

DERIVING HYDROLOGICAL DROUGHT INDICATORS BASED ON A GRACE-ASSIMILATED GLOBAL HYDROLOGICAL MODEL

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DROUGHT FACTS

- Global impacts on agriculture, society and economic losses
- 11 million people died of drought, 2 billion affected since 1900 (published 2013)
- Drought affected more people worldwide than any other natural hazard
- Danger: Slow-onset nature, lack of visible physical damage, blurred temporal boundaries

(FAO, 2013, 2017 & 2018)



HOW TO DEFINE DROUGHT?

- Multiple definitions of drought exist in the literature
- In most cases drought is defined as deficit compared to the 'normal' and assigned with four drought types

E.g. precipitation deficit,
increased temperature



Meteorological
drought



Hydrological
drought

Effect of precipitation deficit on
surface/subsurface water, phase
shift to meteorological droughts

Deficit of soil moisture, damage
on biomass and crops



Agricultural
drought



Socioeconomic
drought

Imbalance of supply and demand of
economic goods associate with
other drought types

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Here: Analysis of hydrological drought

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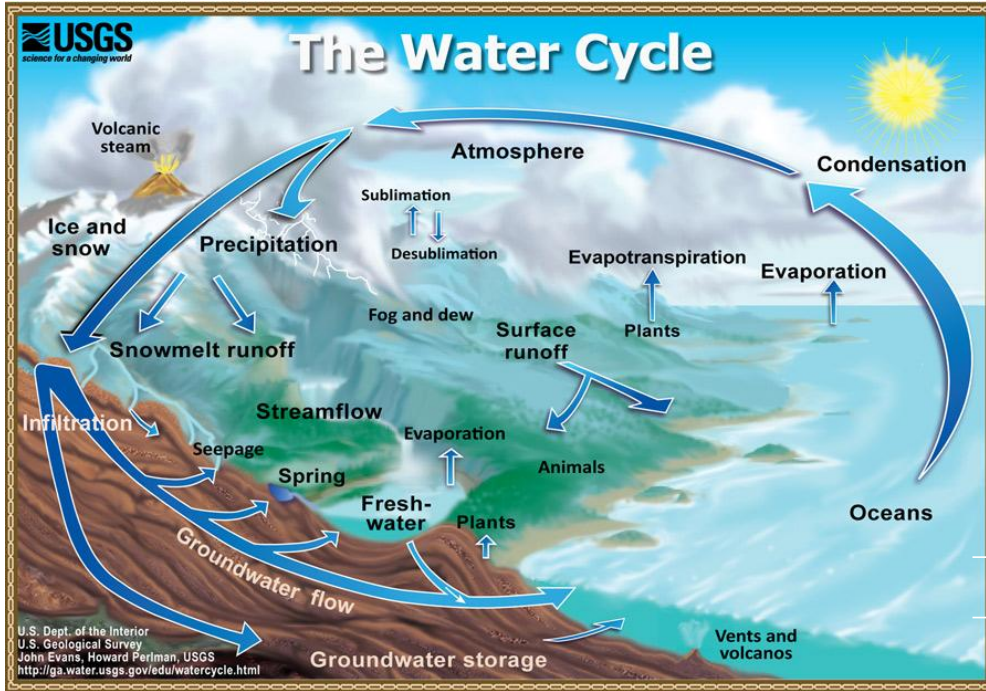
Agricultural
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ANALYZING HYDROLOGICAL DROUGHT: THE GLOBAL WATER CYCLE



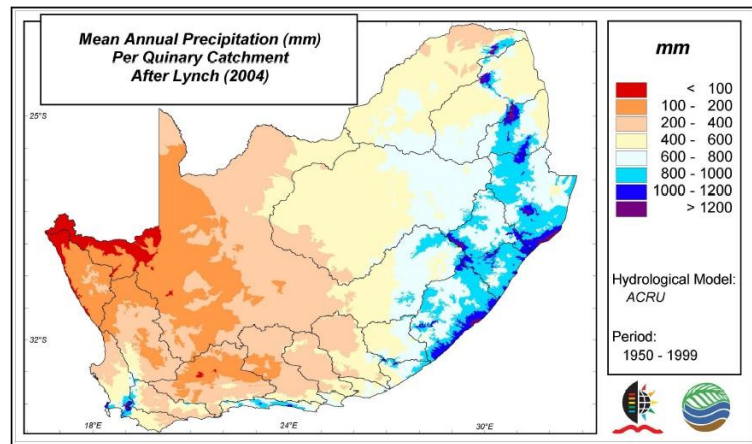
- In-situ observations are sparse
- Analyzing single storage might be insufficient for drought detection
- Opportunity: The satellite mission **GRACE** offers a great possibility to observe changes in all storages with global resolution derived as **total water storage anomalies**



