

# Real-time Global Flood Monitoring and Forecasting Using an Enhanced Land Surface Model with Satellite-based and NWP Forcings

Huan Wu, Robert Adler and Yudong Tian

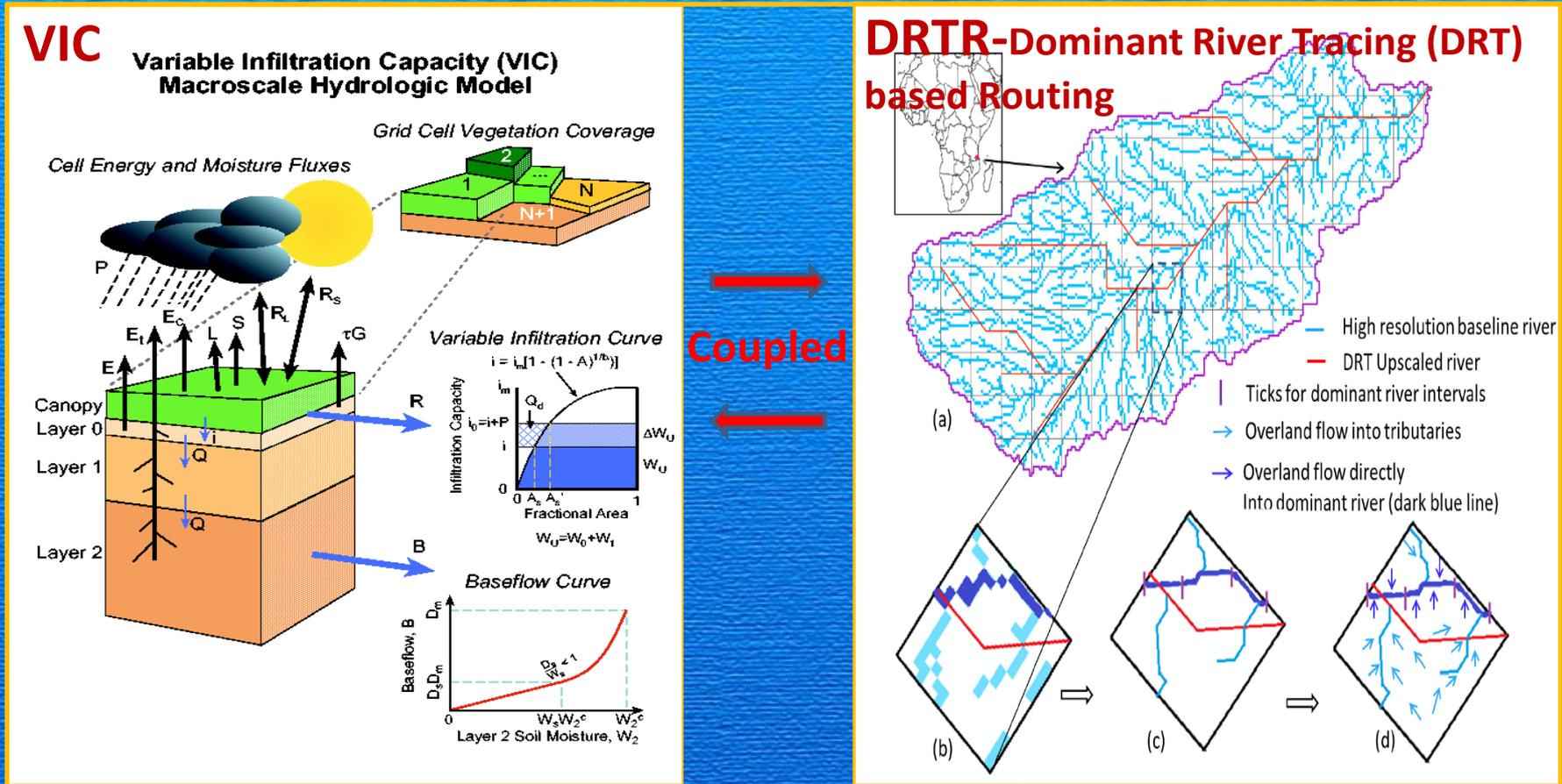


Earth System Science Interdisciplinary Center, University of Maryland, College Park, MD 20740

NASA Goddard Space Flight Center, Greenbelt, MD 20771

# Dominant river tracing-Routing Integrated with VIC Environment (DRIVE) model

(Wu et al., 2011, 2012, 2013 *Water Resources Research*)



University of Washington

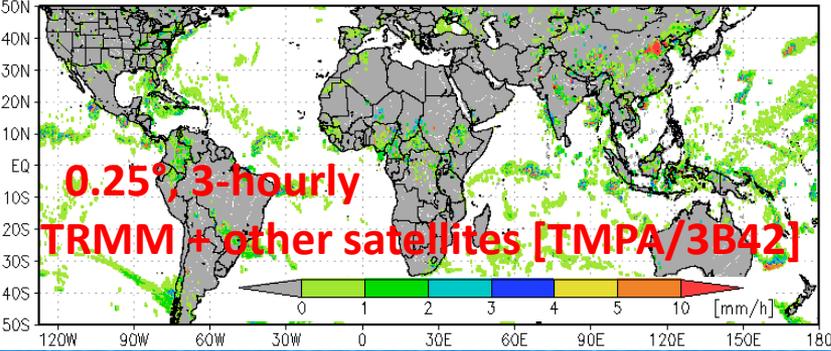
ESSIC, University of Maryland/NASA GSFC

System is running quasi-globally every three hours at  $1/8^{\text{th}}$  degree, and routing is also running at 1km resolution.

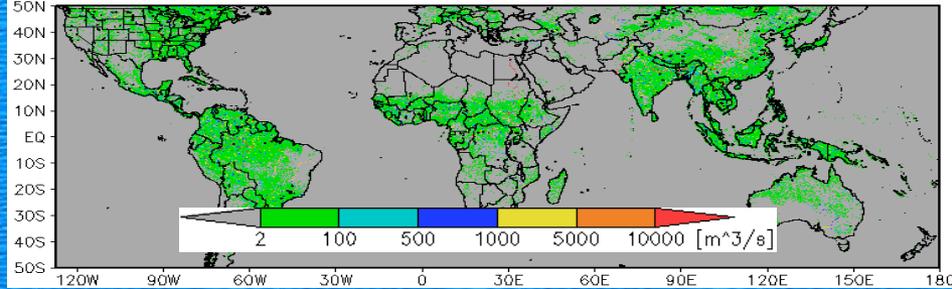
# DRIVE model

<http://flood.umd.edu>

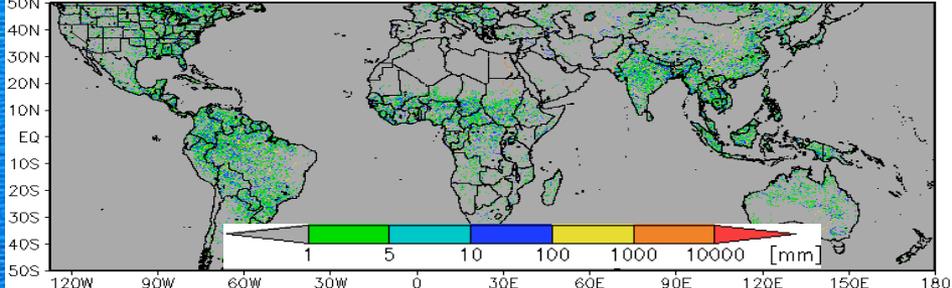
Rainfall (Instantaneous) [mm/h] 15Z01Jul2013



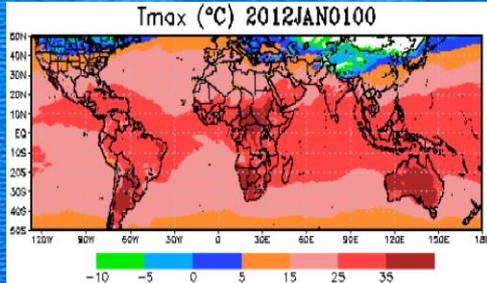
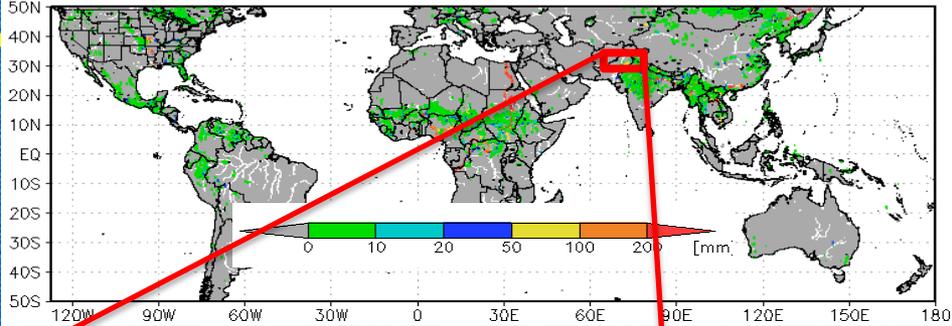
Streamflow 12km res. [ $m^3/s$ ] 06Z26Aug2013



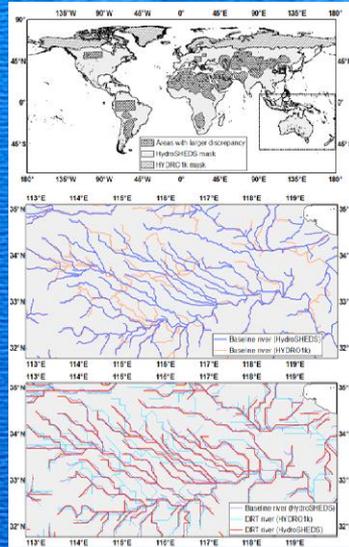
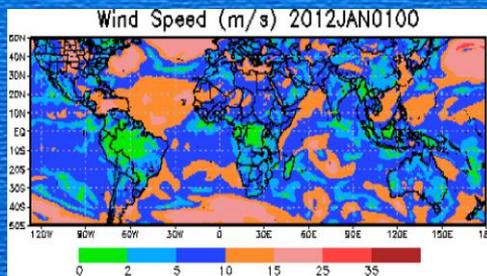
Routed Runoff 12km res. [mm] 06Z26Aug2013



Flood Detection/Intensity (depth above threshold [mm]) 06Z26Aug2013

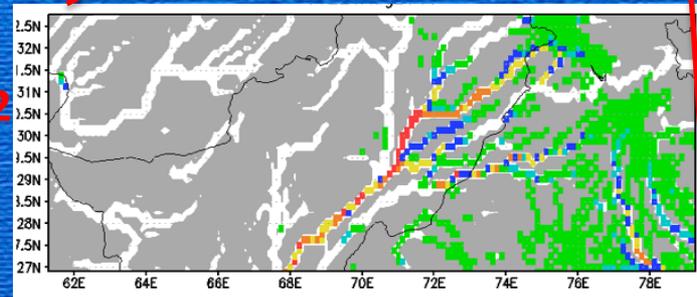


MERRA



DRT, Wu et al., 2012

Soil, Vegetation (Princeton)  
DEM (HydroSHEDS)

