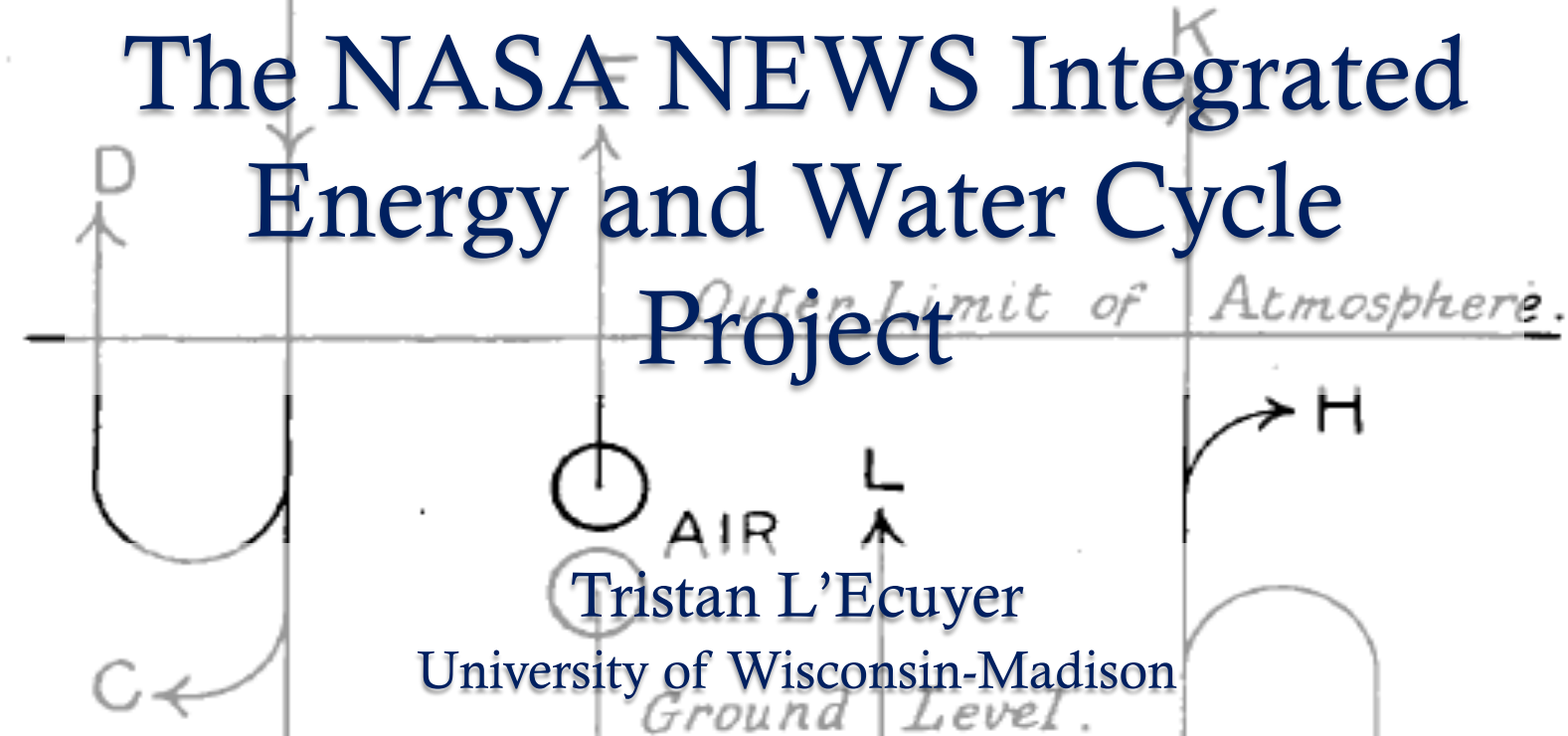


Dines (1917)

The NASA NEWS Integrated Energy and Water Cycle Project



Tristan L'Ecuyer

University of Wisconsin-Madison

Contributors: The NEWS Energy and Water Cycle Climatology Team: Matt Rodell, H. Beaudoin, William Olson, James S. Famiglietti, Paul R. Houser, Robert Adler, Michael Bosilovich, Carol Anne Clayson, Don Chambers, Elizabeth Clark, Eric Fetzer, Xiang Gao, Guojun Gu, Kyle Hilburn, George Huffman, Dennis P. Lettenmaier, W. Tim Liu, C. Adam Schlosser, Justin Sheffield, and Eric F. Wood

NASA ENERGY AND WATER CYCLE STUDY



Objectives



Goals: (1) Provide observation-based estimates of the integrated energy and water cycles (with associated error bars) on continental scales for climate studies and model assessments; (2) Document the scales over which independently-derived flux estimates balance; (3) Identify the which observations should be targeted to realize largest near-term improvement.

Methods: Apply variational techniques to objectively re-introduce balance constraints in reconstructions of the WEC from modern observations and observation-integrating models to estimate the mean annual cycles of component WEC fluxes on continental/basin scales.

Energy Balance Datasets

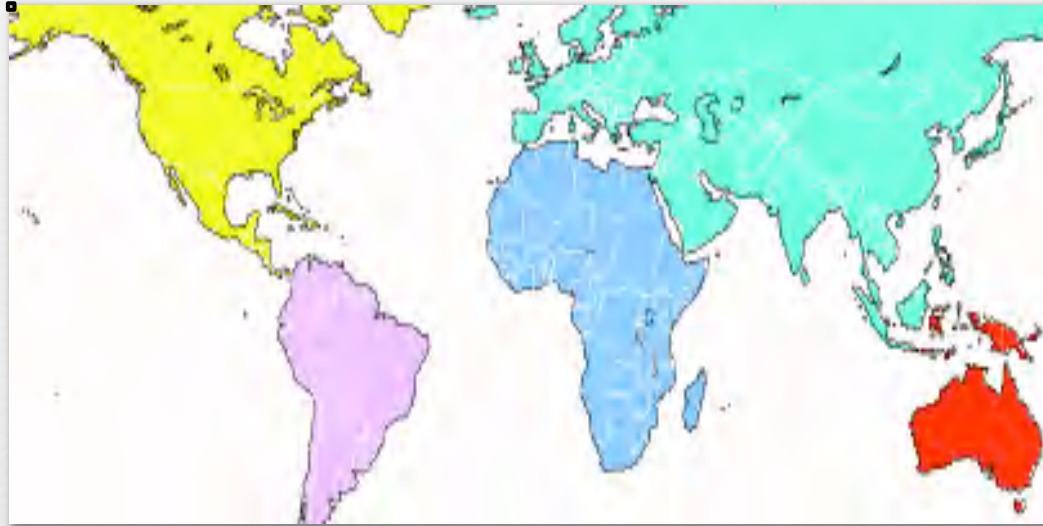


Variable	Dataset Name	Contributing Instruments
Precipitation	GPCP v. 2.2, MERRA, CMAP	SSMI, SSMIS, GOES-IR, TOVS, AIRS, TRMM
Surface Latent Heat Flux (Evapotranspiration)	Princeton, MERRA, GLDAS, SeaFlux	AIRS, CERES, MODIS, TRMM, AVHRR, MSU, HIRS, SSU, AMSU, SSMI, SSMIS, ERS1/2, QuikSCAT, GOES, TOVS
Surface Sensible Heat Flux	Princeton, MERRA, GLDAS, SeaFlux	AIRS, CERES, MODIS, TRMM, AVHRR, MSU, HIRS, SSU, AMSU, SSMI, SSMIS, ERS1/2, QuikSCAT, GOES, TOVS
Radiative Fluxes	GEWEX-SRB ISCCP-FD 2B-FLXHR-LIDAR C3M	CERES, AVHRR AVHRR CloudSat, CALIPSO, MODIS, AMSR-E CERES, CloudSat, CALIPSO, MODIS