Credit: NASA JPL/Caltech

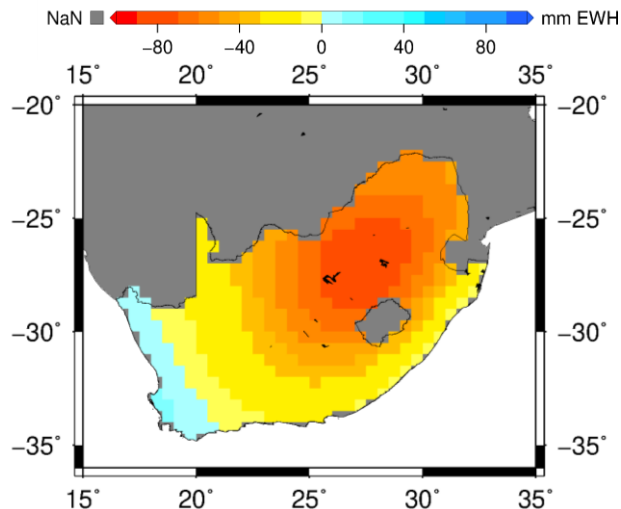
CHALLENGES OF USING GRACE ONLY

- Study region: South Africa



Credit: Schulze (2012)

- Precipitation is very local
- drought can be local

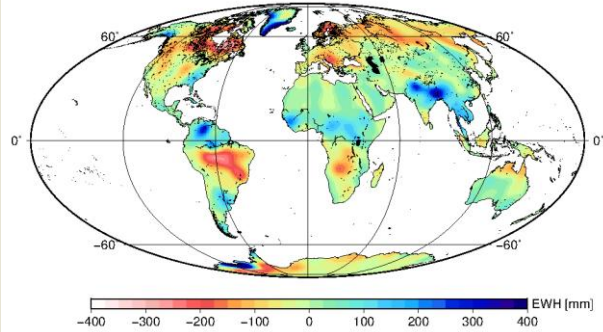


- GRACE resolution (~300 km) too coarse for use in drought monitoring and forecasting system

ADDRESS CHALLENGE:

COMBINATION OF REAL OBSERVATIONS WITH MODEL OUTPUT

GRACE – Real observation

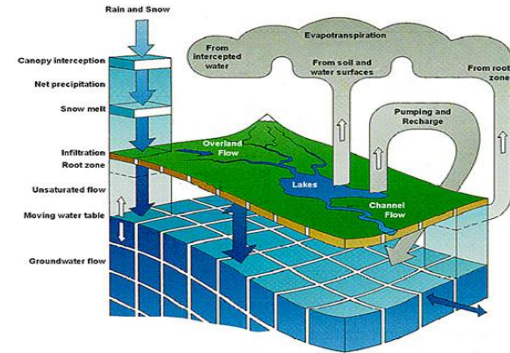


Spatial resolution ~300 km; monthly
Vertical:

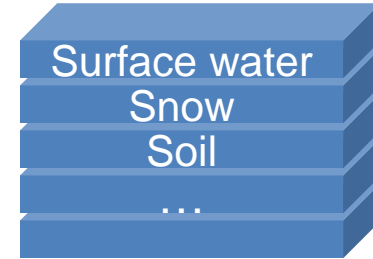


Combine both sources to
improve analysis by
Data assimilation

WGHM – Hydrological model



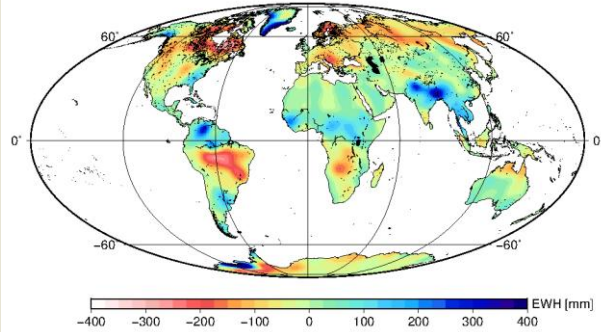
Spatial resolution ~50 km; daily
Vertical:



