - Global Landslide Nowcast Model (NASA GSFC)
- Export file formats: geoJSON, topoJSON, arcJSON, TIF, SHP
- Publisher / consumer architecture – use the API to automate data collection or write your own consumer UI.

**NOW AVAILABLE:**

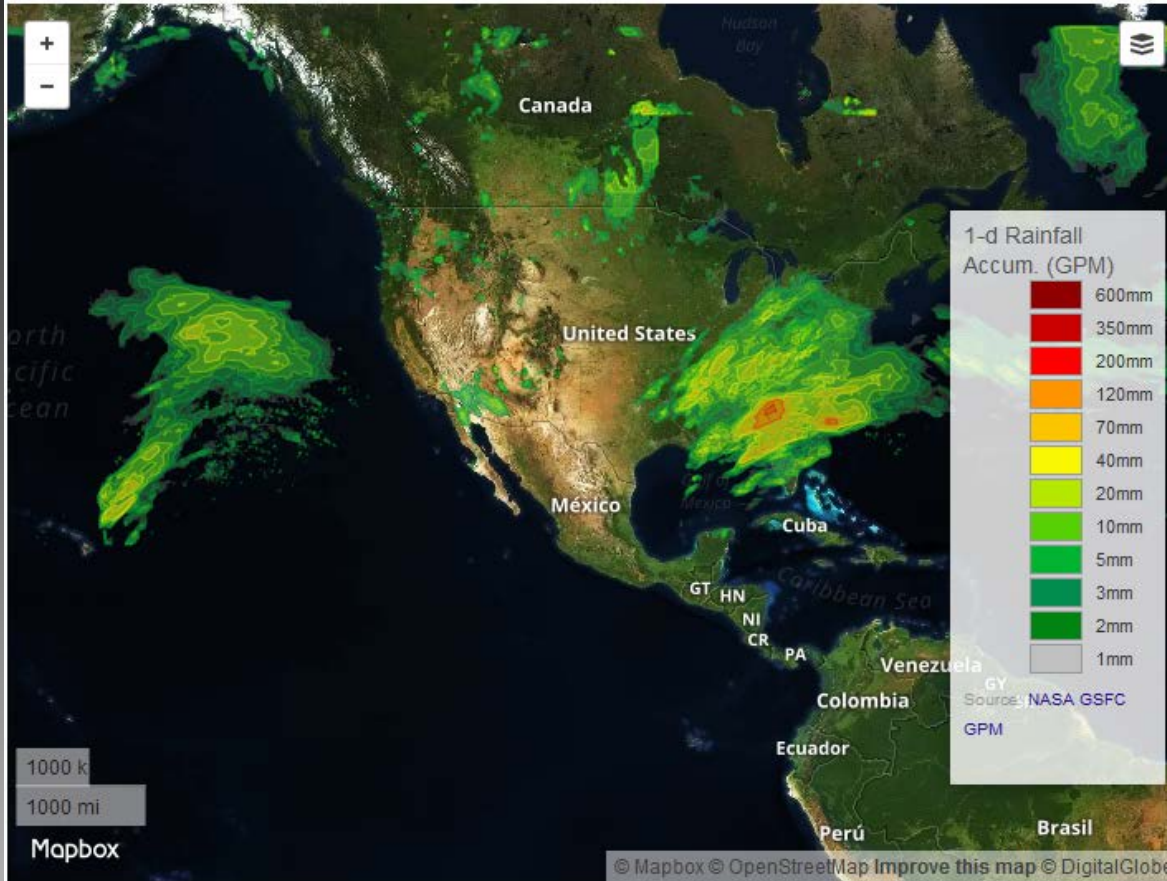
**<https://pmm.nasa.gov/precip-apps>**

# Precipitation and Applications Viewer

This page is a demonstration of the [PMM Precipitation](#) and Applications Publisher API.

To learn how to use the API for your own applications, please visit:

- <https://pmpublisher.pps.eosdis.nasa.gov/>
- <https://pmpublisher.pps.eosdis.nasa.gov/docs>



<https://pmm.nasa.gov/precip-apps>

- Consumer interface
- PMM API Publisher

Download Data:

File Formats:

- geoJSON
- topoJSON
- TIF
- arcJSON
- SHP

Preview Image:



GPM IMERG "Early Run" 30 Minute Precip. Accumulation

GPM IMERG "Early Run" 3 Hour Precip. Accumulation Updated Every 30 minutes

GPM IMERG "Early Run" 1 Day Precip. Accumulation Updated Every 30 minutes

GPM IMERG "Late Run" 1-Day Precip. Accumulation

GPM IMERG "Late Run" 3-Day Precip. Accumulation

GPM IMERG "Late Run" 7-Day Precip. Accumulation

Floods Nowcast

Global Landslide Nowcast

Global Landslide Nowcast Updated Every 30mn

Select Region: North America

Date: 2016-12-06

Dataset: GPM IMERG "Late Run"