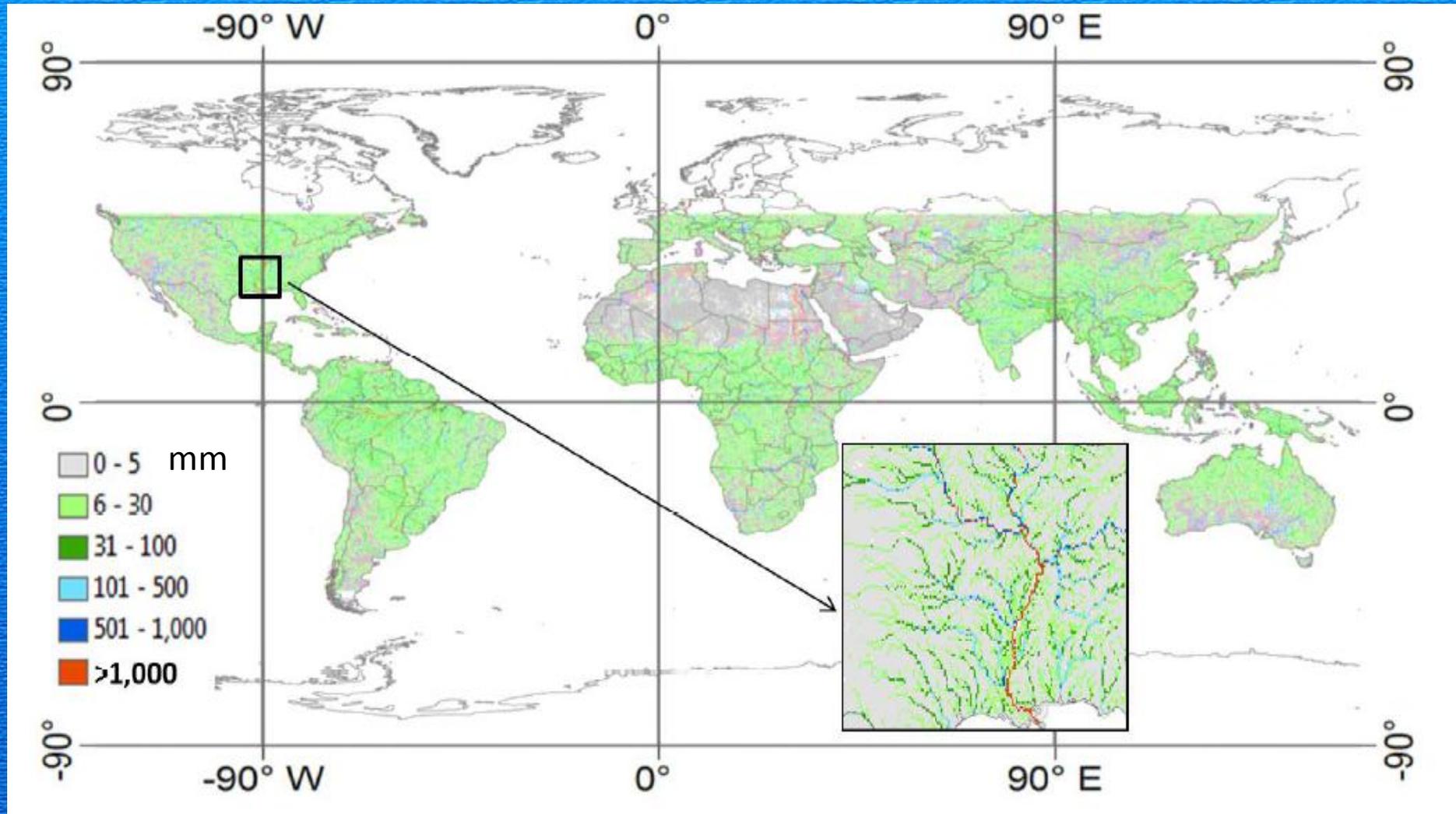


20 August  
2013  
06 GMT

# Routed runoff [mm] based Flood Threshold Map

Threshold =  $P_{95} + \delta$

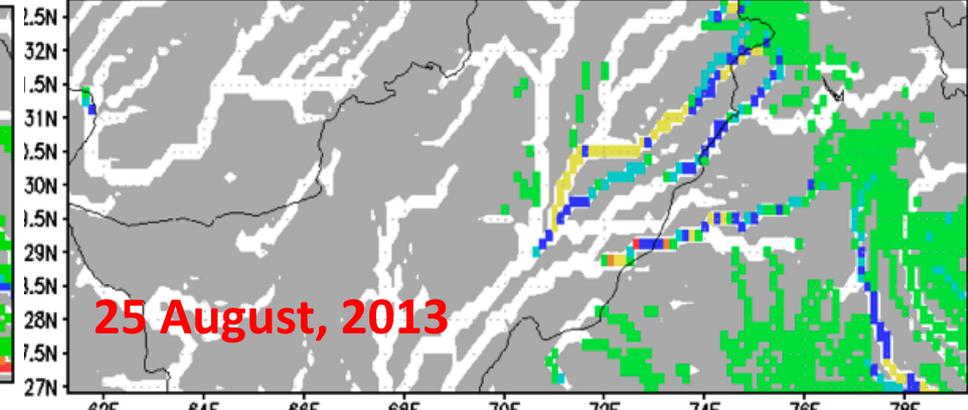
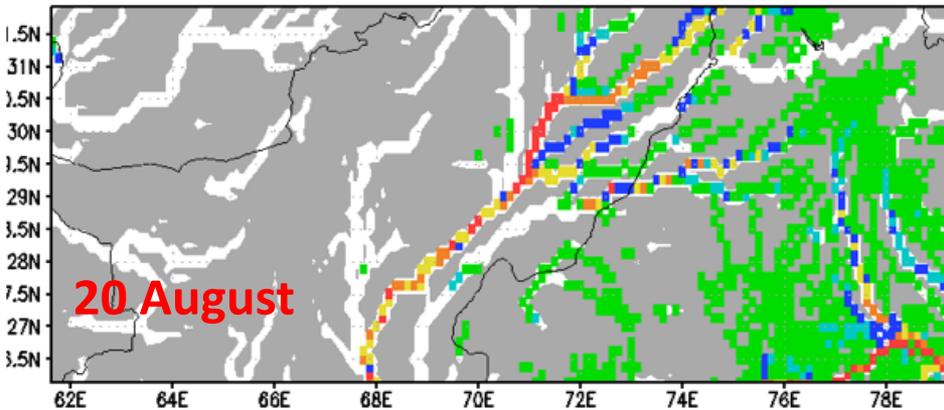
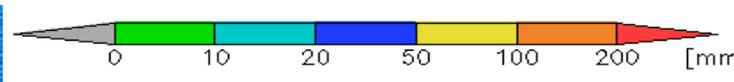
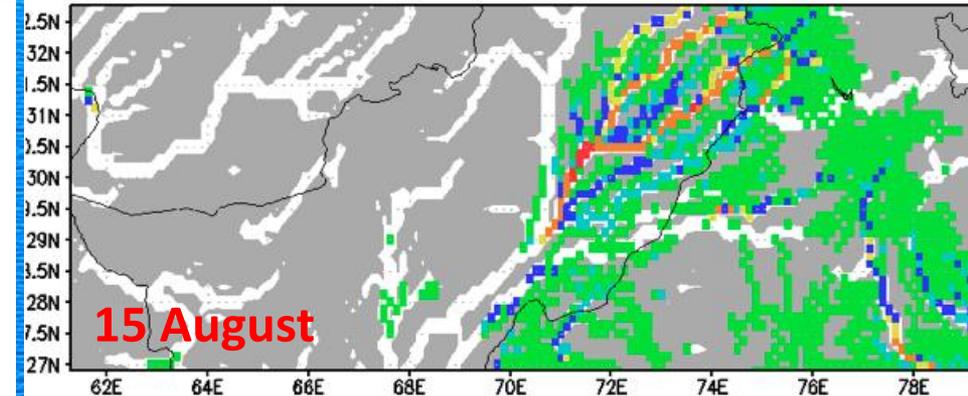
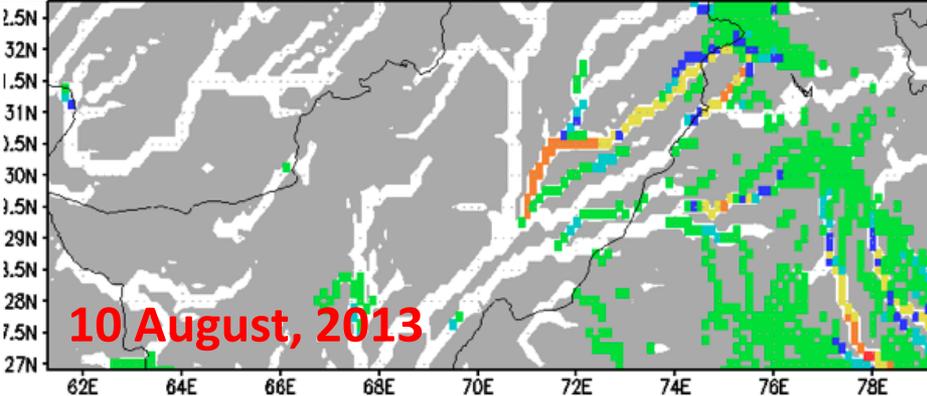
$P_{95}$ : 95<sup>th</sup> percentile value of routed runoff  
 $\delta$ : temporal standard deviation of routed runoff



15-year global hydrology model run using satellite rainfall data.

# Example: Detection of Recent Flooding in Pakistan

## Flood Detection/Intensity (depth above threshold [mm])



$$R > P_{95} + \delta$$

and

$$Q > 10 \text{ m}^3/\text{s}$$

**R:** *routed runoff (mm)*

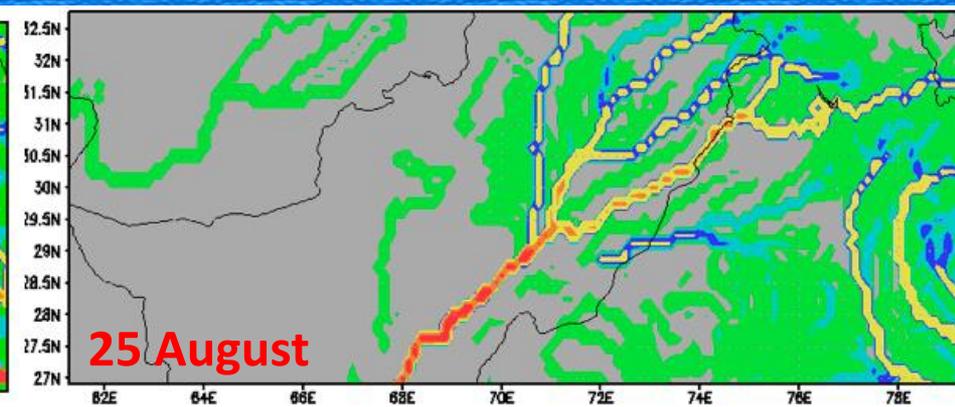
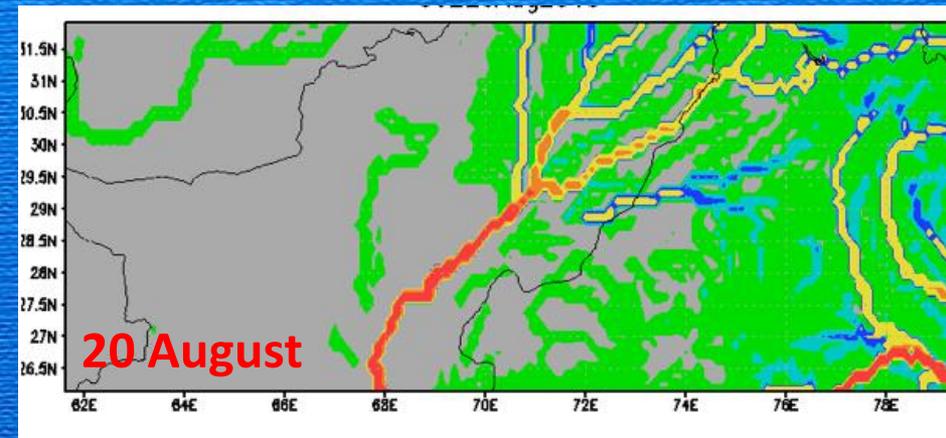
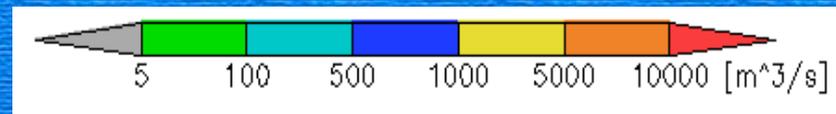
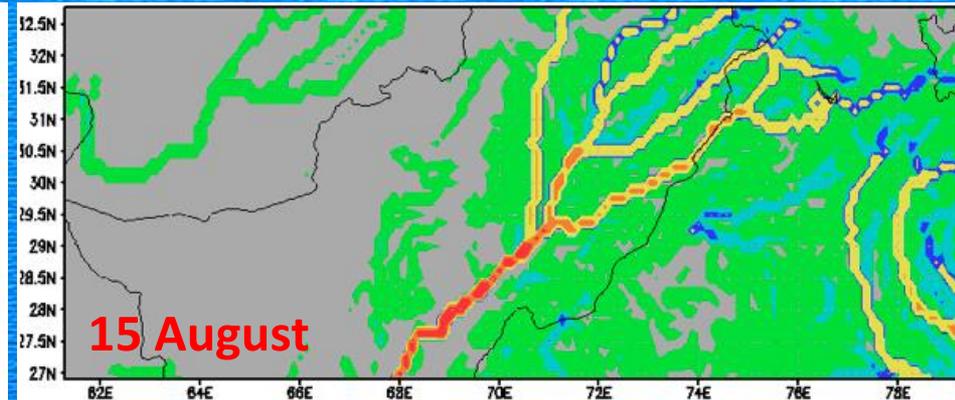
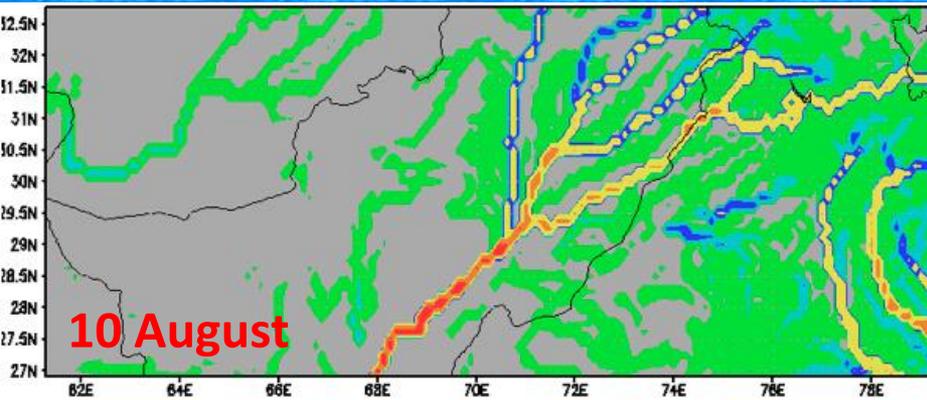
**$P_{95}$ :** *95<sup>th</sup> percentile value of routed runoff*