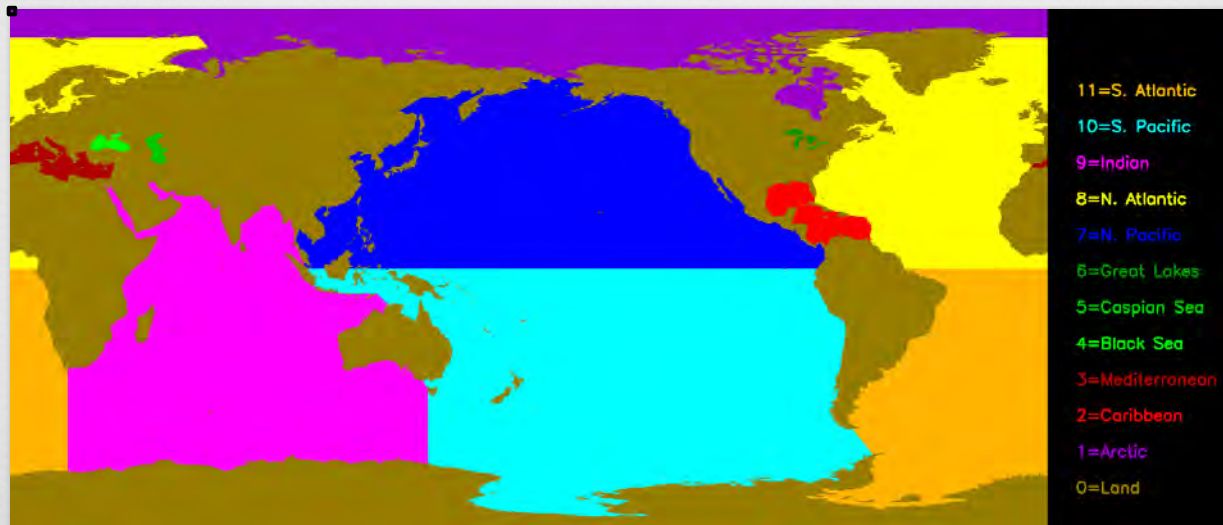
Water Cycle Datasets

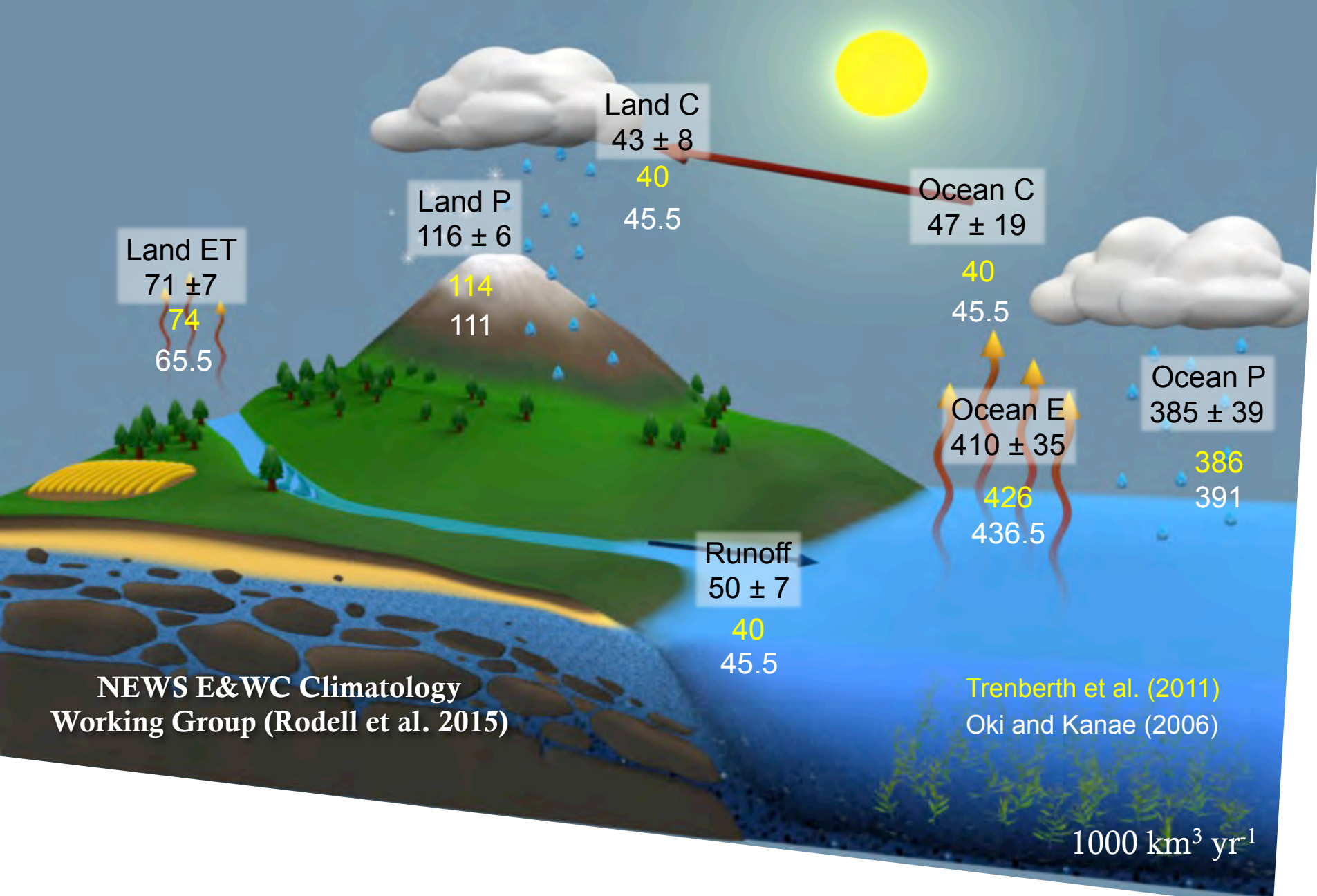
Variable	Dataset Name	Contributing Instruments
Precipitation	GPCP v. 2.2, MERRA, CMAP	SSMI, SSMIS, GOES-IR, TOVS, AIRS, TRMM
Evapotranspiration	Princeton, MERRA, GLDAS	AIRS, CERES, MODIS, TRMM, AVHRR, MSU, HIRS, SSU, AMSU, SSMI, SSMIS, ERS1/2, QuikSCAT, GOES, TOVS
Runoff	U. Washington Dai and Trenberth, MERRA, GLDAS	TRMM, GOES-IR, TOVS, SSM/I, ERS, ATOVS
Water Storage Change	GRACE CSR RL05 (Chambers)	GRACE
Atmospheric Convergence	QSCAT, MERRA, PWMC	QuikSCAT, TRMM, GRACE, MSU, HIRS, SSU, AMSU, AIRS, SSMI, ERS1/2, MODIS, GOES
Atmospheric Water Storage Change	(Fetzer)	AIRS, AMSR-E
Ocean Evaporation	SeaFlux v. 1.0, Princeton, MERRA	SSMI, AVHRR, AMSR-E, TMI, WindSat

Initial Time/Space Scales



Mean annual cycle from (approx) 2000 to 2009.

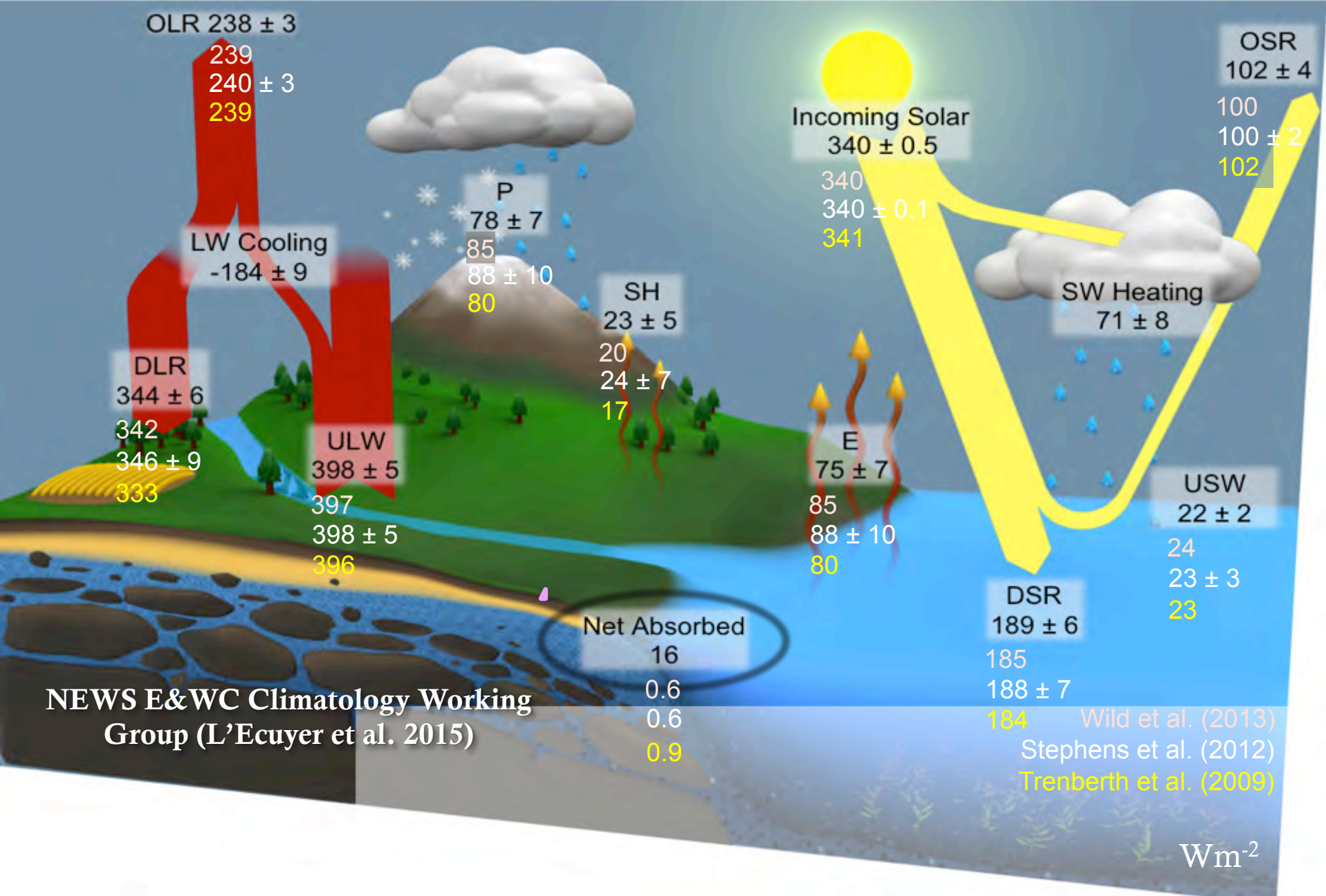




NEWS E&WC Climatology
Working Group (Rodell et al. 2015)

Trenberth et al. (2011)
Oki and Kanae (2006)

The unconstrained view of the Earth's water cycle in the early 21st century.