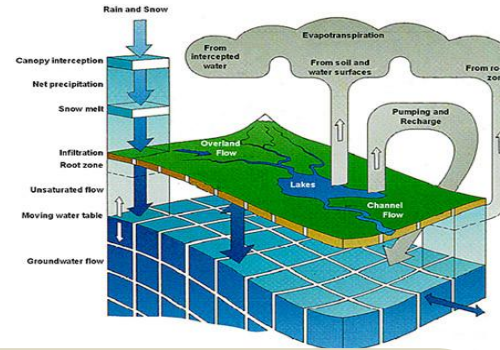
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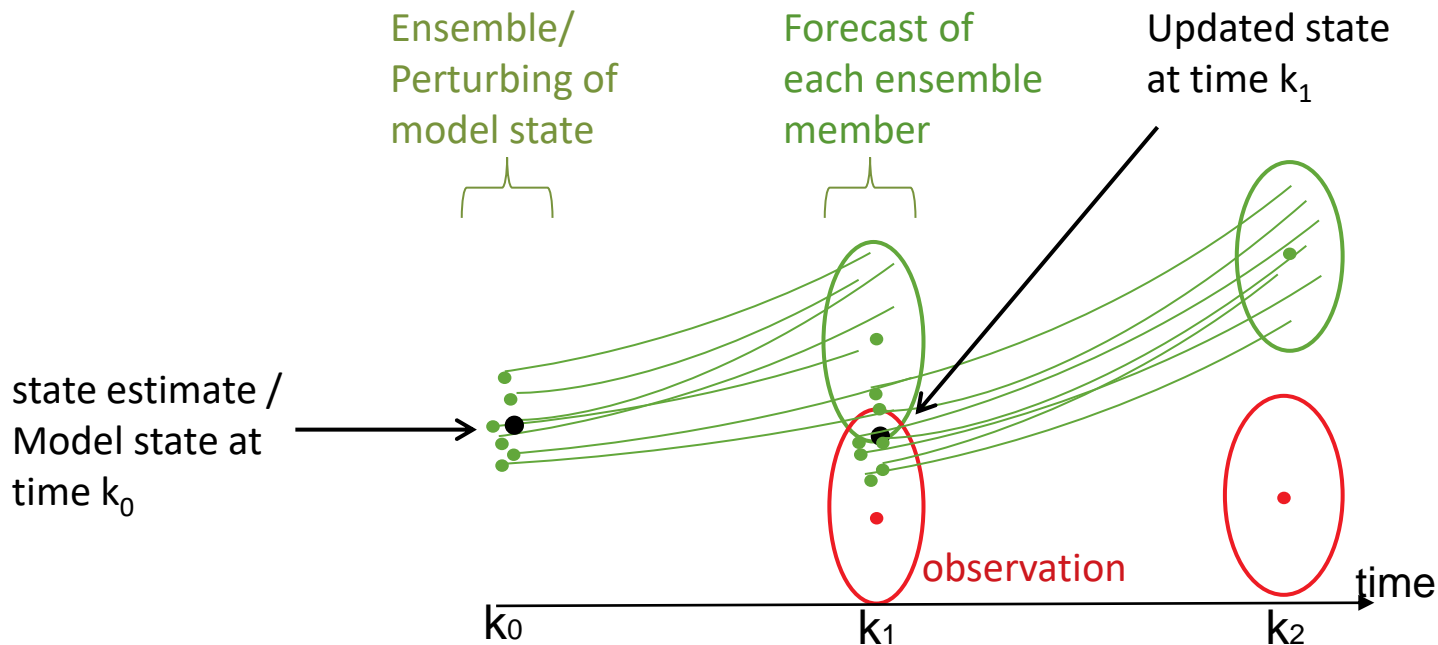
Spatial
Vertical

By assimilating GRACE into WGHM ...