**$\delta$ :** *temporal standard deviation of routed runoff*

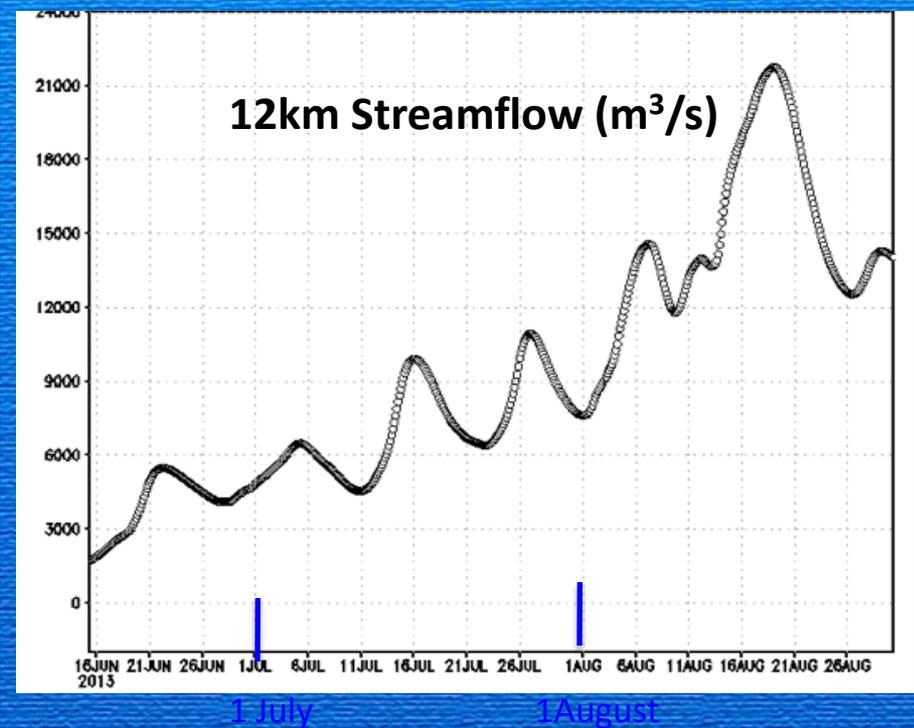
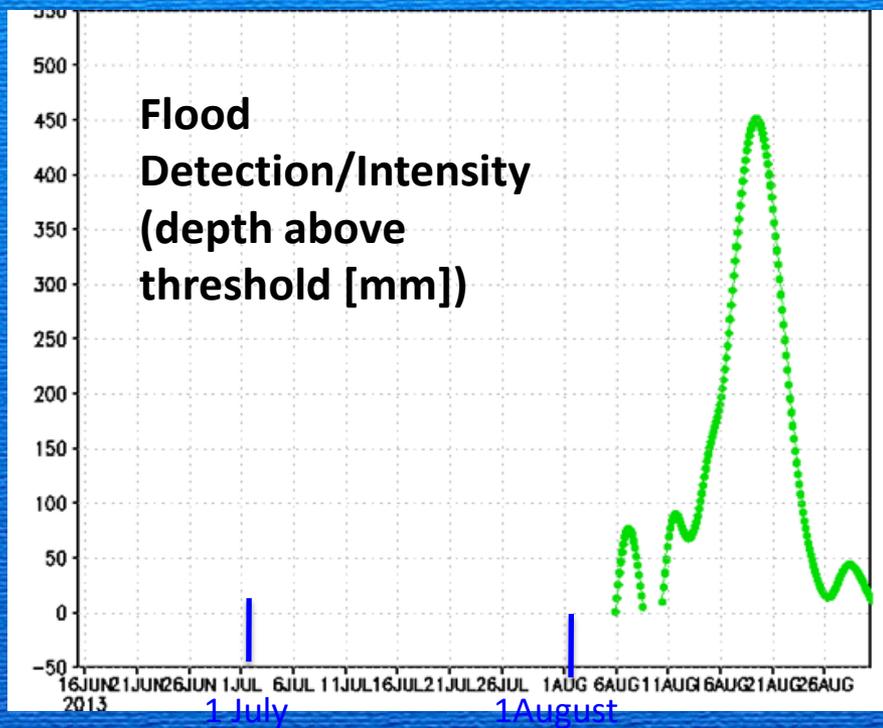
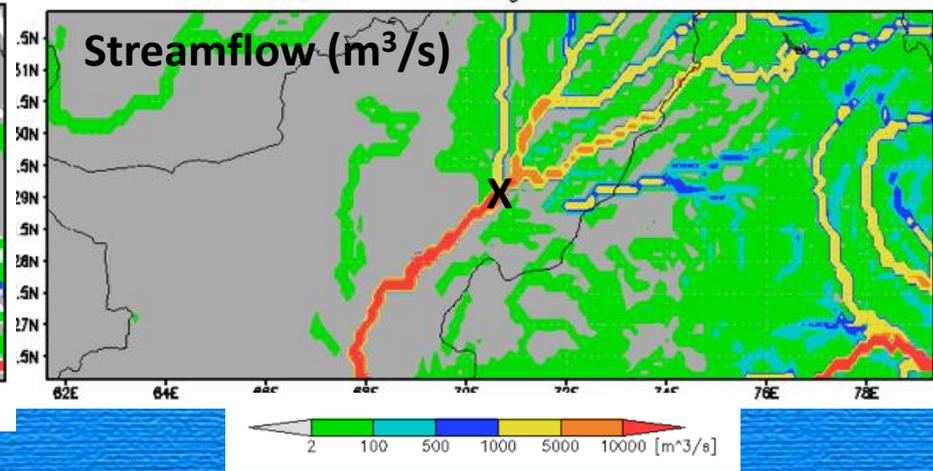
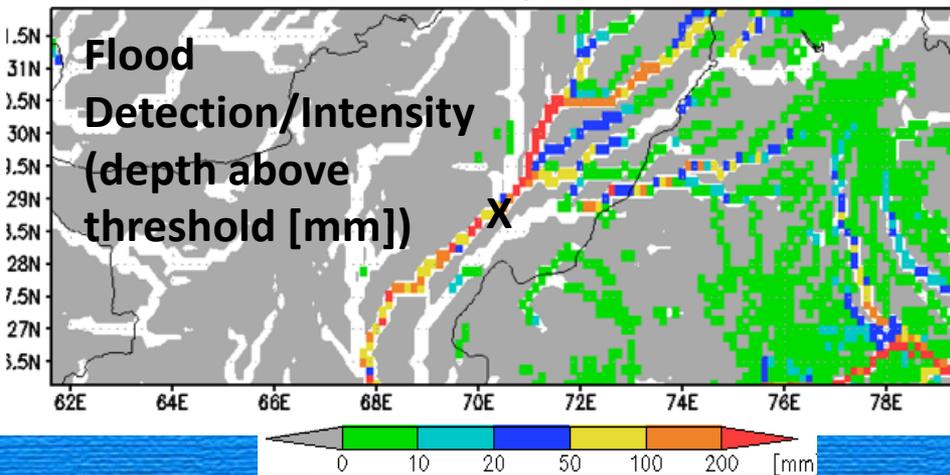
**Q:** *discharge ( $\text{m}^3/\text{s}$ )*

# Streamflow [ $\text{m}^3/\text{s}$ ]

August 10-25, 2013

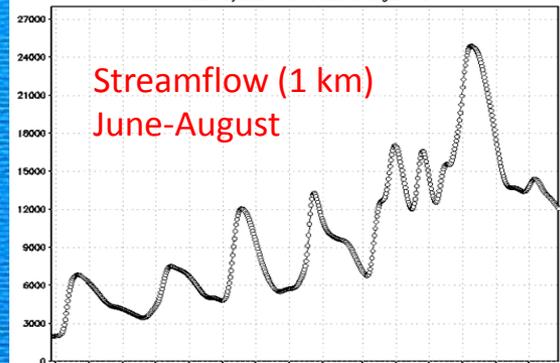
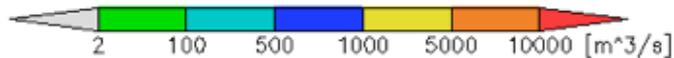


# Recent Flooding in Indus River, Pakistan (20 August 2013)

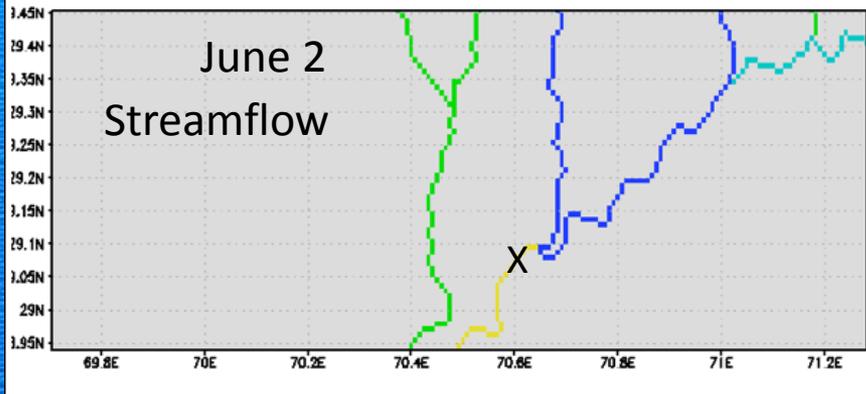


# Real-time Calculations at 1 km

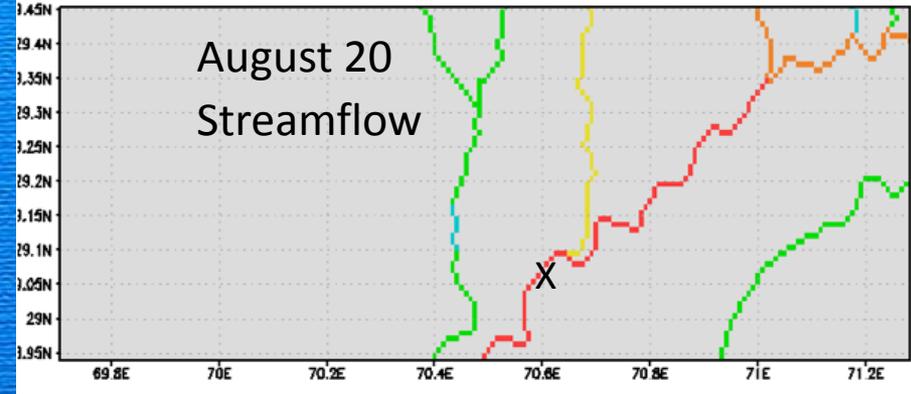
## Streamflow and Water Storage (Routed Runoff + Bank Overflow)



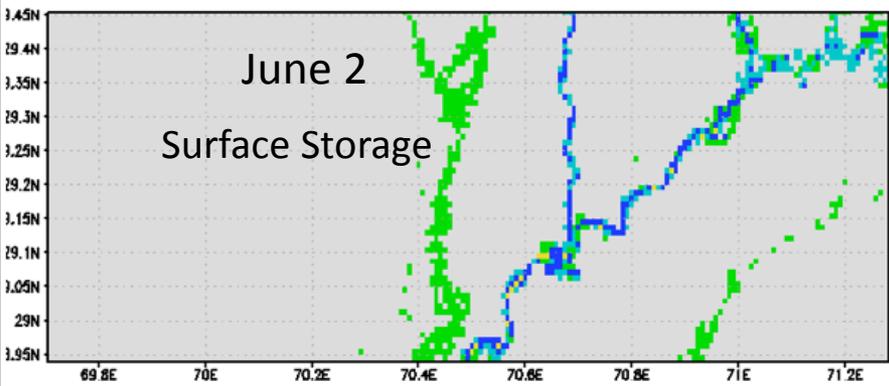
Streamflow 1km res. [ $m^3/s$ ]  
09Z02Jun2013



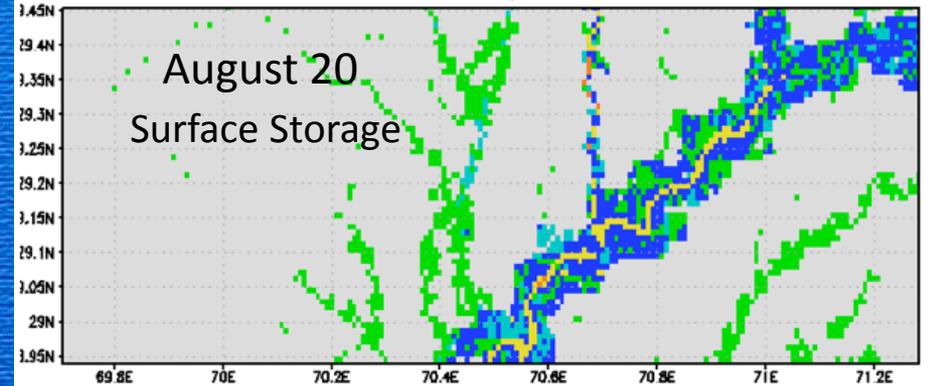
Streamflow 1km res. [ $m^3/s$ ]  
06Z20Aug2013



Surface Storage 1km res. [mm]  
09Z02Jun2013



Surface Storage 1km res. [mm]  
06Z20Aug2013



**Global evaluation** TMPA real-time (DRIVE-RT) and research (rain gauge adjusted, DRIVE-V7) [15yrs (1998~), 3-hrly, 1/8° res.]

(1) **Flood event** based evaluation using 2,086 archived flood events by Dartmouth Flood Observatory

(2) **Streamflow** based evaluation at 1,121 river gauges by GRDC, across the globe.