Show Legends  Show Controls

Load Data



<https://pmmpublisher.pps.eosdis.nasa.gov/opensearch/>

Home OpenSearch **API** Documentation

About  
Contacts

Q Query

Area:  
Small

Longitude Latitude:  
0,0

Products:  
Global Landslide Nowcast 30r

- Flood Nowcast
- Global Landslide Nowcast
- Global Landslide Nowcast 30mn
- 1day Accumulated Rainfall
- 3day Accumulated Rainfall
- 7day Accumulated Rainfall
- 30mn Accumulated Rainfall
- 3hr Accumulated Rainfall every 30mn

### OpenSearch Product Query Demo

Map

general metadata actions

- browse  
browse
- download  
topojson.gz geotiff
- map  
legend style credits
- subset  
subset
- metadata  
metadata
- export  
geojson arcjson shp.zip

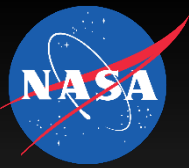
Landslide Nowcast

- high
- moderate

Source: NASA GSFC

Leaflet





# API Publisher

<https://pmpublisher.pps.eosdis.nasa.gov/swagger/index.html#!/opensearch/opensearch>

## PMM Publisher API

These are the PMM Publisher REST Application Programming Interface Definitions.

Find out more about the PMM Publisher

<https://pmpublisher.pps.eosdis.nasa.gov>  
[Contact the developer](#)  
[Apache 2.0](#)

<https://pmpublisher.pps.eosdis.nasa.gov/docs>

## opensearch : OpenSearch

Show/Hide | List Operations | Expand Operations

GET /opensearch

### Implementation Notes

Generic OpenSearch

### Parameters

Parameter	Value	Description
q	precip_30mn (default)	Product
lat	0	Latitude
lon	0	Longitude
limit	2	Limit
startTime	(required)	Start Time
endTime	(required)	End Time

### Response Messages

HTTP Status Code	Reason	Response Model
200	OK	

Try it out!

## Example Request / Response

Below is a typical request with its associated response. Comments have been added to the JSON response file to indicate specific fields of interest.

### Request URL

```
https://pmpublisher.pps.eosdis.nasa.gov/opensearch?q=precip_1d&lat=38&lon=100&limit=1&startTime=2016-11-12&endTime=2016-11-12
```

### Response Body

```
{
  "@context": "http://pmpublisher.pps.eosdis.nasa.gov/vocab",
  "@language": "en",
  "@id": "urn:oj:opensearch?q=precip_1d&lat=38&lon=100&limit=1&startTime=2016-11-12&endTime=2016-11-12",
  "displayName": "NASA GSFC Product Publisher",
  "@type": "as:Collection",
  "url": "http://pmpublisher.pps.eosdis.nasa.gov/opensearch?q=precip_1d&lat=38&lon=100&limit=1&startTime=2016-11-12&endTime=2016-11-12",
  "mediaType": "application/activity+json",
  //total number of results returned from the query
  "totalItems": 1,
  //array of length = totalItems, each of which is one dataset that matches the request parameters
  "items": [
    {
      "@id": "gpm_1d_20161112",
      "@type": "geoss:precipitation",
      "displayName": "gpm_1d_20161112",
      //preview .png image of this dataset
      "image": [
        {
          //request this URL to access the preview image
          "url": "https://pmpublisher.pps.eosdis.nasa.gov/products/s3/r09/gpm_1d/2016/317/gpm_1d.20161112_thn.png",
        }
      ]
    }
  ]
}
```



# Pacific Disaster Center: Disaster Alert

<http://disasteralert.pdc.org/disasteralert/>

Disaster Alert  
DisasterAWARE 6.0.0 b76

UTC 19:16 DEC 8, 2016  
WASH DC 14:16 DEC 8, 2016  
HAWAII 09:16 DEC 8, 2016  
TOKYO 04:16 DEC 9, 2016  
SYDNEY 06:16 DEC 8, 2016  
LONDON 19:16 DEC 8, 2016

Layers

Layers

- Main
  - PDC Integrated Active Haza...
  - Featured Layers
    - Population Density
    - Night Lights
    - Day/Night Indicator
    - Winds (Surface Velocity ...)
    - Rainfall Accumulation (3...)
    - Rainfall Accumulation (1 ...)
    - Global Clouds
    - Sea Surface Temperature
    - Lat/Long
    - Countries
    - Coping Capacity Index
    - Lack of Resilience Index
  - Recent Hazards and Events
  - Regional Data
  - User Layers
  - KML & External Layers