- ... the model gets closer to reality
- ... the spatial resolution of GRACE is increased
- ... the vertical resolution of GRACE is increased

DATA ASSIMILATION CONCEPT

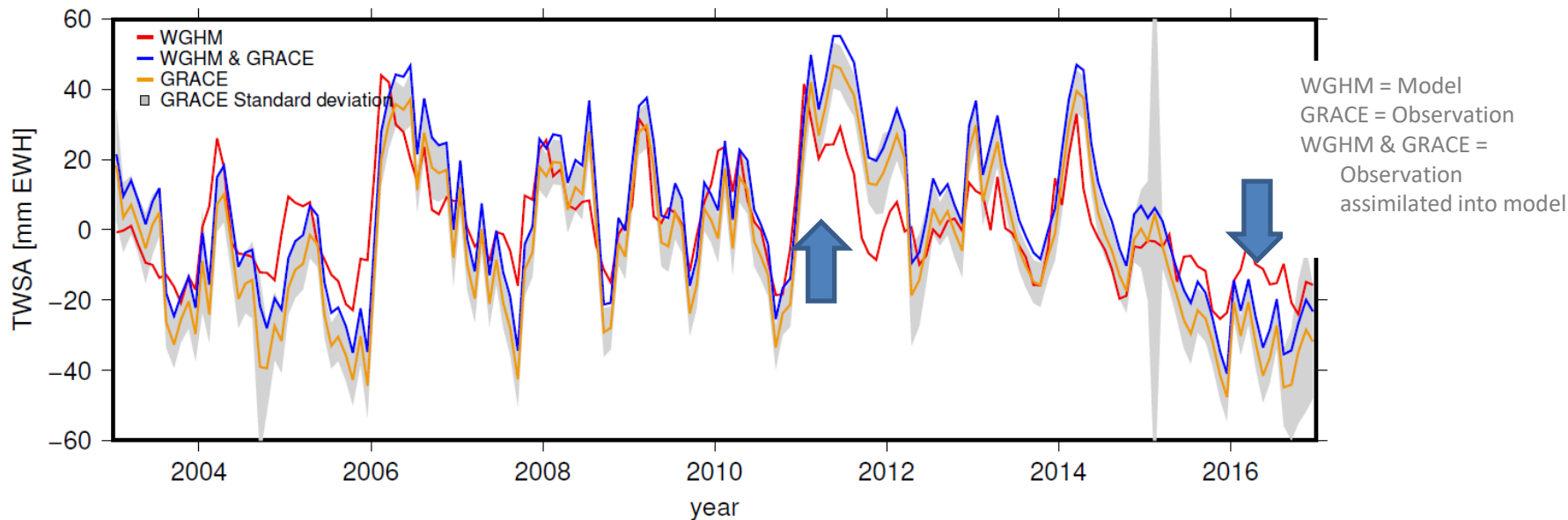
OPTIMAL STATE ESTIMATION USING ENSEMBLE-BASED KALMAN FILTER



More about EnKF: Evensen, J. Geophys. Res. (1994)

DATA ASSIMILATION SOUTH AFRICA: TOTAL WATER STORAGE ANOMALIES

- **Preliminary results**, shown: spatial average TWSA in South Africa derived by the model WGHM, the observations GRACE, and by assimilating GRACE into WGHM
- GRACE & WGHM drier than WGHM in 2015/2016 (and 2004/2005)
- GRACE & WGHM wetter than WGHM in 2011



CONCLUSION 1/2

Main points up to now:

- 1) Drier period in 2016 in South Africa
- 2) In most months, the assimilation (WGHM & GRACE) is closer to the real observations (GRACE) than the model (WGHM)

What comes next:

- How to identify droughts in South Africa?
- Usage of drought indicators for hydrological drought

INDICATORS FOR HYDROLOGICAL DROUGHT

- Characterization (retrospective), monitoring and triggering management plan for drought
- Describe severity, location, timing and duration of drought
- Are often categorized into severity classes to enable e.g. faster policy making
- Usually based on single fluxes (e.g. streamflow, reservoir levels)
 - Streamflow indicators are no representative indicators for larger units (e.g. countries)
- Problem: No validation of drought indicators

→

- Exceptional
- Extreme
- Severe
- Moderate
- Abnormal

GRACE-BASED DROUGHT INDICATORS: TWO EXAMPLES

GRACE-based Drought Severity Indicator (DSI)

- Used in Zhao et al. (2017)
- Standardization wrt. climatology

$$DSI_{i,j} = \frac{TWSA_{i,j} - \overline{TWSA_j}}{\sigma_{TWSA_j}}$$

'Climatological' mean of TWSA of month i over all years

'Climatological' standard deviation of TWSA of month j over all years

j ... month, i ... year

Basics

Equation

Accumulated Drought Severity Indicator (DSIA)