Real-time Global Flood Estimation using Satellite-based Precipitation and a Coupled Land Surface and Routing Model (2013). Wu, Adler et al. Submitted to WRR

[manuscript available on <http://flood.umd.edu/>]

# Flood event based evaluation

## Flooding at a point

$$R > P_{95} + \delta$$

and

$$Q > 10 \text{ m}^3/\text{s}$$

$R$ : *routed runoff (mm)*

$P_{95}$ : *95<sup>th</sup> percentile value of routed runoff*

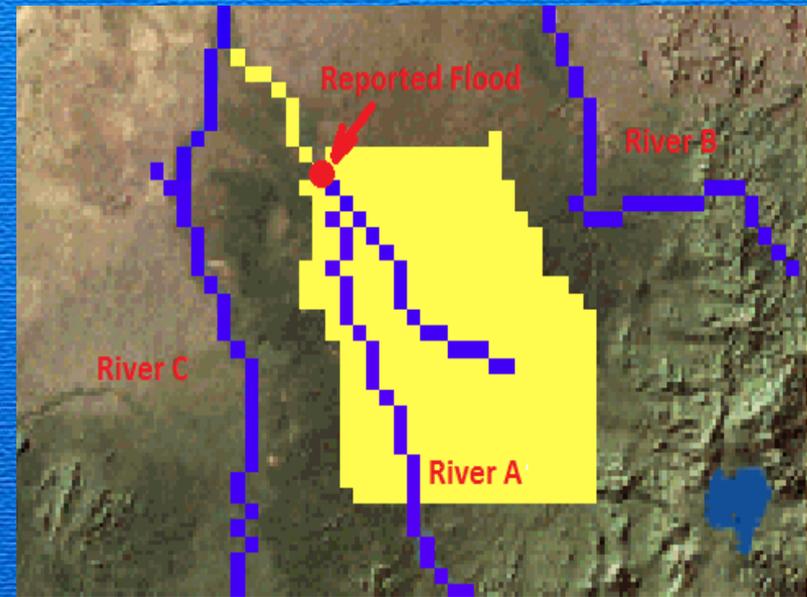
$\delta$ : *temporal standard deviation of routed runoff*

$Q$ : *discharge (m<sup>3</sup>/s)*

## Matching floods between simulated and reported

**Temporal window:**  $\pm 1$  days

**Spatial window:** all upstream basin area within  $\sim 200$  km &  $\sim 100$  km downstream stem river



Wu H., R. F. Adler, Y. Hong, Y. Tian, and F. Policelli (2012), *Evaluation of Global Flood Detection Using Satellite-Based Rainfall and a Hydrologic Model*. *J. Hydrometeorol*, 13, 1268.1284.

**Flood detection verification against the Dartmouth Flood Observatory (DFO) flood database over the 38 Well Reported Areas (WRAs) for floods with duration more than 3 days.**

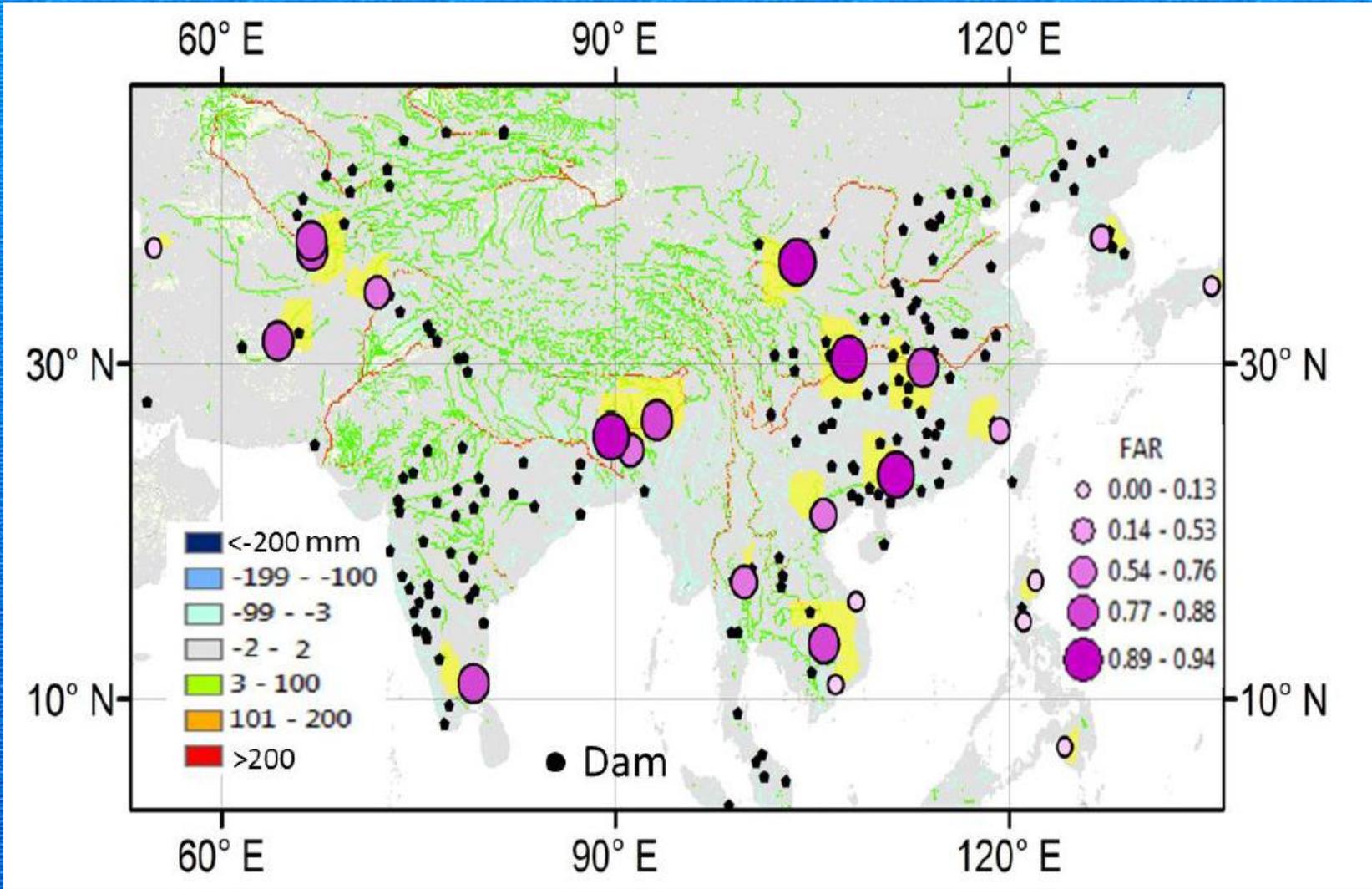
<b>Metrics</b>	<b>POD</b>	<b>FAR</b>	<b>CSI</b>
<i>Metrics averaged over all the 38 WRAs</i>			
DRIVE-V7RT	0.90	0.73	0.25
DRIVE-V7	0.93	0.65	0.34
<i>Metrics averaged over the 20 WRAs with <math>\geq 5</math> dam</i>			
DRIVE-V7RT	0.93	0.80	0.19
DRIVE-V7	0.94	0.73	0.26
<i>Metrics averaged over the 18 WRAs with <math>&lt; 5</math> dam</i>			
DRIVE-V7RT	0.87	0.66	0.32
DRIVE-V7	0.92	0.56	0.43

*Better flood detection statistics with “research” (instead of RT) rain, with fewer dams (drop in FAR) and for longer, larger floods*

***Bottom line--For 3-day floods in basins with few dams using RT rainfall:  
POD ~ 0.9    FAR ~ 0.7***

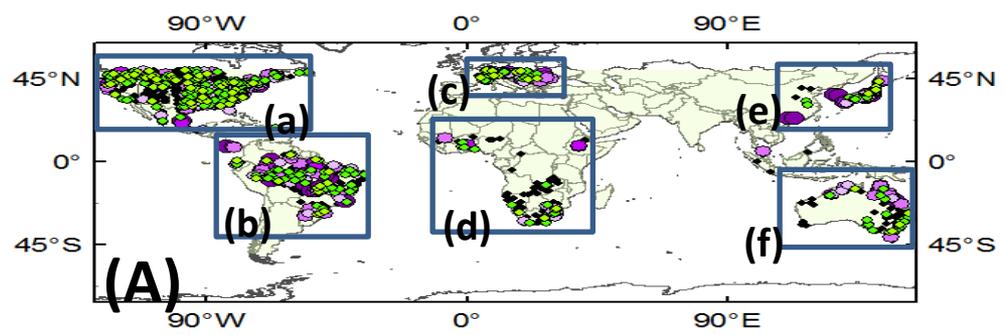
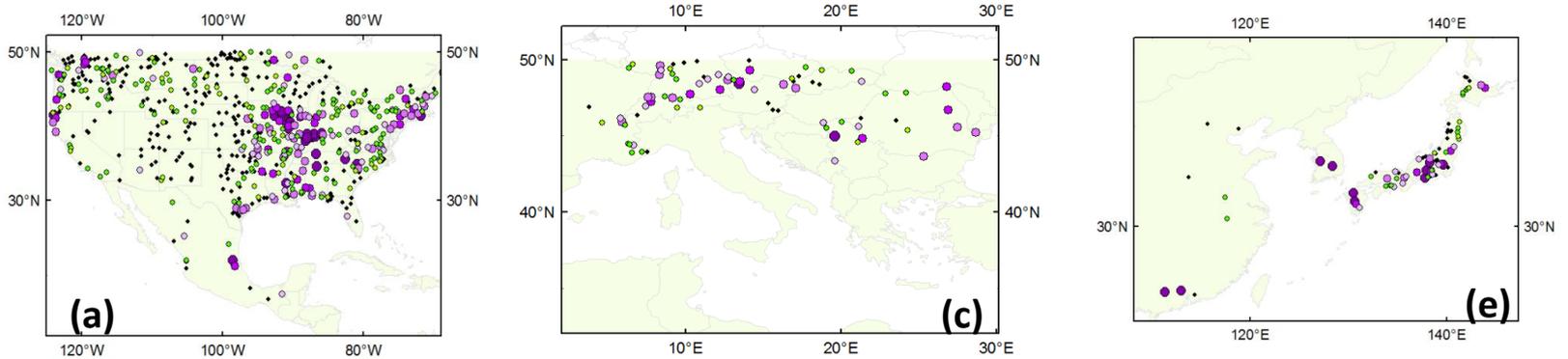
# Validation Against Global Flood Events (Dartmouth Flood Observatory)

Example of Well Reported Areas [WRAs] (shaded in yellow) and their corresponding FAR metrics for all floods with duration greater than 1 day

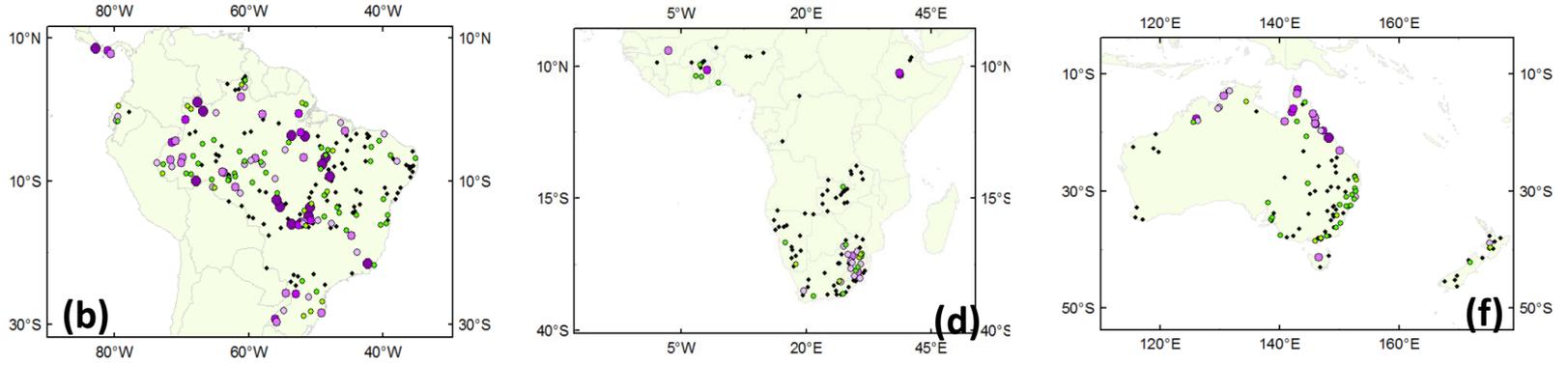


# River gauges based evaluation

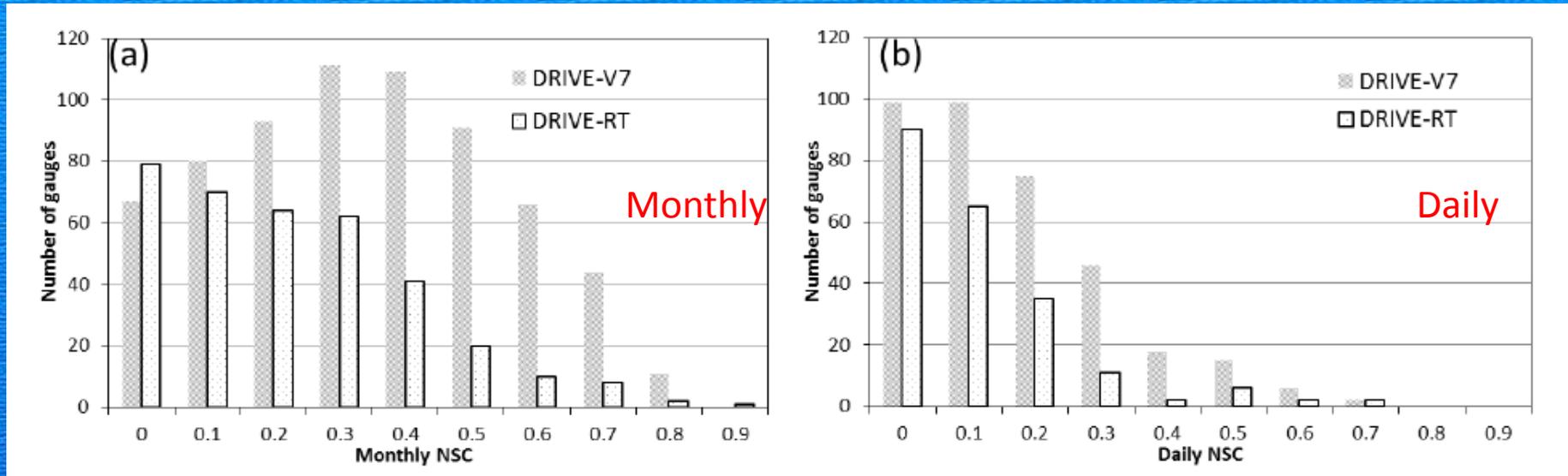
# DRIVE-V7 (12km res.)