NEWS E&WC Climatology Working Group (L'Ecuyer et al. 2015)

Wild et al. (2013)
Stephens et al. (2012)
Trenberth et al. (2009)

Wm⁻²

The unconstrained view of global Earth's energy budget in the early 21st century.



Global Distribution

(SRB, Princeton-SRB, SeaFlux, MERRA)

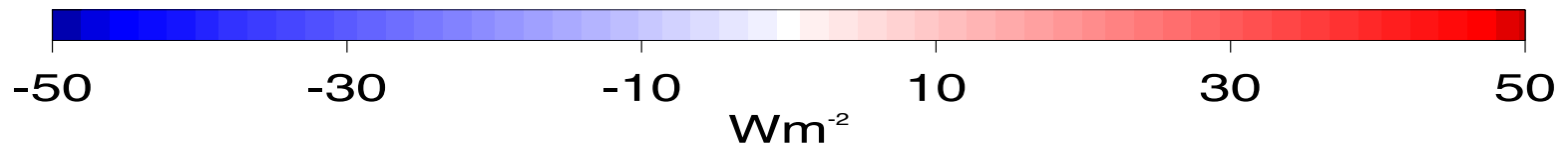
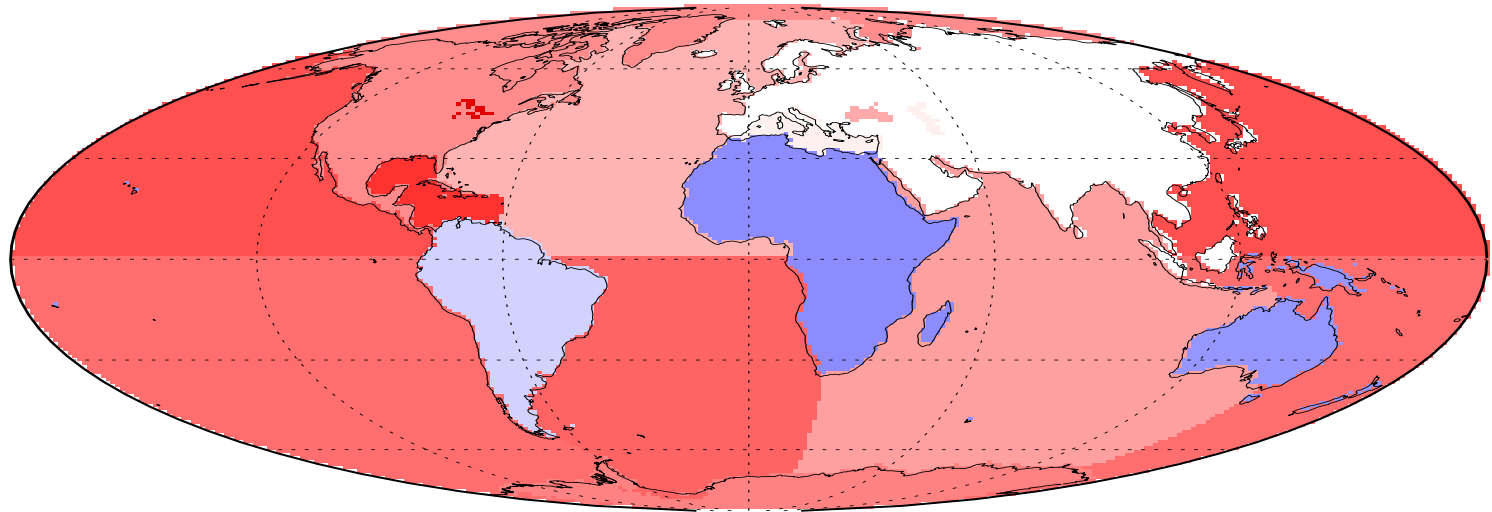


GLB : 15.86

LND : -1.56

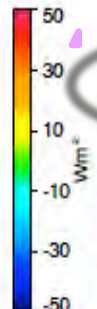
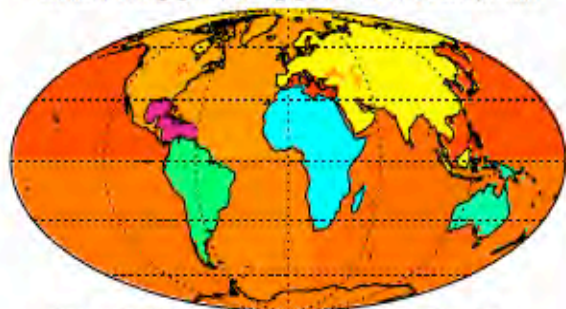
SEA : 22.87

Surface Energy



$$S = F_{\text{LW}}^{\downarrow} + F_{\text{SW}}^{\downarrow} - F_{\text{LW}}^{\uparrow} - F_{\text{SW}}^{\uparrow} - \text{LH} - \text{SH}$$

SRB/PrISCCP/PrISCCP/MERRA/SeaFlux

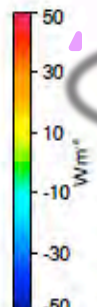
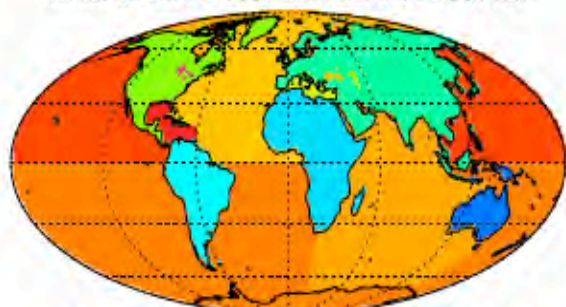


GLB : 22.15

LND : 13.90

SEA : 32.43

SRB/MERRA/SeaFlux/MERRA/SeaFlux

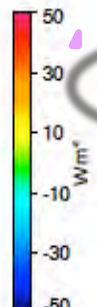
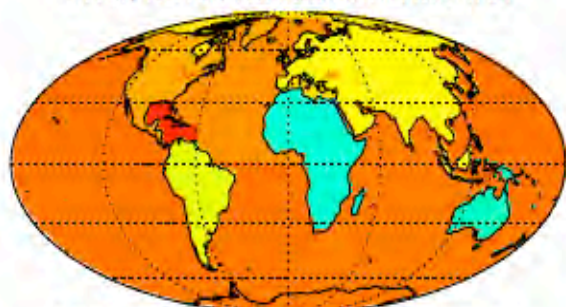


GLB : 13.58

LND : 1.252

SEA : 28.49

SRB/PrSRB/PrSRB/MERRA/MERRA

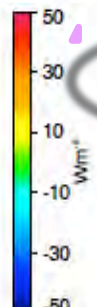
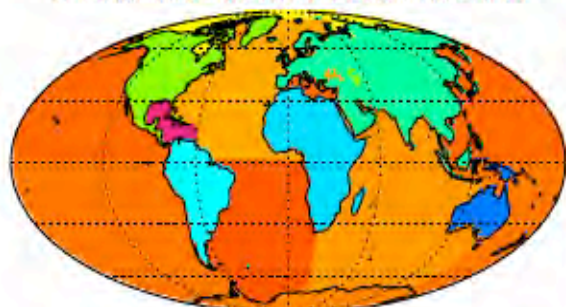


GLB : 24.89

LND : 16.53

SEA : 31.52

SRB/MERRA/MERRA/MERRA/MERRA

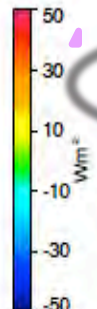
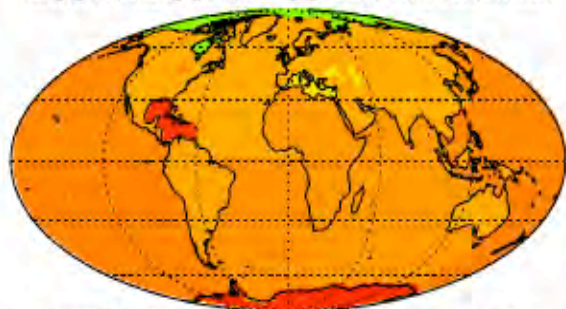