SCALE 1:37 054 191 -0.095 98 496 47MMV4392789509

12.06.2016 16h 19h 22h 1h 4h 7h 10h 13h 16h 19h 22h 12.07.2016 1h 4h 7h 10h 13h 16h 19h 22h 12.08.2016 1h 4h 12h

PACIFIC DISASTER CENTER

Map data ©2016 Google, Imagery ©2016 NASA, TerraMetrics | Terms of Use

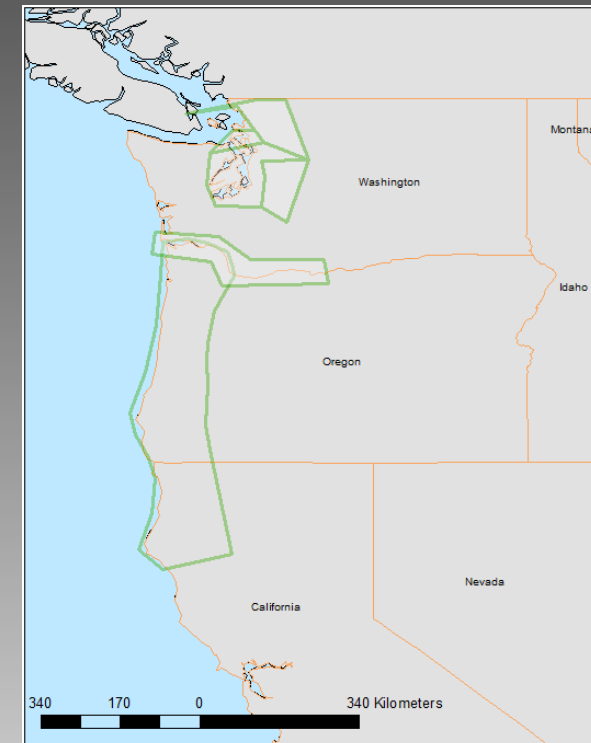
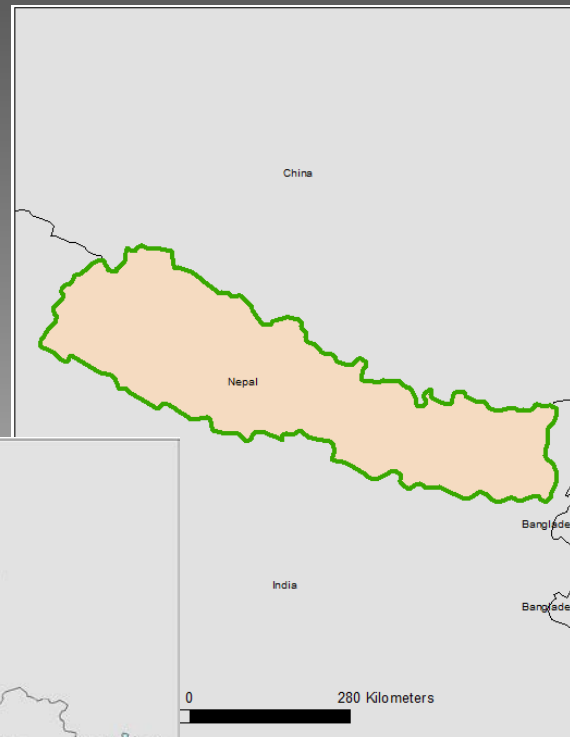
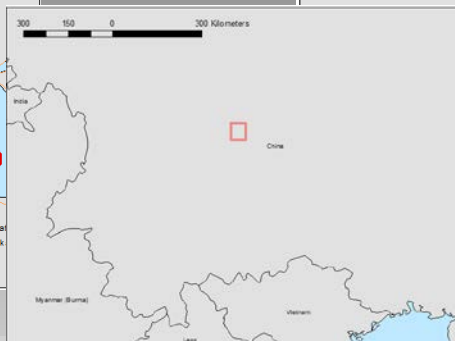
# CEOS Landslide Pilot

- Demonstrate the **effective exploitation** of Earth observations (EO) data and technologies to **detect, map and monitor landslides and landslide prone hillsides**, in different physiographic and climatic regions.
- To apply satellite EO across the **cycle of landslide disaster risk management**, including preparedness, situational awareness, response and recovery with a distinct multi-hazard focus on cascading impacts and risks.