## 1,121 GRDC streamflow gauges



## Distribution of the number of gauges with positive monthly and daily NSC metrics for DRIVE-V7 and DRIVE-RT simulation for 2001-2011, respectively



Better NSC statistics for “research” rainfall indicate potential improvement of streamflow estimations when satellite rainfall improves

# Comparison with GRDC Streamflow Gauges

Nash-Sutcliffe (NSC) Daily and Monthly  
Mean annual Relative Error (MARE)

		Daily NSC		Monthly NSC		Correlation Coeff.		MARE<30%
		$N_d > 0$	$N_d > 0.4$	$N_m > 0$	$N_m > 0.4$	$R_d > 0.4$	$R_m > 0.4$	
<i>Global (-50°S to 50°N) with 1,121 gauges</i>								
% of gauges	V7	32	4	60	29	58	99	38
	V7RT	19	1	32	7	42	95	27
Mean metrics	V7	0.22	0.52	0.39	0.57	0.57	0.67	-0.3%
	V7RT	0.16	0.57	0.27	0.54	0.53	0.53	-2.9%
<i>-10°S~10°N with 141 gauges</i>								
% of gauges	V7	44	9	62	31	76	99	44
	V7RT	39	6	57	22	75	98	51
Mean metrics	V7	0.25	0.55	0.41	0.58	0.64	0.70	-6.8%
	V7RT	0.23	0.60	0.36	0.58	0.61	0.66	-5.5%

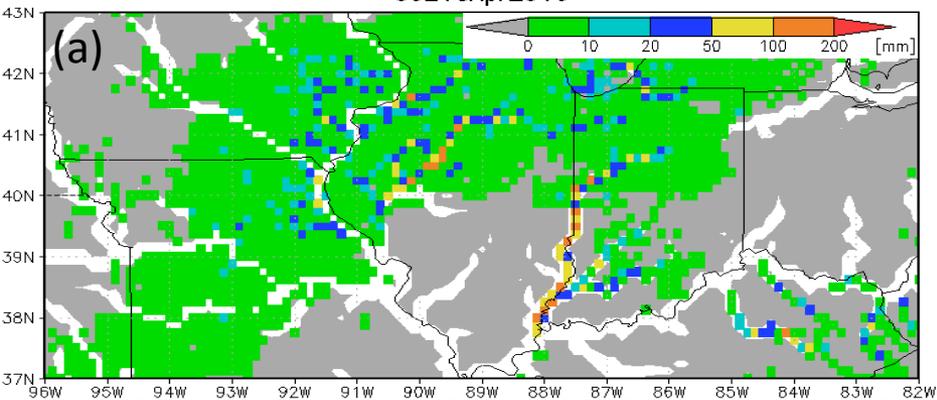
*Results are positive, but show considerable room for improvement*

*Tropics show better results than global, indicating problems in cool season, higher latitudes; research precipitation shows generally better results over real-time.*

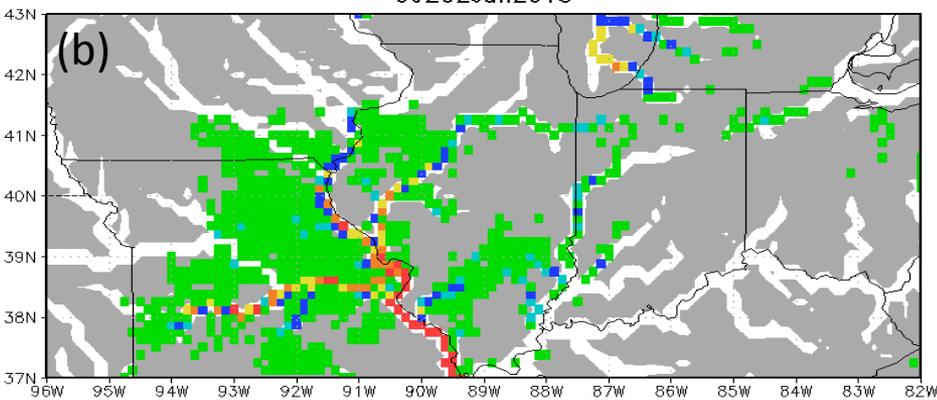
*Tropics show lower bias with RT, indicating research procedure to reduce rain bias with rain gauges not working well in tropics where rain gauges are sparse*

# Evaluation of on-line events

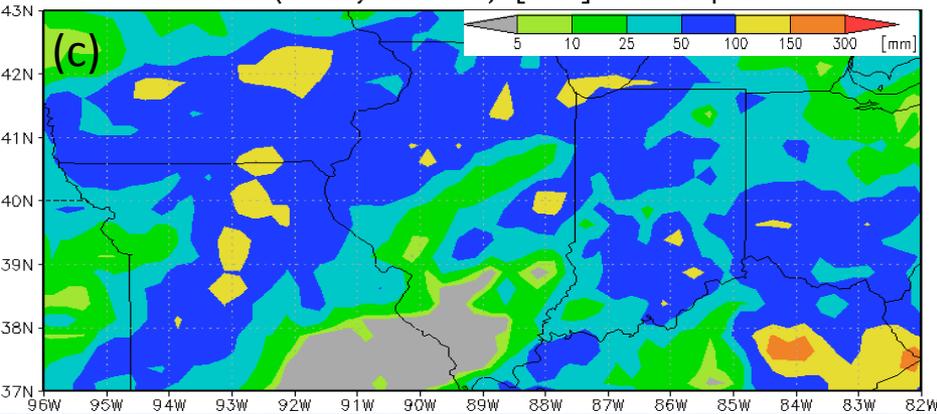
Flood Detection/Intensity (depth above threshold [mm])  
09Z18Apr2013



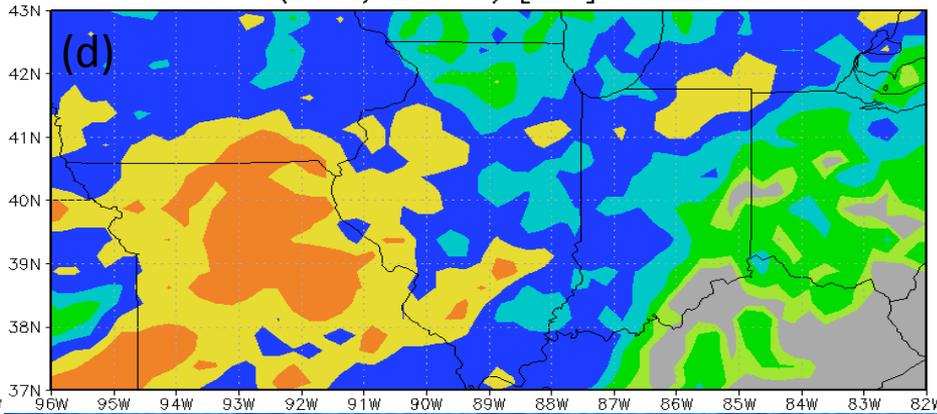
Flood Detection/Intensity (depth above threshold [mm])  
09Z02Jun2013



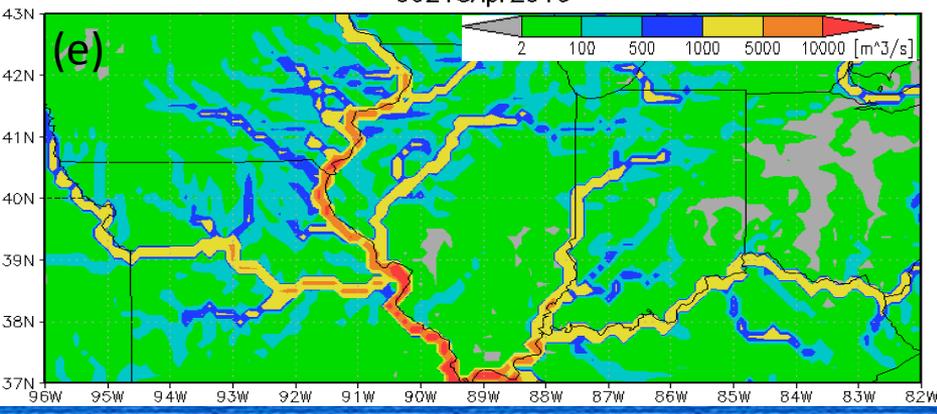
Rainfall (7-day accum.) [mm] 09Z18Apr2013



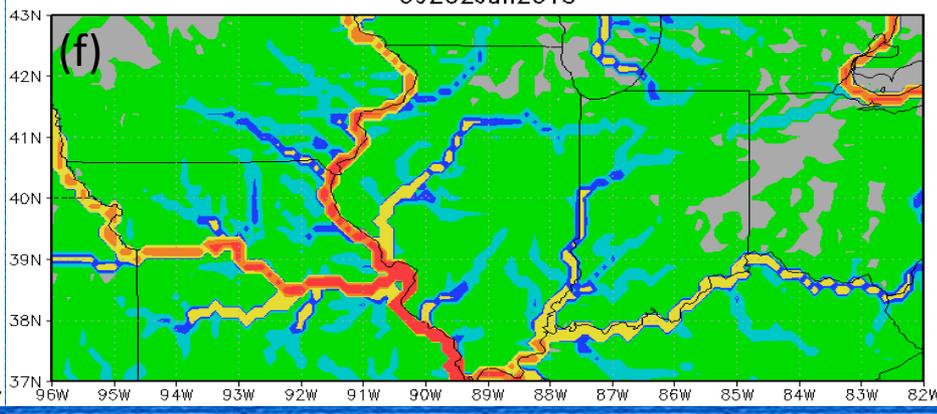
Rainfall (7-day accum.) [mm] 09Z02Jun2013



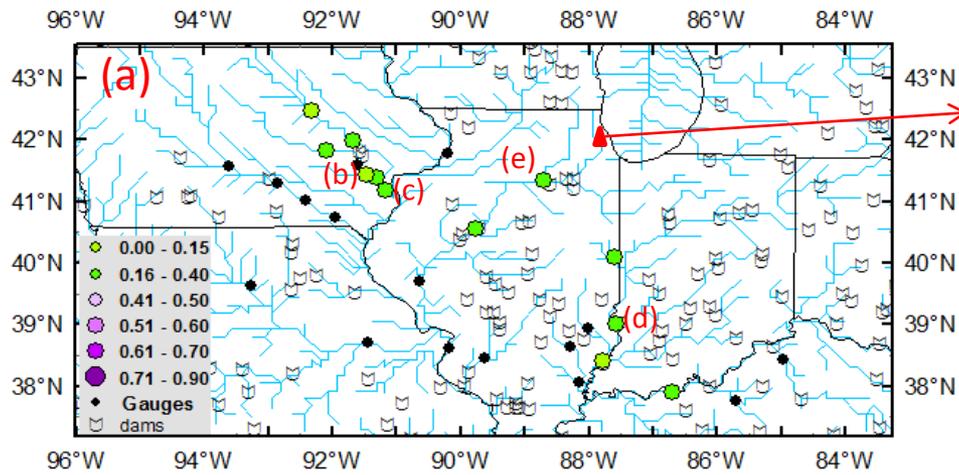
Streamflow 12km res. [m<sup>3</sup>/s]  
09Z18Apr2013