GLB : 20.02

LND : 1.252

SEA : 30.74

ISCCP/PrISCCP/PrISCCP/MERRA/SeaFlux

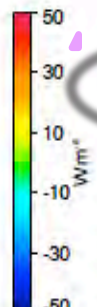
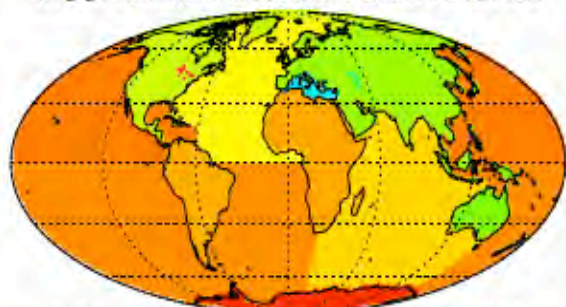


GLB : 26.40

LND : 34.12

SEA : 27.97

ISCCP/MERRA/SeaFlux/MERRA/SeaFlux

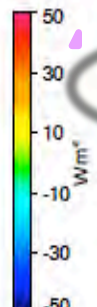
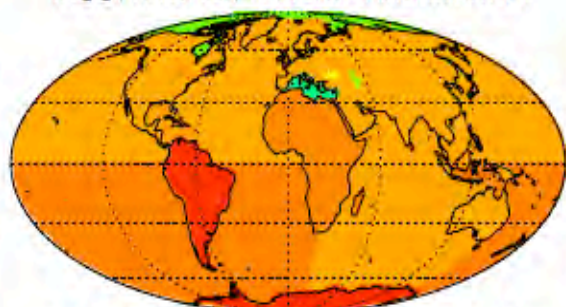


GLB : 17.83

LND : 21.47

SEA : 24.03

ISCCP/PrSRB/PrSRB/MERRA/MERRA

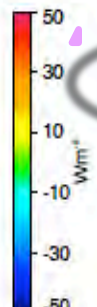
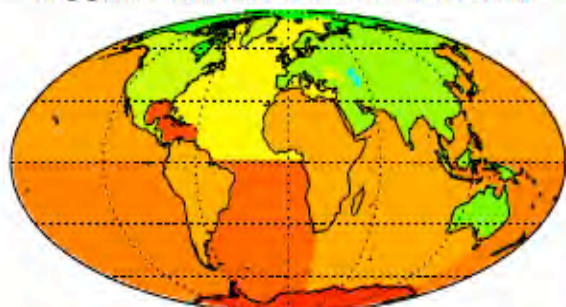


GLB : 27.20

LND : 36.75

SEA : 27.06

ISCCP/MERRA/MERRA/MERRA/MERRA



GLB : 22.33

LND : 21.47

SEA : 26.28

Questions



- ⌘ Do these imbalances fall within observational uncertainties?
- ⌘ Can closure information that is lost when datasets are generated in isolation be *objectively* re-introduced?

Introducing Balance Constraints



General budget equation:

$$R = \sum_{i=1}^M F_i - \sum_{o=1}^N F_o$$

Surface Energy Budget:

$$S = F_{LW}^{\downarrow} + F_{SW}^{\downarrow} - F_{LW}^{\uparrow} - F_{SW}^{\uparrow} - LH - SH$$

Surface Water Budget:

$$Q = P - LH$$

(E)

- Equations are valid for all continents on annual time-scales.
- Similar equations apply to the world oceans (cannot separate basins since transports are not known).

Additional constraints:

$S = 0$ for all continents

$S = 0.9$ for world oceans based on ocean heat content measurements

$$\sum_{\text{continents}} Q_L = \sum_{\text{basins}} Q_o$$

Variational Optimization



- If errors are assumed to be Gaussian and random, balance can be objectively imposed by minimizing the cost function:

$$J = (\mathbf{F} - \mathbf{F}_{obs})^T \mathbf{S}_{obs}^{-1} (\mathbf{F} - \mathbf{F}_{obs}) + (\mathbf{R} - \mathbf{R}_{obs})^T \mathbf{S}_R^{-1} (\mathbf{R} - \mathbf{R}_{obs})$$

Minimum occurs when:

$$\mathbf{F} = \mathbf{F}_{obs} - \mathbf{S}_F \mathbf{K}^T \mathbf{S}_y^{-1} (\mathbf{R}_{obs} - \mathbf{K} \mathbf{F}_{obs}) \quad \mathbf{S}_F = (\mathbf{K}^T \mathbf{S}_y^{-1} \mathbf{K} + \mathbf{S}_{obs}^{-1})^{-1}$$

- Energy and water cycle constraints are satisfied simultaneously (linked through ET → LH)
- “Goodness of Fit” (χ^2) helps answer ‘can balance be achieved within current uncertainties?’

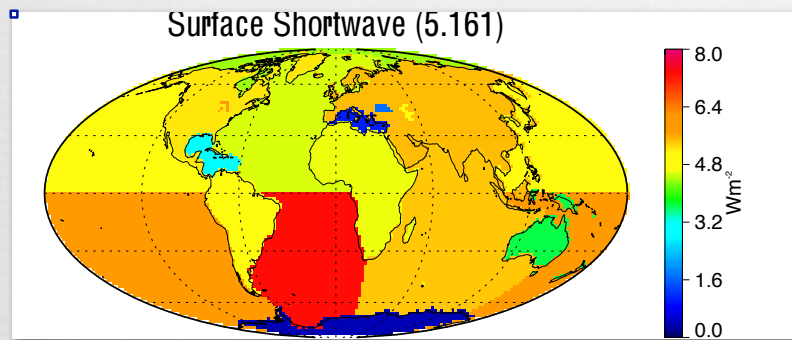
$$\chi^2 = (\mathbf{F} - \mathbf{F}_{obs})^T \mathbf{S}_{obs}^{-1} (\mathbf{F} - \mathbf{F}_{obs}) + (\mathbf{R} - \mathbf{R}_{obs})^T \mathbf{S}_R^{-1} (\mathbf{R} - \mathbf{R}_{obs}) = 22$$

Uncertainty Estimates

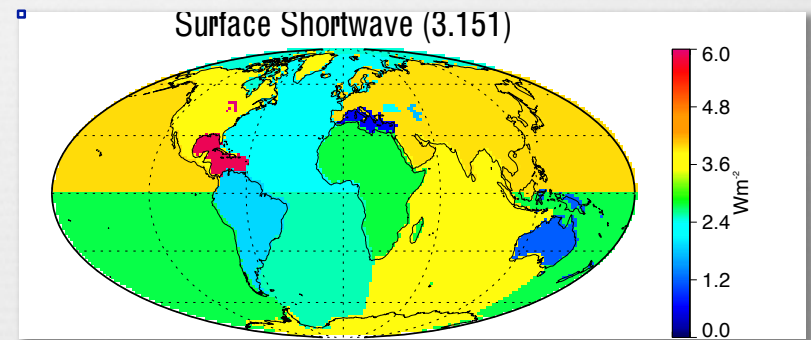


- ❑ Validation Against Ground Obs.
- ❑ Product Inter-comparisons
- ❑ Sensitivity Studies

E.g. Surface Radiative Fluxes: (Impact of Cloud Property Errors on DSR)

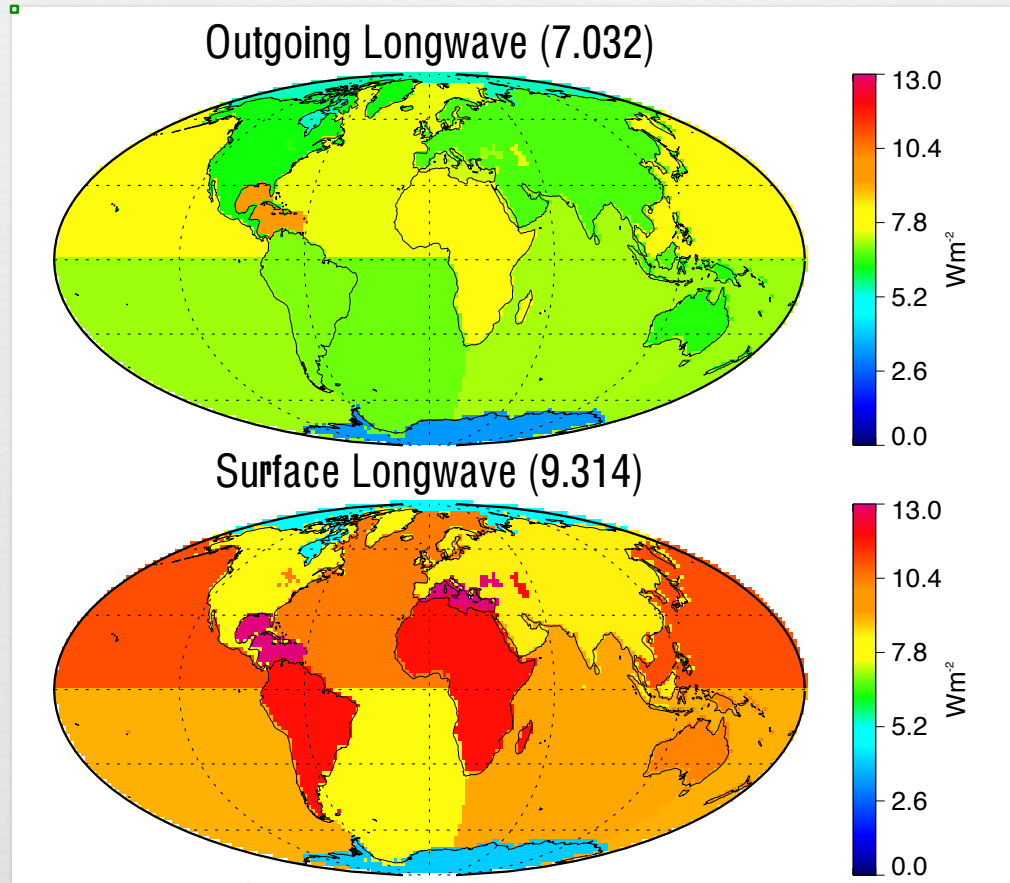


Effective Radius/LWP
(CloudSat Errors +
CALIOP clouds)