- Used in Gerdener et al. (2020)
- Modification of Zhao et al. (2017) by using accumulated TWSA instead

→ Temporal smoothing, less noise

$$DSIA_{i,j} = \frac{TWSA^{+}_{i,j} - \overline{TWSA^{+}_i}}{\sigma_{TWSA^{+}_i}}$$

- Accumulation of TWSA over scale period

$$TWSA^{+}_{i,j,q} = \sum_{k=1}^q TWSA(t_{i,j+1-q})$$

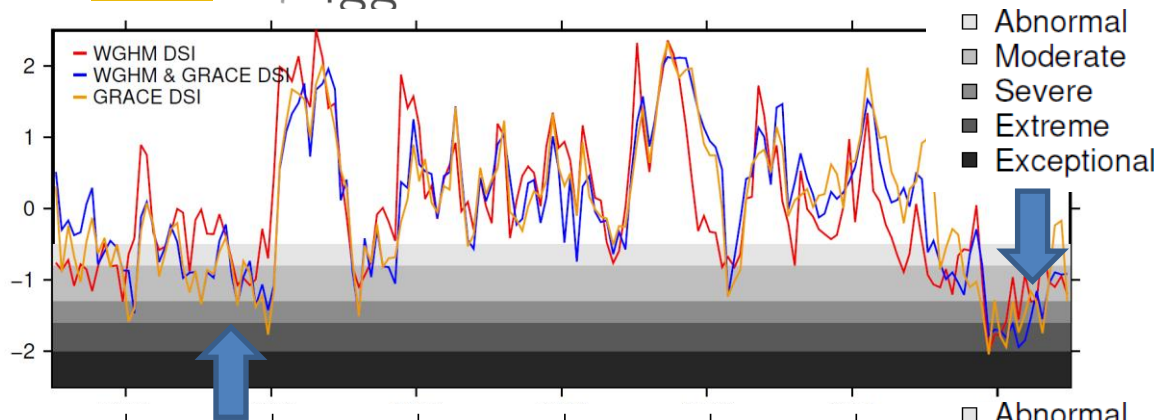
q ... scale period, e.g. 6 months

t ... time referring to month j and year i

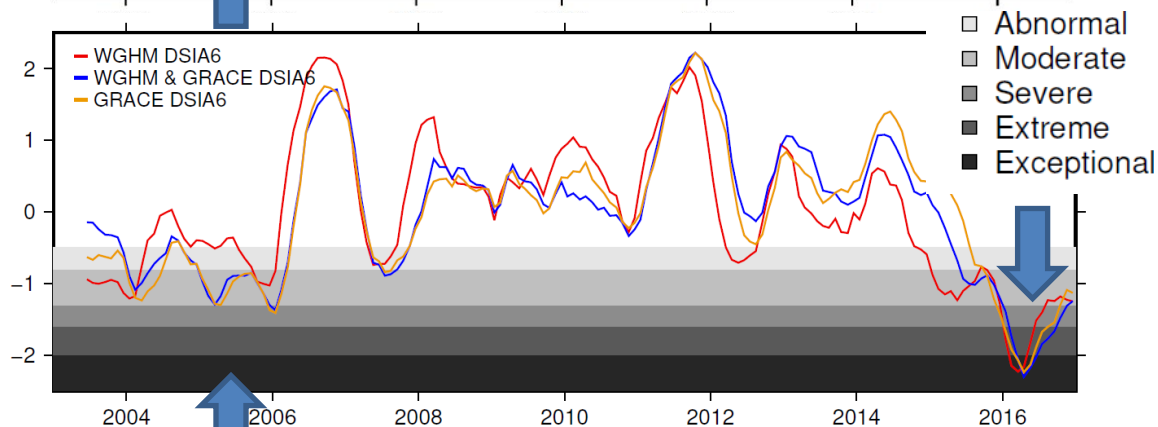
DATA ASSIMILATION SOUTH AFRICA:

TEMPORAL COMPARISON OF TWSA-DSI AND TWSA-DSIA6

DSI



DSIA6

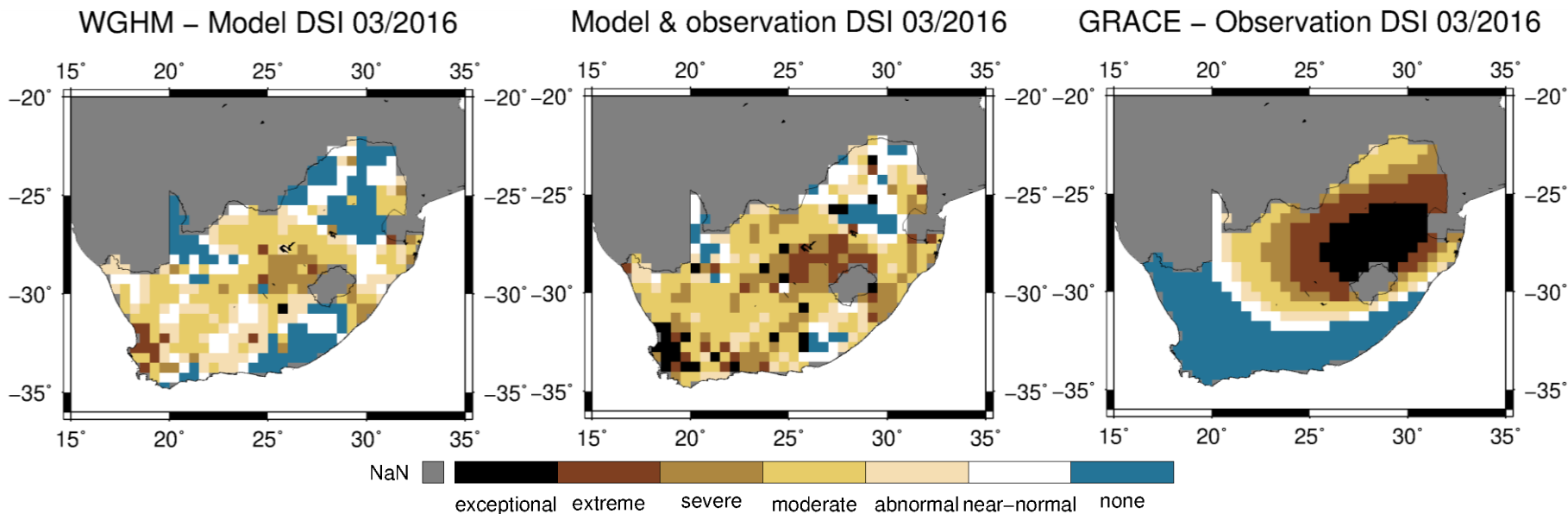


- The assimilation (WGHM & GRACE) identifies a slightly more intense drought in 2016 than the model
 - Drought in 2004/2005 more intense with WGHM & GRACE than with WGHM only
 - Both indicators identify dry periods, but each indicator has its advantages and disadvantages
- Detailed comparison of multiple indicators in Gerdener et al. (2020)

WGHM = Model
GRACE = Observation
WGHM & GRACE = Observation assimilated into model

DATA ASSIMILATION SOUTH AFRICA:

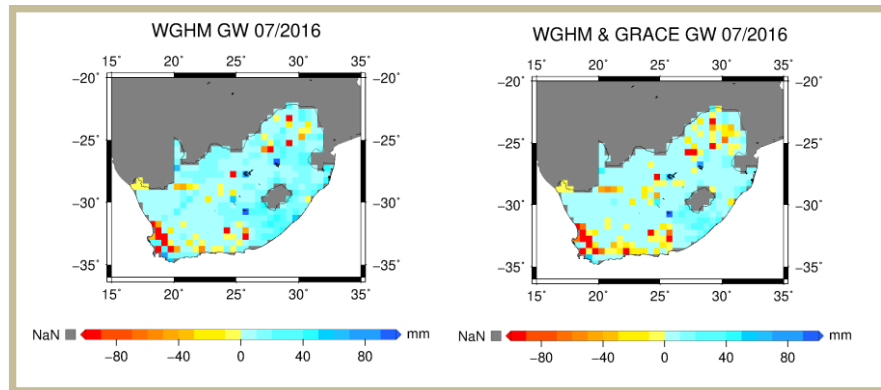
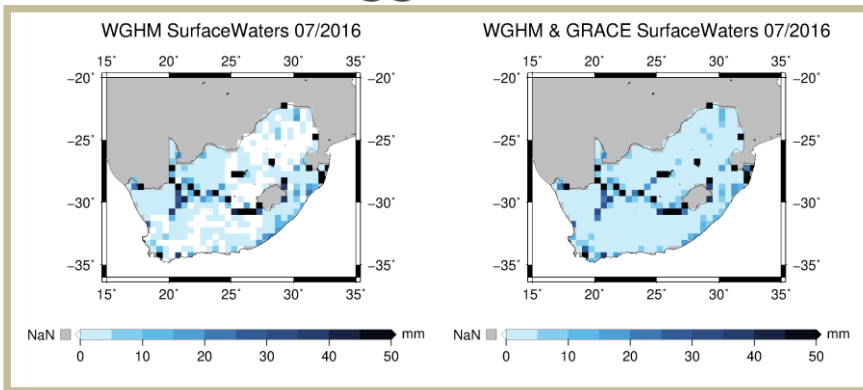
SPATIAL DOWNSCALING OF GRACE FOR THE EXAMPLE TWSA-DSI