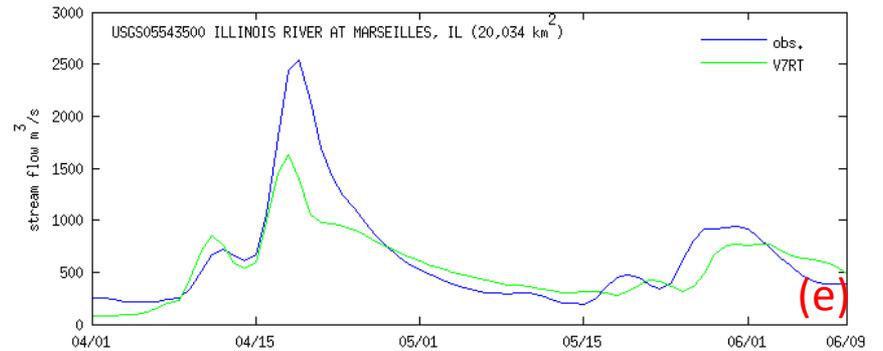
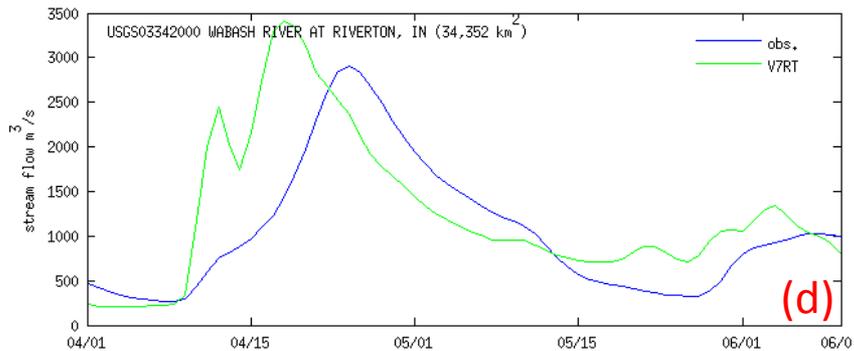
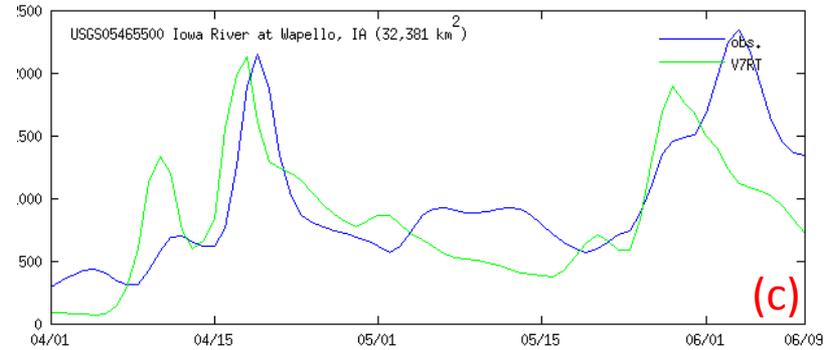
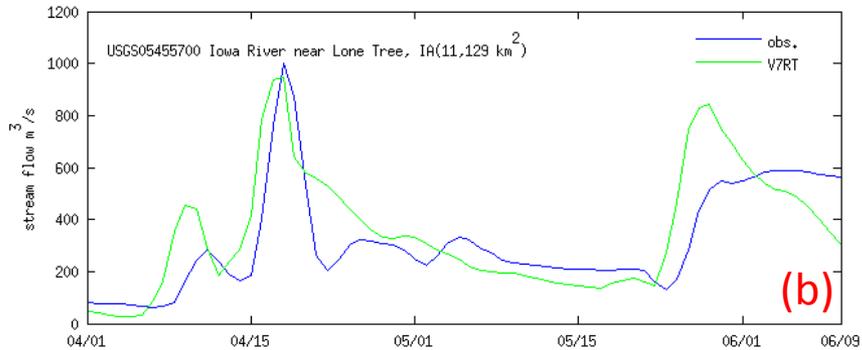
Streamflow 12km res. [m<sup>3</sup>/s]  
09Z02Jun2013



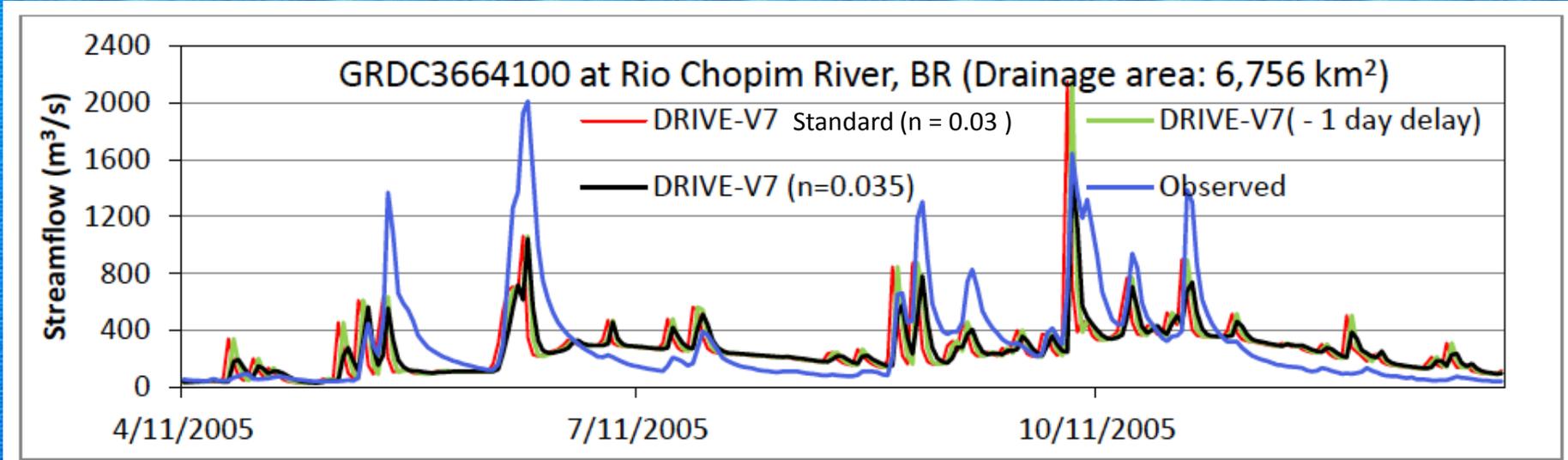
# 41% (12) out of 29 gauges with daily NSC>0 with mean of 0.23



Internet source: April 19, 2013, Des Plaines, IL



## Flood Wave Too Fast?



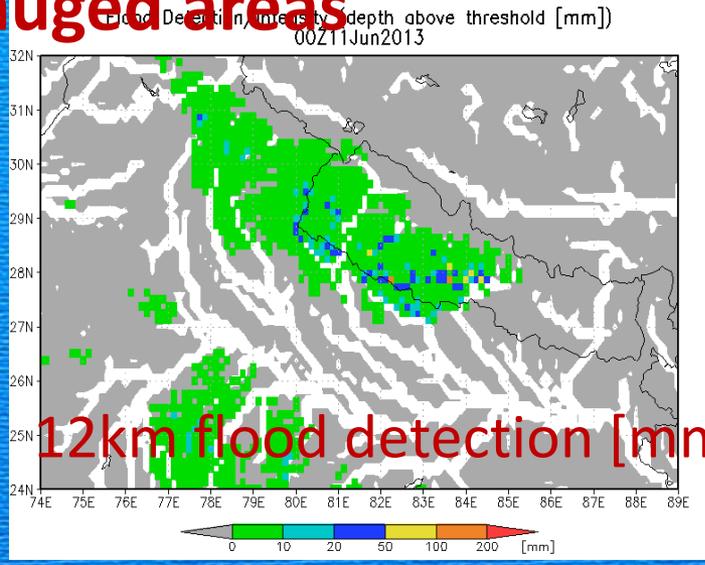
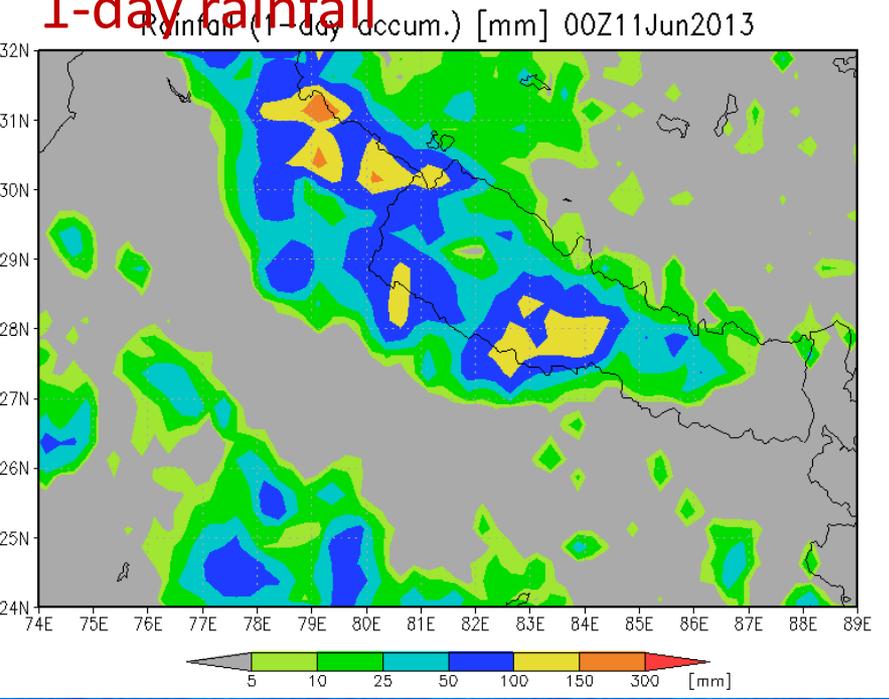
Experiment 1: Example hydrograph with 1 day lag gives better results. Larger rivers may have larger lag.

Experiment 2: Increase of Manning parameter (streambed roughness) to .035 (from .03) also provides better timing—in this one case.

Further model tuning and calibration will likely improve results.

# Evaluation of on-line events in ungauged areas

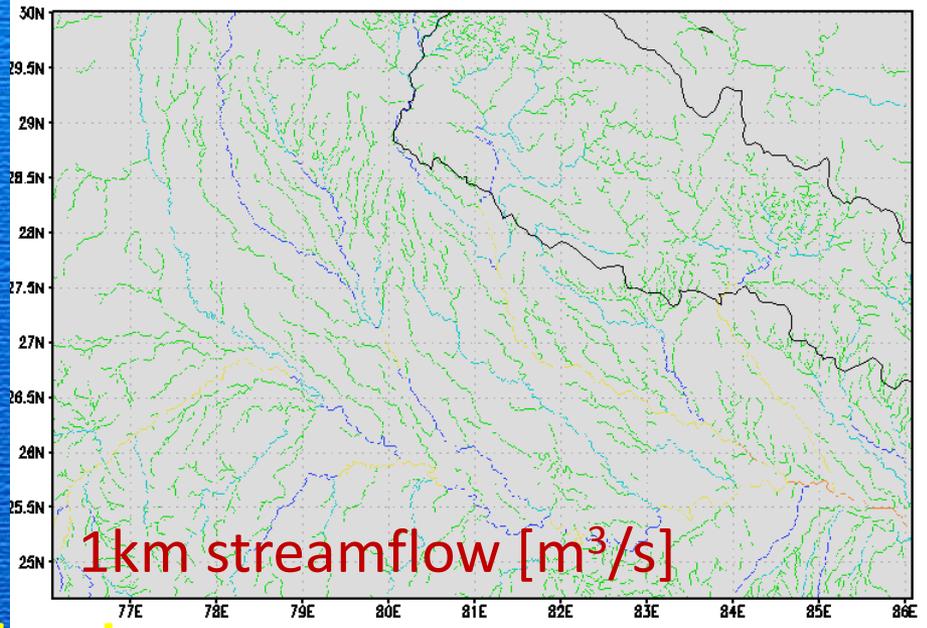
## 1-day rainfall



12km flood detection [mm]

“The last 10-day flood evolution, rainfall, and streamflow simulations (at 1km resolution) for north India (north sub-basins of Ganges) The flood during last week has been reported killing more than 130 people in this area.”

## Streamflow 1km res. [m<sup>3</sup>/s]

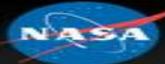


1km streamflow [m<sup>3</sup>/s]

<http://flood.umd.edu/temp/share.html>

United States		Austria		Korea, Republic Of		Honduras	
Italy		Germany		Cameroon		Cambodia	
Australia		Canada		Chile		Greece	
Poland		Russian Federation		Egypt		Malawi	
China		Indonesia		Peru		Europe	
Spain		France		South Africa		Iran, Islamic Republic Of	
Colombia		Sweden		Kenya		Sudan	
Switzerland		Malaysia		Argentina		Norway	
Philippines		Japan		Venezuela		Netherlands	
Thailand		Brazil		Ethiopia		Fiji	
United Kingdom		Uruguay		Nicaragua		Turkey	
India		Pakistan				Mexico	