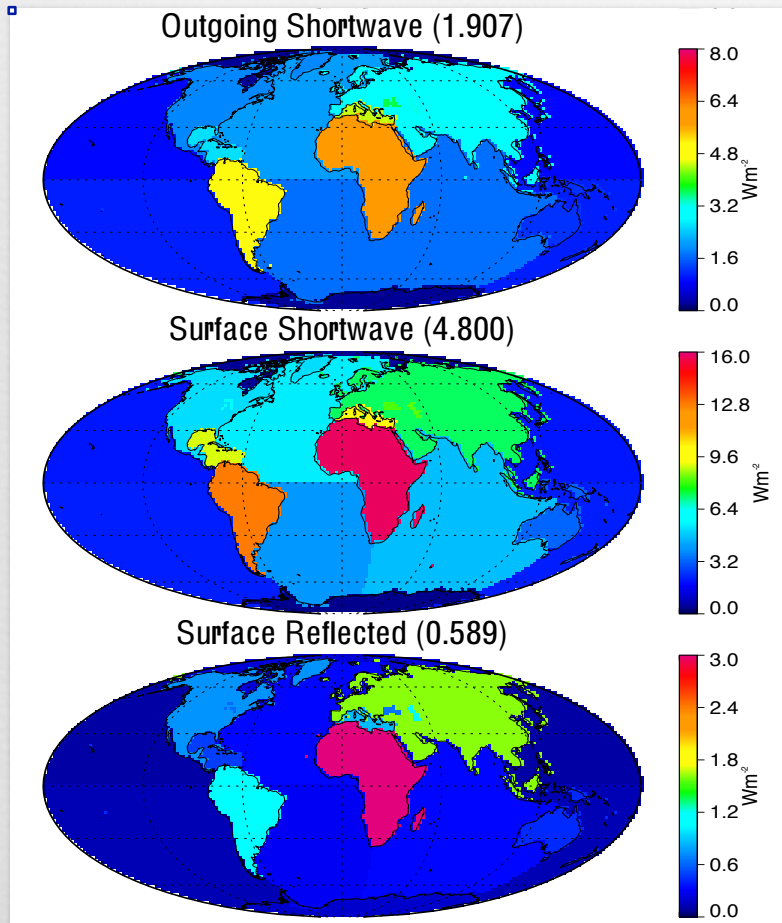


Effective Radius/IWP
(CloudSat Errors +
CALIOP clouds)

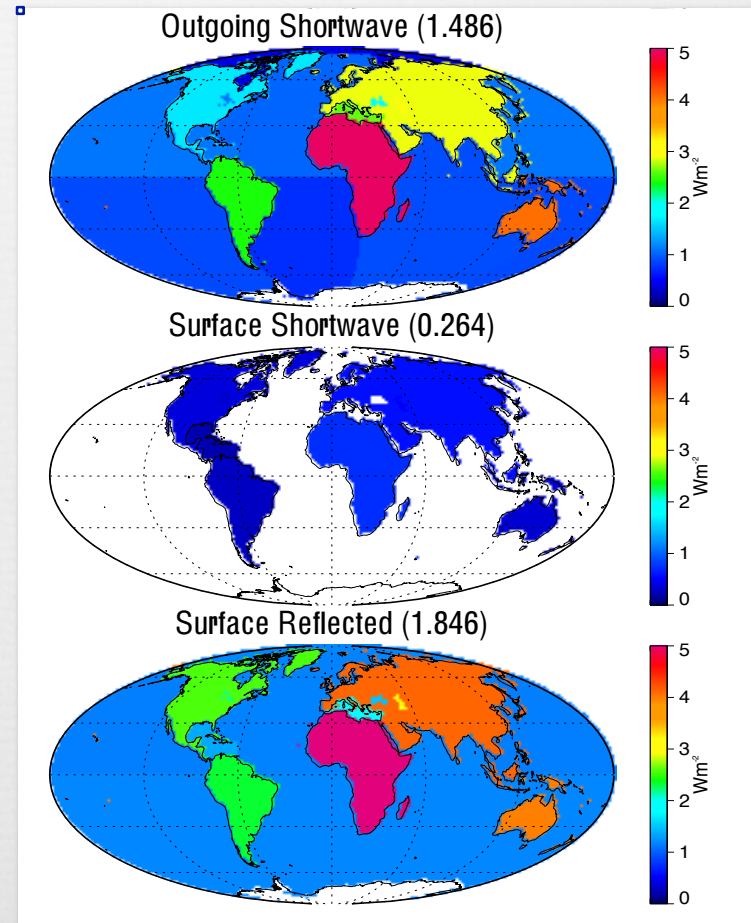
Impact of Temperature Biases on OLR and DLR