## Study sites:

**Main:** Pacific Northwest,  
Nepal

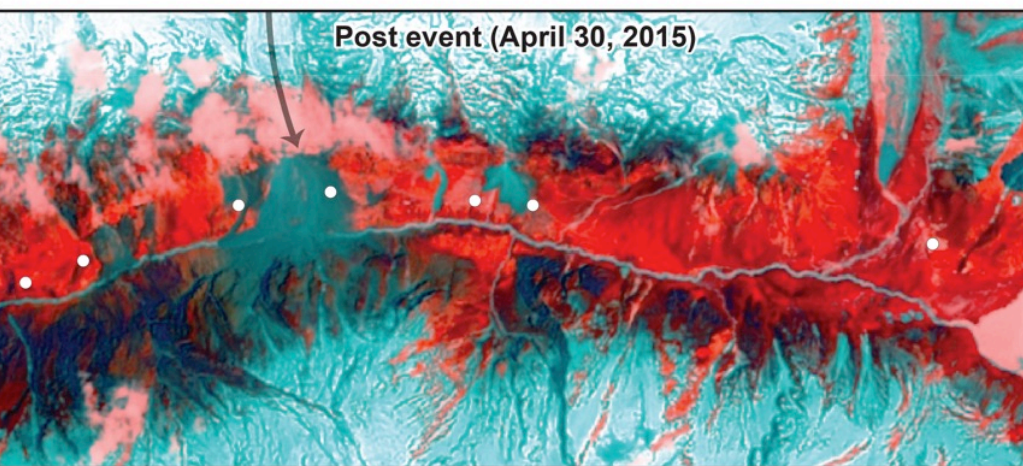
**Experimental:** SE Alaska,  
China, Caribbean, & Peru



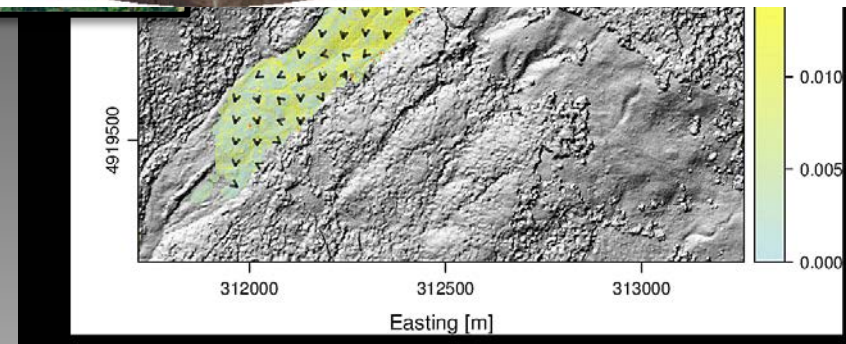
# Observing from space

Motion field of the Debre-Sina landslide (Ethiopia) 2003–2016 from a combination of Landsat-7 and Sentinel-2 images

ASTER Pre- and Post-event Gorkha Earthquake

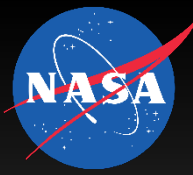


0 0.5 1 2 km



Motion field at La Valette landslide (SE Franch Alps) from a stack of 8 Pléiades images

(Stumpf & Malet, RSE, 2016 – in press)



# Thank you!

## References:

- Kirschbaum, D., T. Stanley, and S. Yatheendradas, 2016: Modeling landslide susceptibility over large regions with fuzzy overlay. *Landslides*, **13**, 485–496, doi:10.1007/s10346-015-0577-2. <http://dx.doi.org/10.1007/s10346-015-0577-2>.
- Kirschbaum, D. B., T. Stanley, and J. Simmons, 2015: A dynamic landslide hazard assessment system for Central America and Hispaniola. *Nat. Hazards Earth Syst. Sci.*, **15**, 2257–2272, doi:10.5194/nhess-15-2257-2015. <http://www.nat-hazards-earth-syst-sci.net/15/2257/2015/>.
- Kirschbaum, D., T. Stanley, and Y. Zhou, 2015: Spatial and temporal analysis of a global landslide catalog. *Geomorphology*, **249**, 4–15, doi:10.1016/j.geomorph.2015.03.016. <http://linkinghub.elsevier.com/retrieve/pii/S0169555X15001579>.
- Stanley, T., and D. B. Kirschbaum, *in review*. A heuristic approach to global landslide susceptibility mapping. *Nat. Hazards*.
- Stanley, T., D. B. Kirschbaum, G. J. Huffman, and R. F. Adler, 2016: Approximating long-term statistics early in the Global Precipitation Measurement era. *Earth Interact.*, **submitted**.