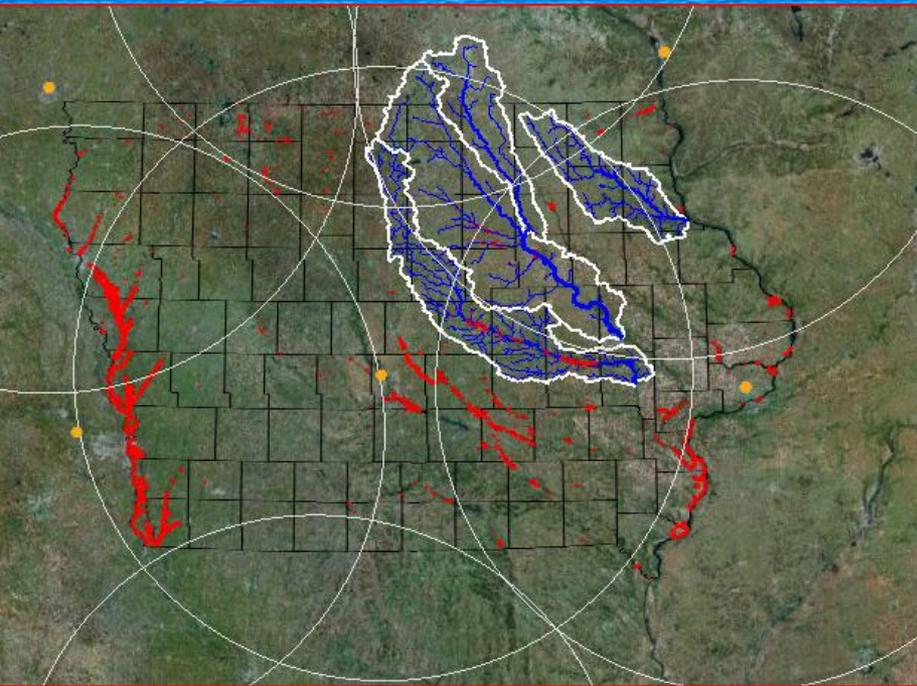




# IFloods

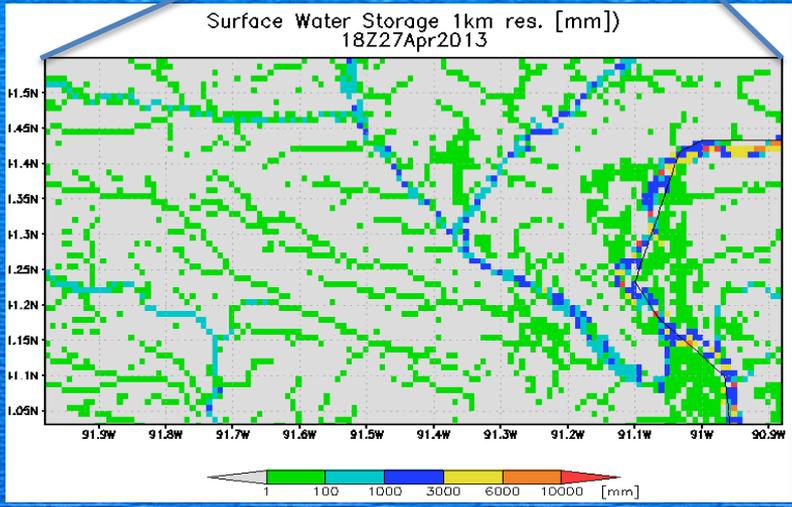
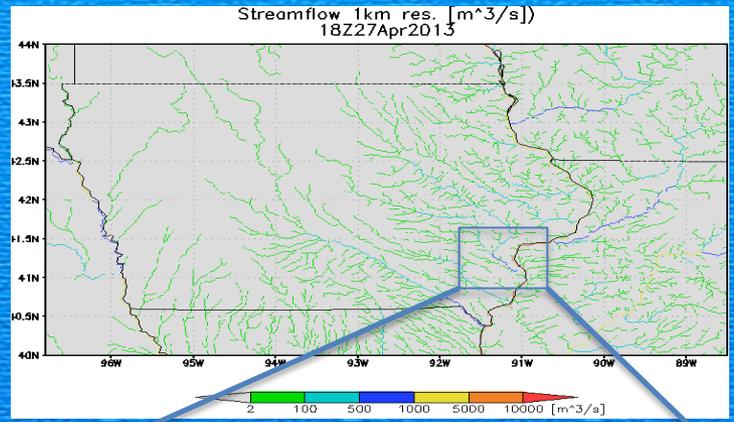
Iowa Flood Studies

## GPM Ground Validation

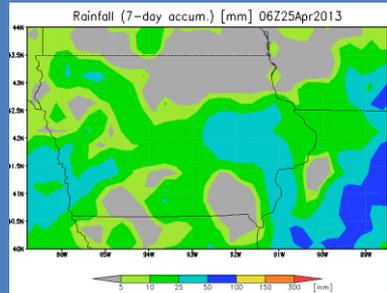


<https://fcportal.nsstc.nasa.gov/ifloods/>

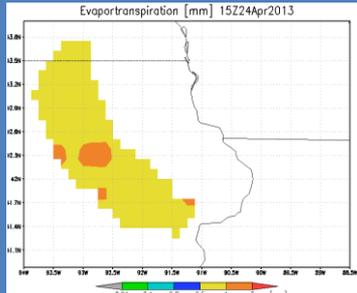
<http://flood.umd.edu/IFloods.html>



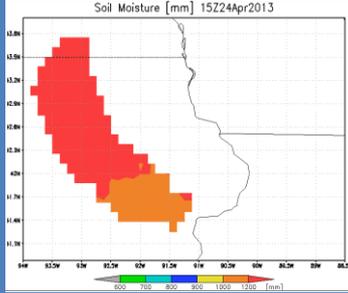
### Precipitation



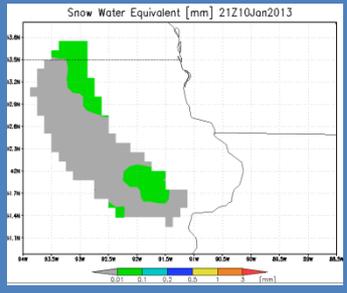
### Evapotranspiration



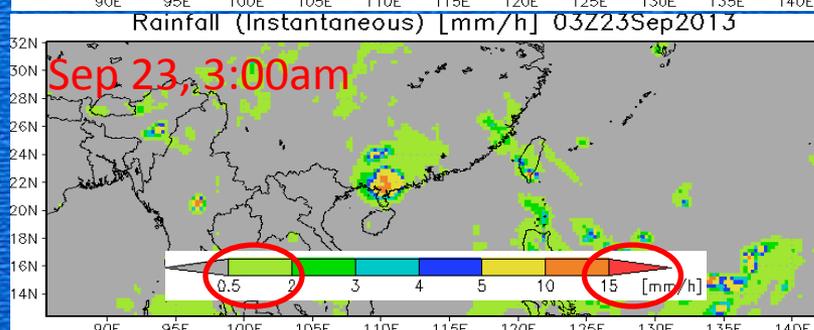
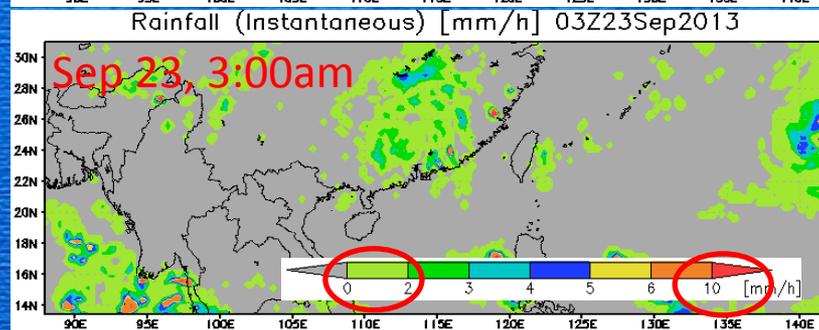
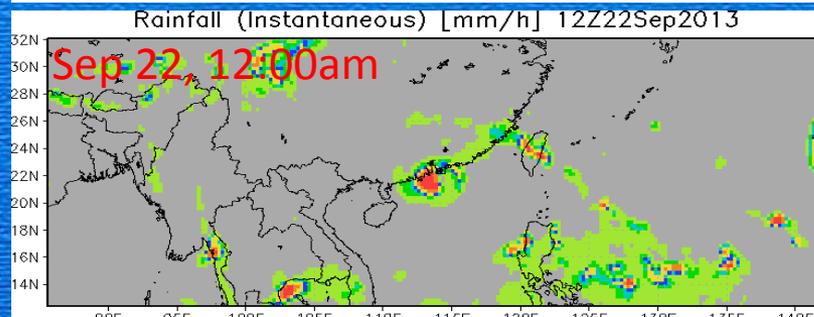
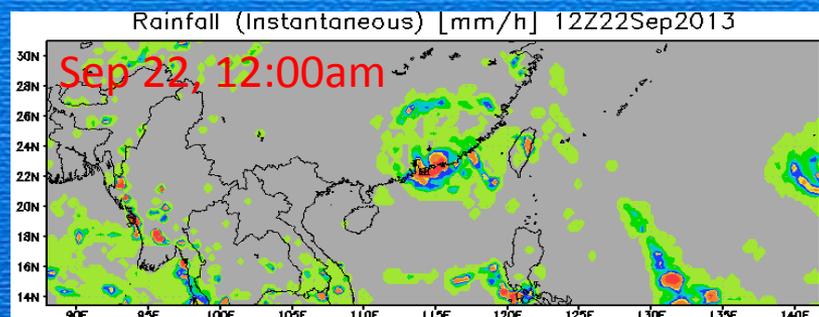
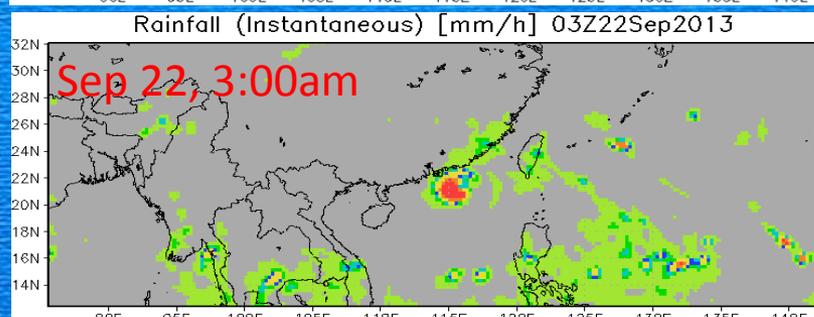
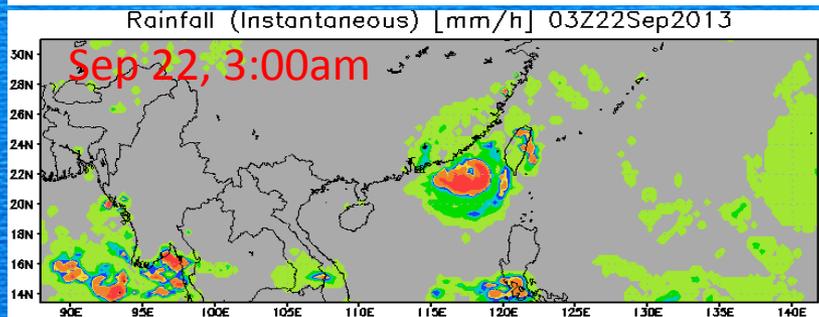
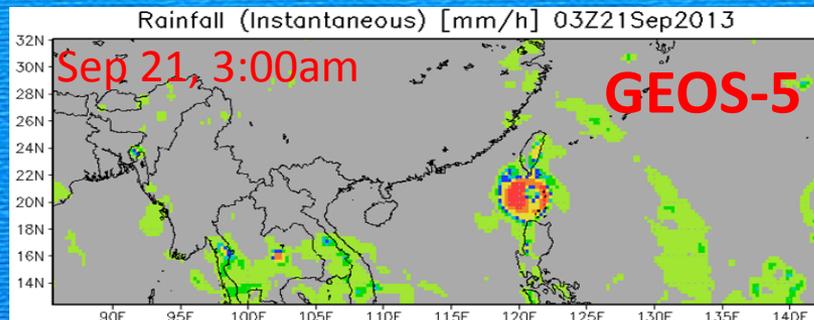
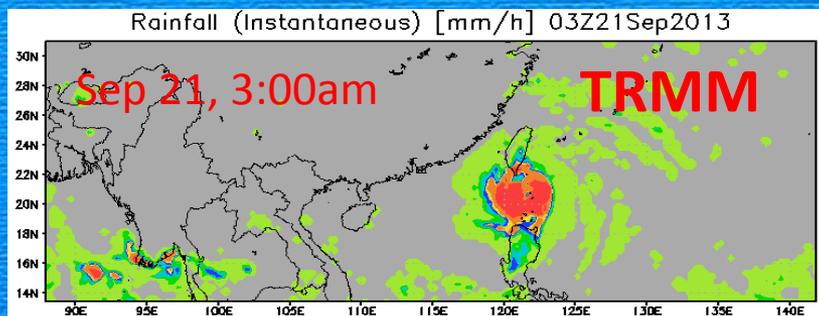
### Soil moisture