Impacts of Errors in Aerosols and Surface Albedo

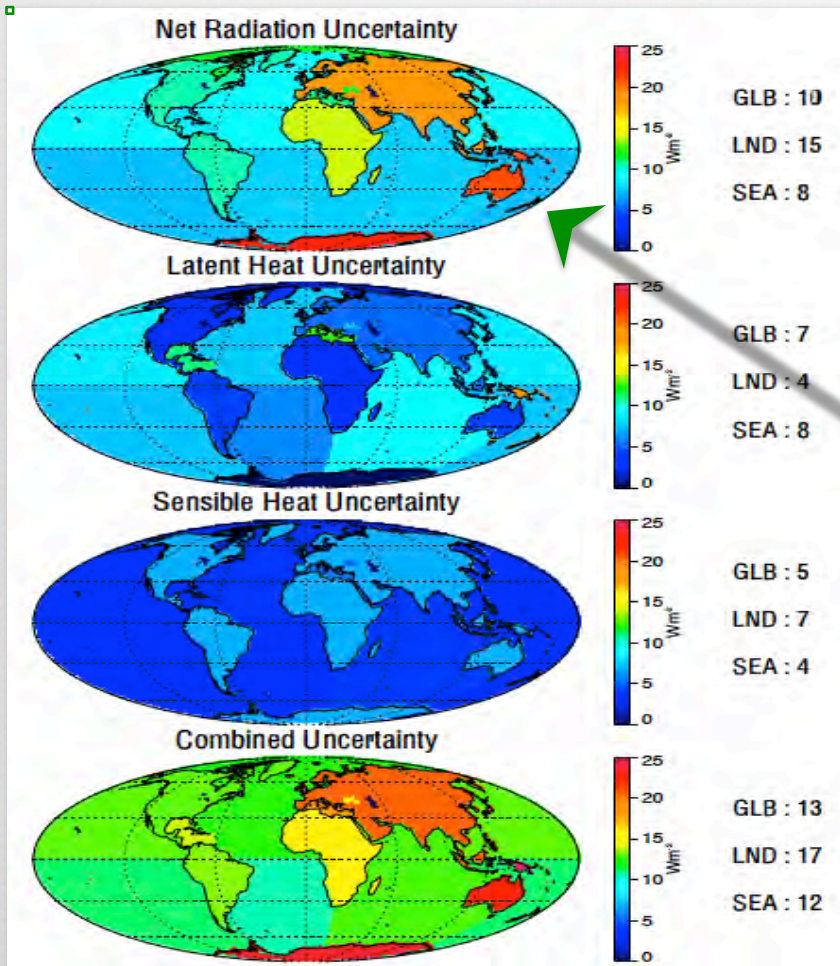


AOD/Composition



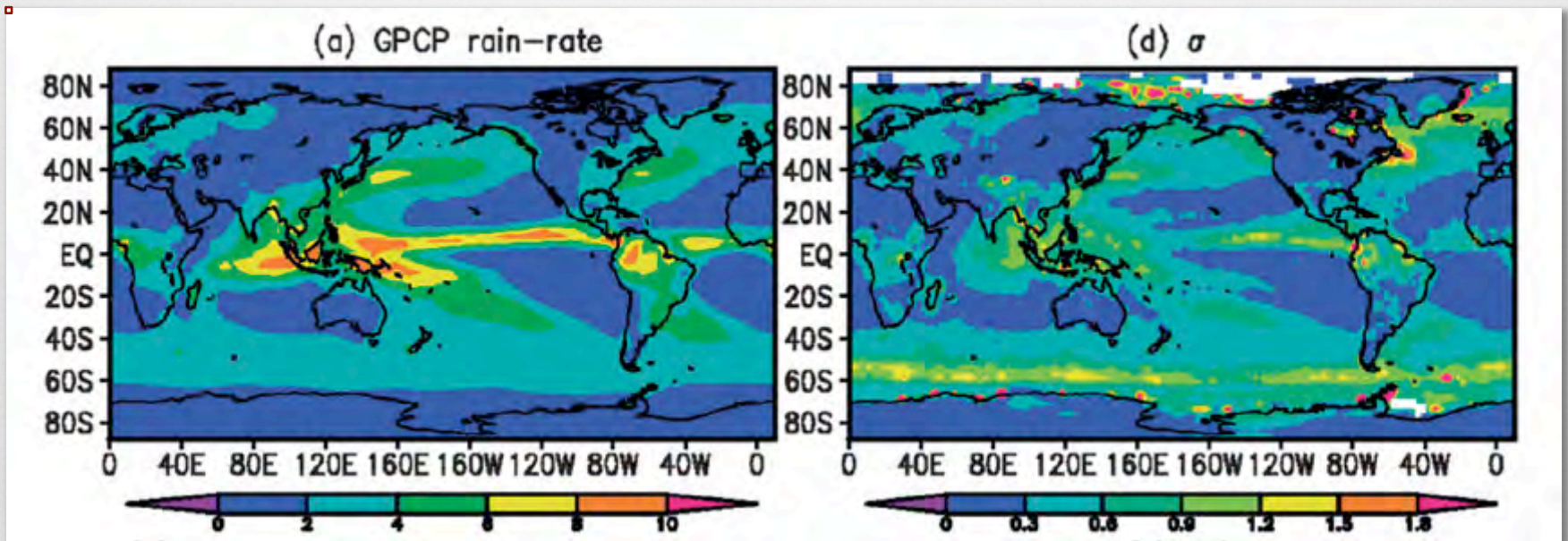
Surface Albedo

Uncertainty Estimates



Errors by Source	DLR	DSR	OLR	OSR
Low Cloud Properties	1	5	1	5.5
High Cloud Properties	1	3	4	3
Cloud Thickness	2	3.5	0.5	3.5
Atmospheric Properties	9	2.5	7	1
Aerosols	0	5	0	2
Surface Properties	5	0.3	1	1.5

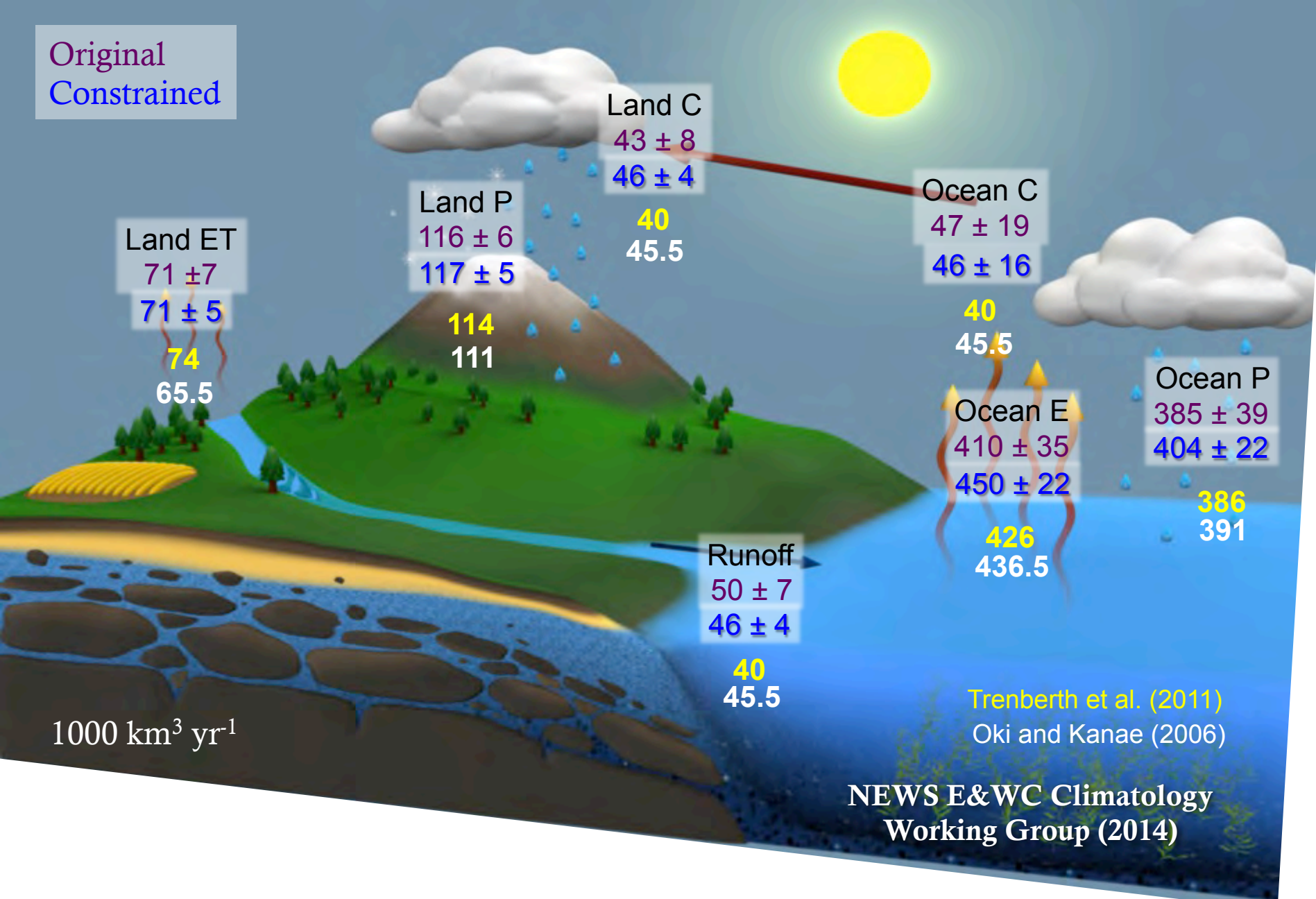
Uncertainties in Precipitation



when integrating over different areas with a different number of input products. For the globe the calculated relative error estimate from this study is about 9%, which is also probably a slight overestimate. These tropical and global estimated bias errors provide one estimate of the current state of knowledge of the planet's mean precipitation.

$$9\% \approx 7 \text{ Wm}^{-2}$$

Original
Constrained

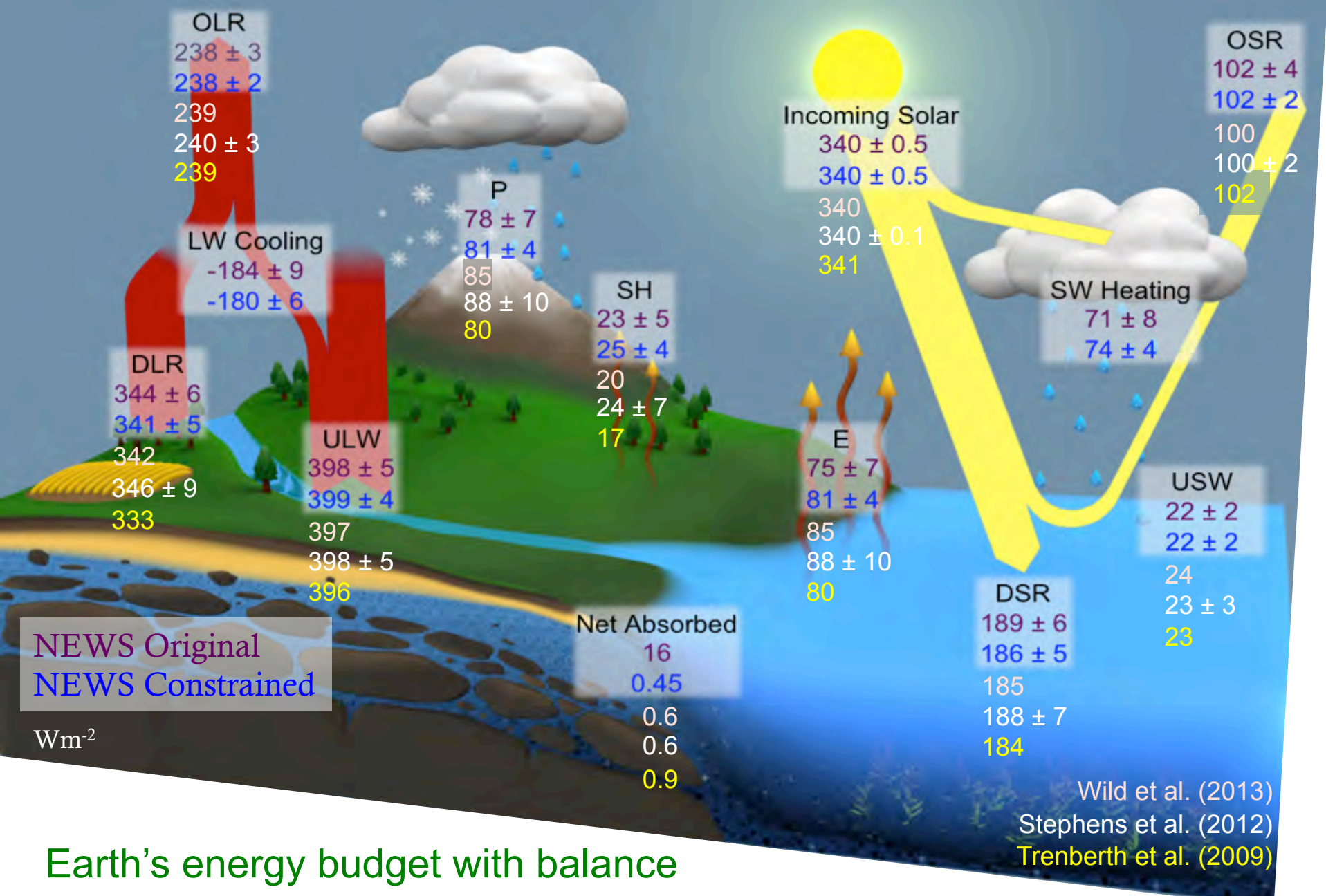


Earth's water cycle with balance
constraints imposed.