- Spatial downscaling of total water storage changes/DSI
- No 'simple' downscaling → varying spatial information
- Assimilation helps expanding knowledge of drought region
- EM DAT database: known drought event in 2016

DATA ASSIMILATION SOUTH AFRICA:

VERTICAL DOWNSCALING OF GRACE - SURFACE WATERS & GROUNDWATER

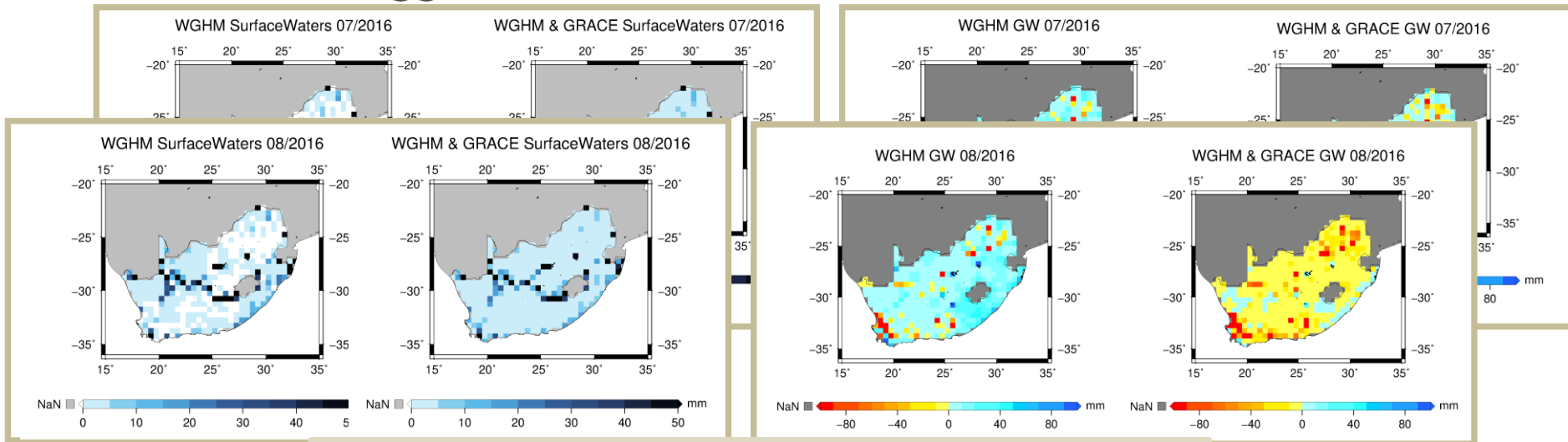


Surface waters= Global lakes, local lakes, global wetlands, local wetlands, river, reservoir

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DATA ASSIMILATION SOUTH AFRICA:

VERTICAL DOWNSCALING OF GRACE - SURFACE WATERS & GROUNDWATER



Vertical downscaling of GRACE-TWSA:

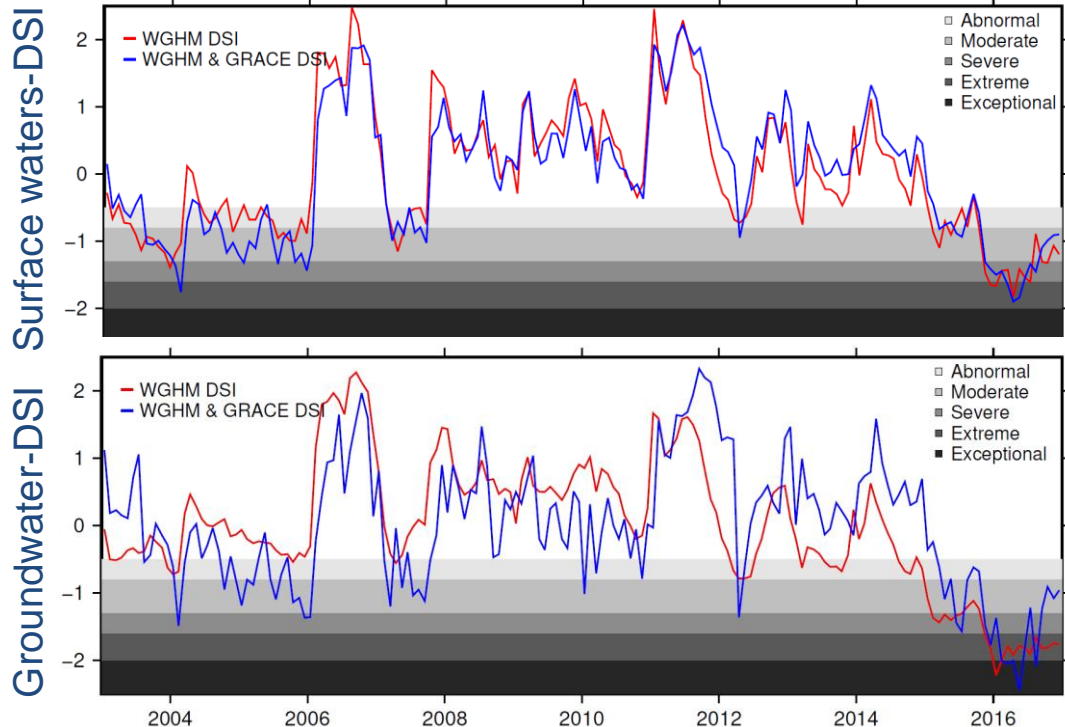
- Data assimilation enables vertical disaggregation
- Less changes in surface waters compared to groundwater
- Assimilation shows high variation in groundwater storage, e.g. in August 2016

Surface waters= Global lakes, local lakes, global wetlands, local wetlands, river, reservoir

WGHM = Model
WGHM & GRACE = Observation
assimilated into model

DATA ASSIMILATION SOUTH AFRICA:

IS THE DROUGHT DOMINANT IN A SPECIFIC STORAGE?



WGHM = Model

WGHM & GRACE = Observation assimilated into model

- Applying same methodology of DSI to groundwater and surface waters
- Drought in 2015/2016 more present in groundwater storage than in surface storages

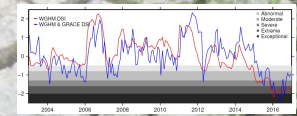
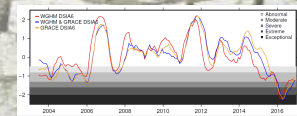
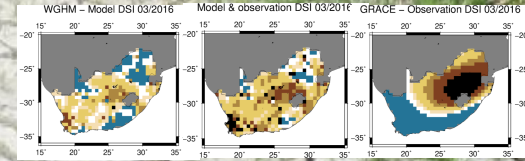
Assimilation of GRACE into WGHM allows new insights into detecting hydrological droughts

→ DA improves GRACE coarse spatial resolution

→ Improves vertical resolution of GRACE for detecting, e.g. groundwater droughts

CONCLUSION 2/2 & OUTLOOK

- 1) Assimilation enables a more realistic drought detection compared to the model, while spatially and vertically downscaling GRACE
- 2) Drought indicators and data assimilation facilitate identification of - and deeper insight into - droughts in South Africa
- 3) Identification of drought in South Africa in 2015/2016 is mainly apparent in groundwater storage



OUTLOOK:

- Validation of model and assimilation results against in-situ data
- Integration of GRACE-FO data into the framework

GLOBE DROUGHT PROJECT



- This work is part of the GlobeDrought project funded by BMBF
- Aim: Developing a web-based drought information system
- Components hazard, vulnerability, and exposure are combined to derive drought risk
- Use GRACE for considering hydrological drought, which is part of drought hazard



GRoW
GLOBALE RESSOURCE WASSER

SPONSORED BY THE



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