### SWE



# ~5-day lead Flood Forecasting

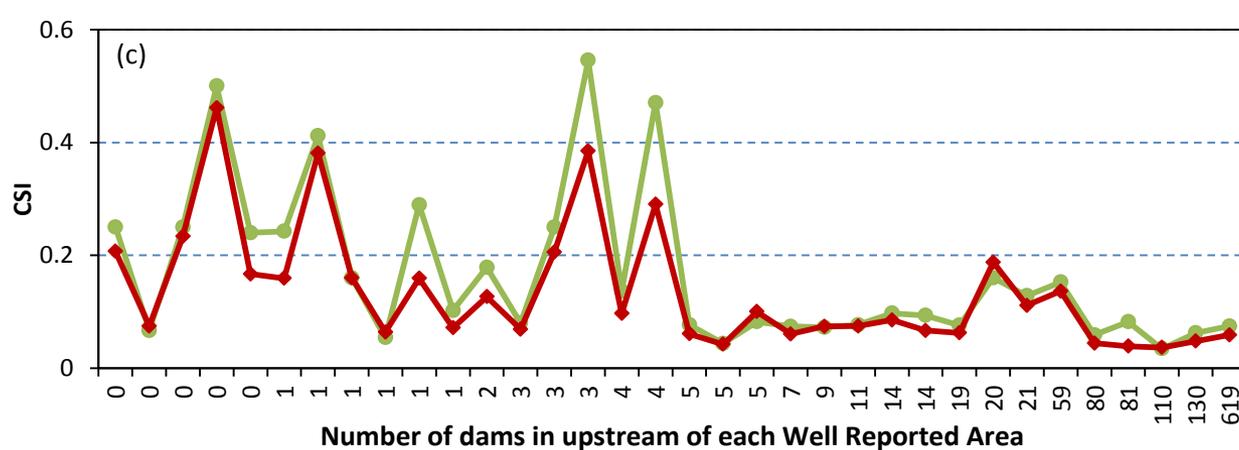
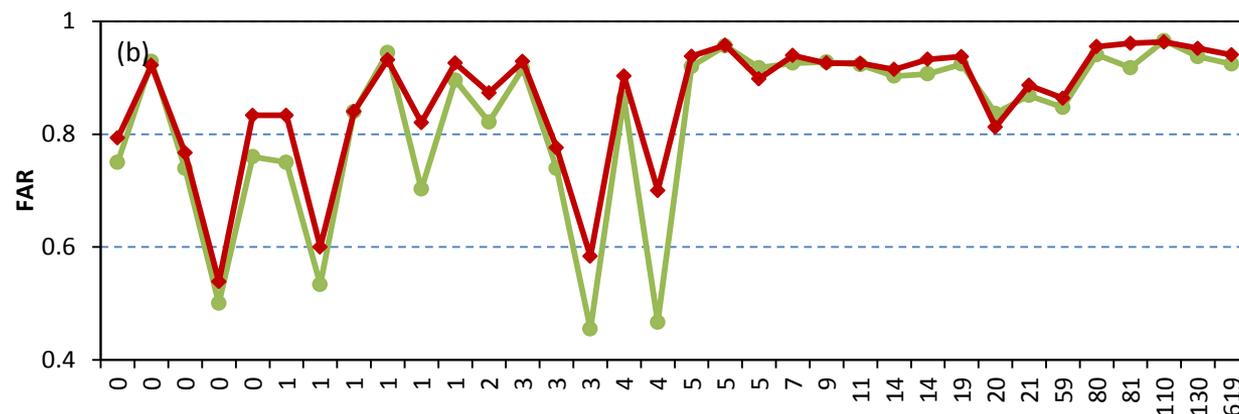
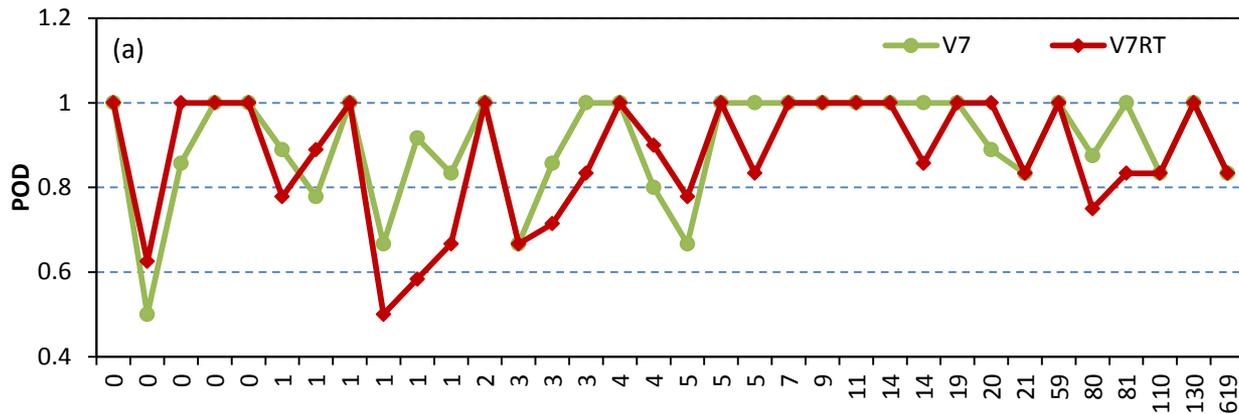


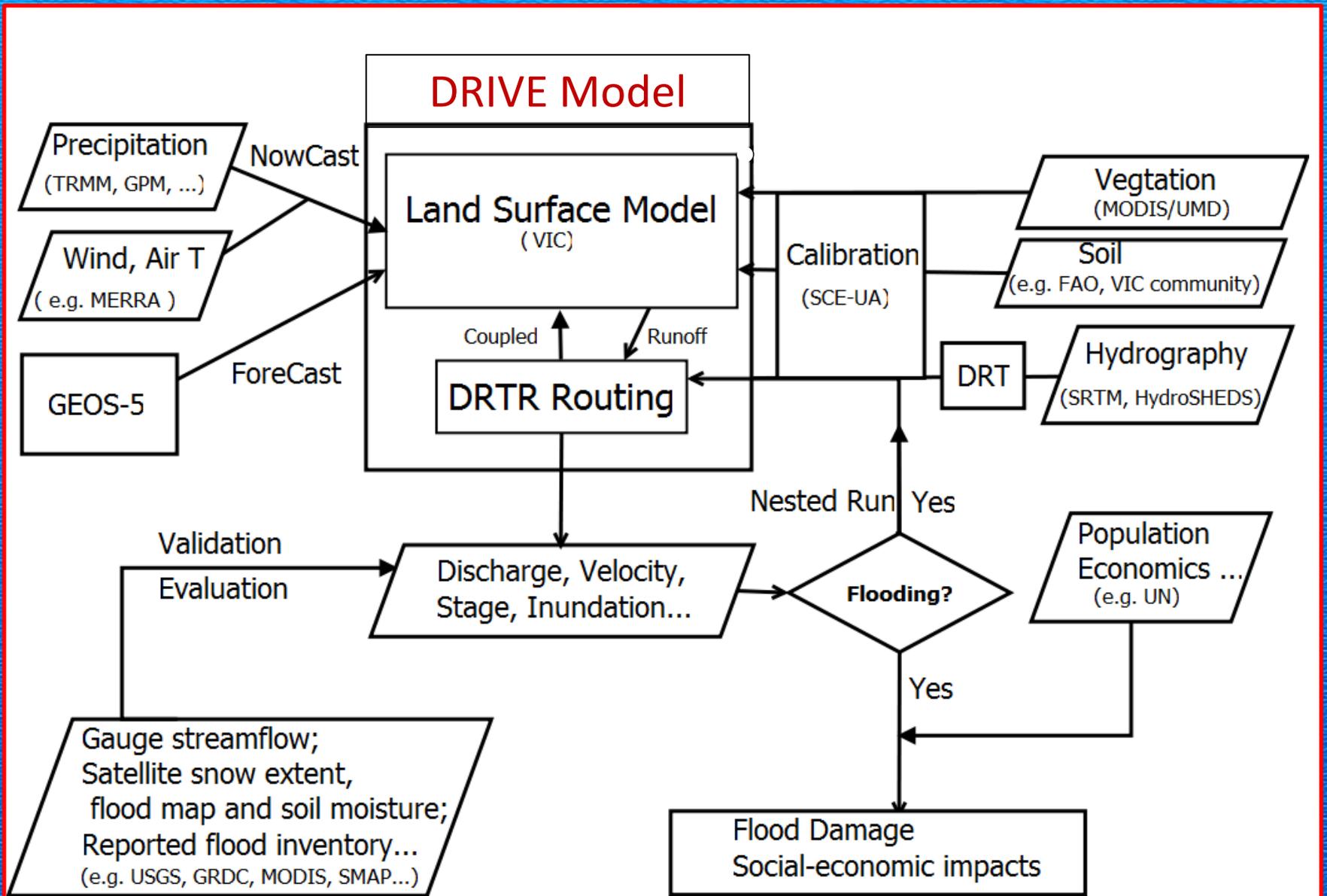
# Summary and Future

1. A new version of the Global Flood Monitoring System (GFMS) has been implemented for real-time application using the U. of Washington VIC community Land Surface Model and a new physically based DRTR routing model from the U. of Maryland for more accurate flood calculation and greater flexibility, including 1 km routing. The VIC/DRTR combination is called the Dominant river Routing Integrated with VIC Environment (DRIVE) system.
2. The evaluation of the DRIVE model shows promising performance in retrospective runs vs. observed streamflow records and in flood event detection against global flood event statistics. Results show impact of dams (higher FAR), potential improvement with improved accuracy of satellite precipitation and greater skill with longer floods.
3. High resolution (1 km) routing and water storage calculations will lead to high resolution inundation mapping for comparison with high resolution visible and SAR imagery of floods.
4. For the future we will also:
  - ❑ be implementing a “dam module” to try to include the impact of man-made structures on the calculations
  - ❑ be implementing the use of forecast precipitation info. from numerical models (adjusted by the satellite estimates) to extend the calculations a few days into the future

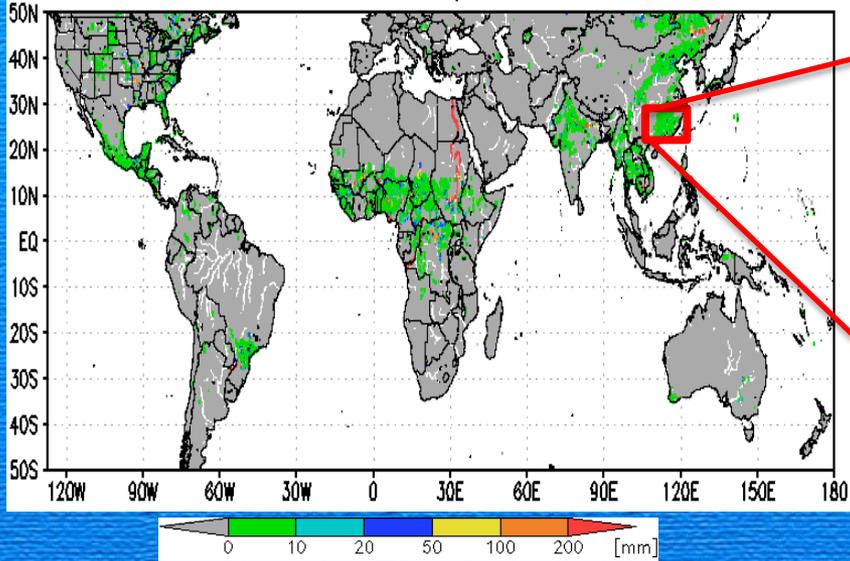
*Thanks!*



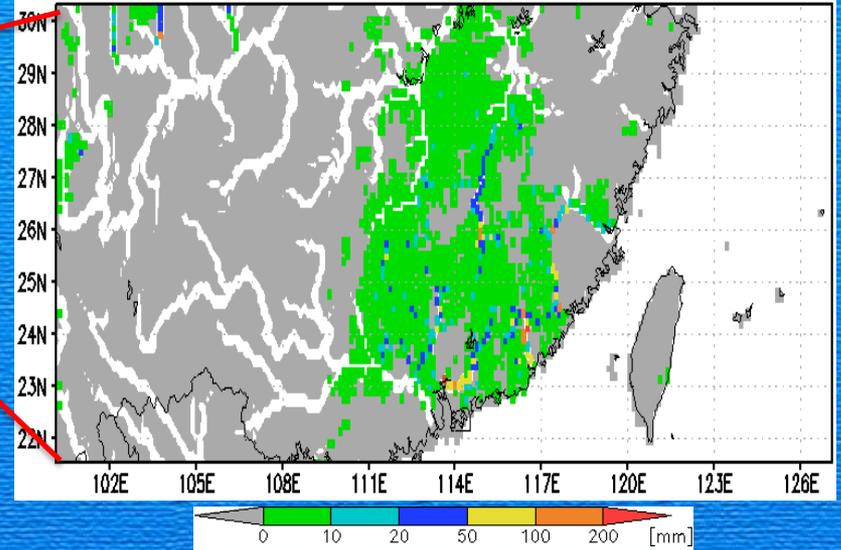




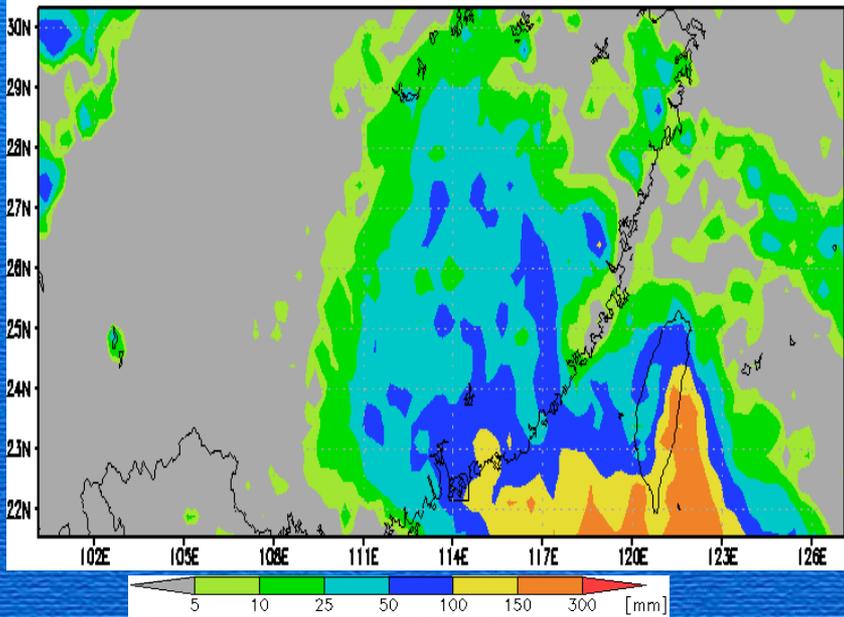
Flood Detection/Intensity (depth above threshold [mm])  
06Z23Sep2013



Flood Detection/Intensity (depth above threshold [mm])  
06Z23Sep2013



Rainfall (3-day accum.) [mm] 06Z23Sep2013



Streamflow 12km res. [m<sup>3</sup>/s]  
06Z23Sep2013