Water Cycle Adjustments

	Expected Closure Error	Best Guess Residual
North America	8.6%	11.0%
South America	8.0%	5.0%
Eurasia	12.5%	5.1%
Africa	8.1%	2.1%
Australia Mainland	15.0%	7.6%
Australasian and Indonesian Islands	19.5%	12.5%
Antarctica	32.4%	0.0%
World Land	10.1%	4.3%
World Ocean	13.8%	6.6%

Note the residual after optimization is ~0% in all cases.



Earth's energy budget with balance constraints imposed.

L'Ecuyer et al. (2015); Rodell et al. (2015) under revision.

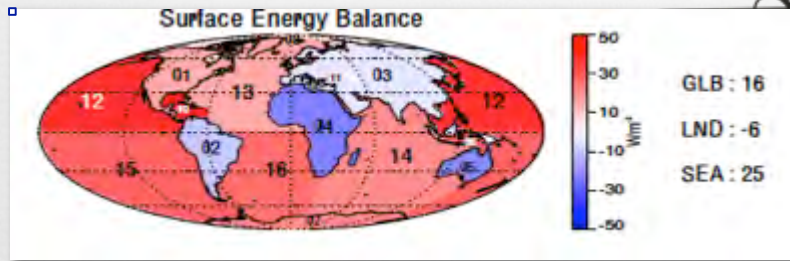
Can the surface energy budget be reconciled with observed changes in OHC? (i.e. Are the adjustments realistic?)



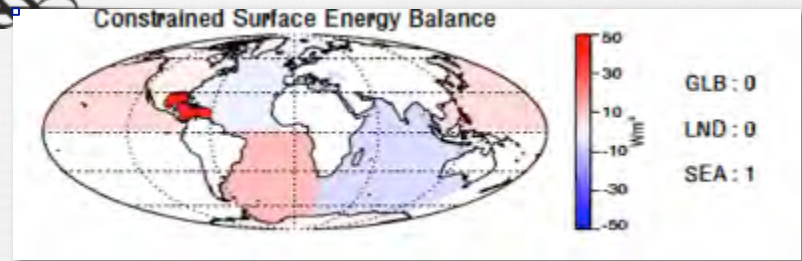
Flux	Raw	Optimized	Change	Error
OLR	238	239	1	2
OSR	100	102	2	5
DLR	344	341	3	7
DSR	190	186	4	6
E	75	81	6	7
P	77	81	4	7
SH	21	25	4	5

All in Wm^{-2}

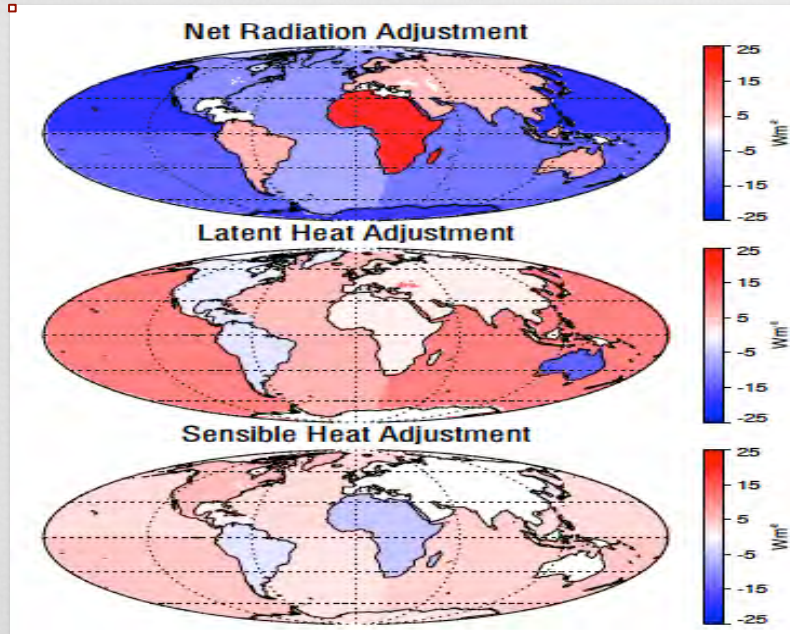
Surface Energy Balance



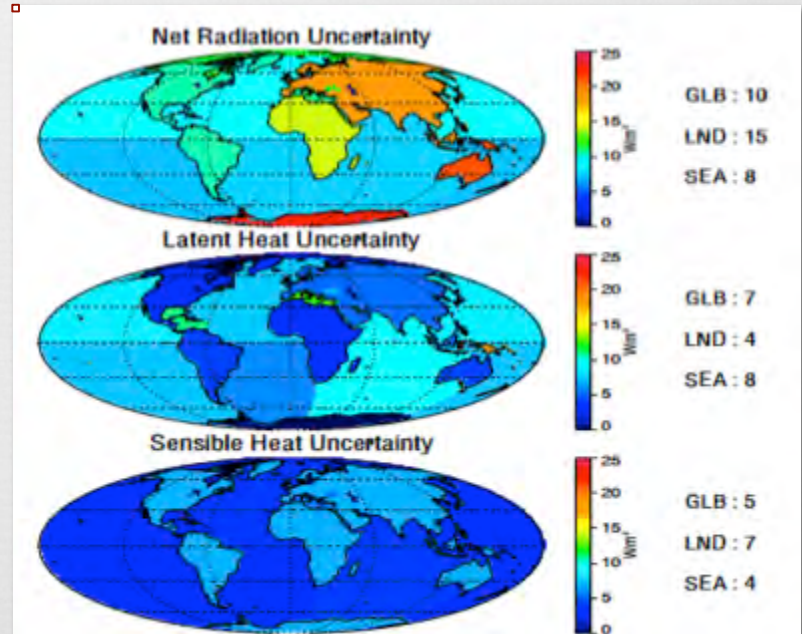
Raw Observations



Constrained



Flux Adjustments



Uncertainty Estimates

New Initiatives



Quantifying Uncertainties, Variability and
Trends, Model Evaluation

New Working Groups



- ❧ NEWS Water and Energy Cycle Uncertainties Working Group (WECU)
 - ❧ Chair: Brent Roberts

- ❧ NEWS Working Group on Water and Energy Cycle Variability (WECV)
 - ❧ Chairs: Paul Houser and Tristan L'Ecuyer

Water and Energy Cycle Uncertainties



- ❧ Objective: Generate dynamic (i.e. space and time-varying) uncertainty estimates in all component fluxes and their dependence on time/space scale and regime (e.g. weather state, thermodynamic conditions, cloud state, etc.).
- ❧ Methods:
 - ❧ Systematic dataset inter-comparisons on a hierarchy of time and space scales from global/annual through monthly/gridded across different time periods.
 - ❧ Results stratified by location, season, and environmental regimes (TBD).

Water and Energy Cycle Uncertainties



Target time period 1998-2014

Energy and Water Cycle Budget Variables

Incoming solar	Sensible heat flux	Surface net heat flux
Outgoing shortwave	Latent heat flux (Evap and ET)	Atmospheric net heat flux
Outgoing longwave	Precipitation (Atmos LH)	Ocean heat content
Downwelling LW @ SFC	Atmos moisture convergence	Ocean heat convergence
Downwelling SW @ SFC	Runoff	
Surface emitted	Atmos water storage	
Surface reflected	Surface water storage	

Water and Energy Cycle Variability

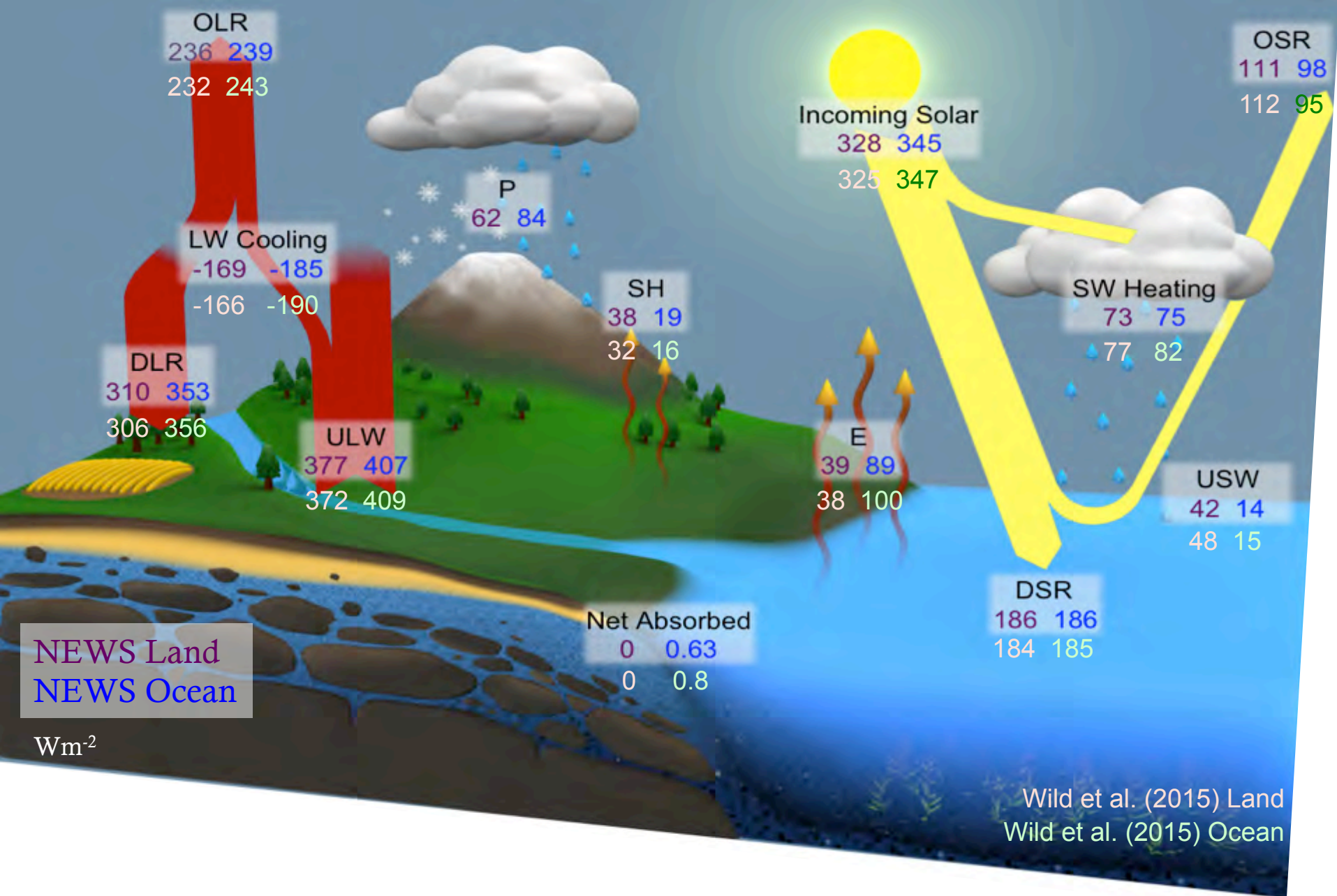


- ❧ Objectives: Build upon the methodology developed by NEWS Energy and Water Cycle climatology working group to document and analyze temporal and spatial variability and trends in objectively constrained integrated WECs
- ❧ Methods:
 - ❧ Apply E&WC closure methodology to monthly fluxes averaged over smaller domains (expanded from 17 to 52)
 - ❧ Expand period covered backward in time to span the modern satellite era (target: 1980's to present)
 - ❧ Incorporate new time/regime-dependent error and covariance information from WECU

Science Targets

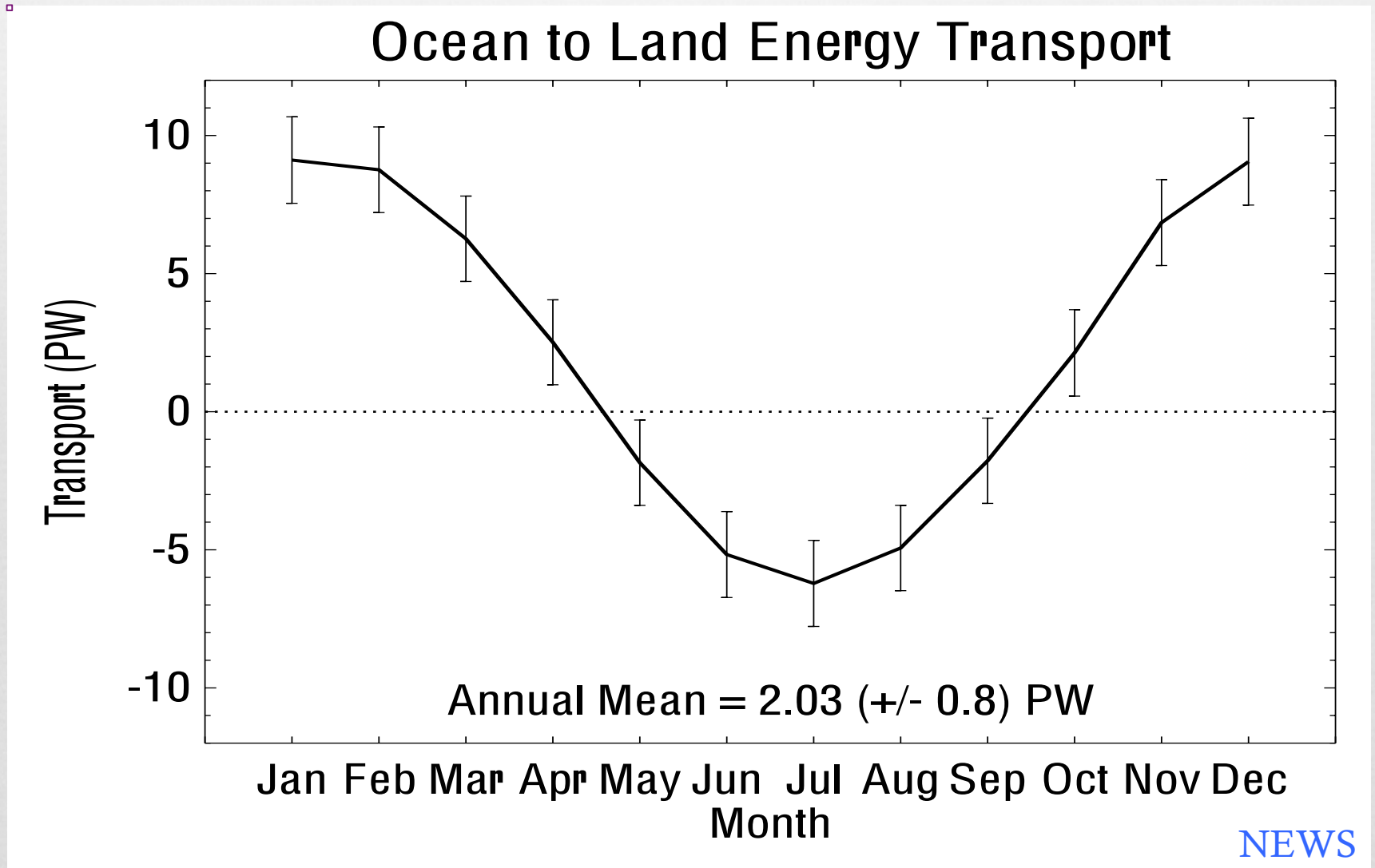


- ❧ Document year-to-year water and energy cycle variability
- ❧ Test alternative dataset combinations and systematically diagnose sensitivity of balance results to these assumptions
- ❧ Examine seasonal variability in land-ocean water and energy exchanges
- ❧ Quantify structural correlations in WEC variability (spatial and temporal)
 - ❧ Correlations between land-ocean energy and water exchanges and ENSO
 - ❧ Inter-annual variations in hemispheric energy imbalances and their role in modulating the ITCZ
 - ❧ Inter-annual variability in basin-scale ocean heat transports
 - ❧ Trends in WEC fluxes and imbalances



Constrained land and ocean energy budgets.

Implied Ocean – Land Heat Transport



Trenberth and Fasullo (2013) → 2.2 PW

Summary



- ❧ Integrated closure constraints provide a useful sanity check on uncertainty estimates assigned to individual fluxes and may form a useful part of future assessment strategies.
- ❧ *Global* Energy and Water Cycles can be objectively balanced within realistic error estimates
 - ❧ Results are a compromise between those presented in other recent studies
- ❧ Uncertainty estimates may be too optimistic at *continental* scales. Adjustments are indicative of biases (esp. over oceans).
- ❧ The methodology can be applied to diverse dataset combinations and adapted to include dynamic error estimates.
- ❧ Expansion to smaller regions and shorter timescales will allow variability and trends to be assessed possibly revealing physical processes through analyses of time-space correlations.