

180°

120°E

120°W

60° W

00

30°N

0°

30°S -

60°E

July - September 1987 OLR



FIG. 6, Time-longitude plot of total OLR (shading, as indicated), filtered ISO, and MRG-TD OLR (contours, solid negative, contour interval 10 W m<sup>-3</sup>, zero contour omitted), and filtered Kelvin wave OLR (contoured at -12 W m<sup>-3</sup> only), averaged from 2.5° to 15°N, from 1 Jul to 15 Sep 1987.



Atmospheric Response Operators from the Fluctuation Dissipation Theorem: Validation and Applications

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- Data availability
- "Friendlier" conditions
- Generalization to functionals of state

## FDT Generalized to Functionals of State

Suppose have discretized dynamical system

$$\frac{d\phi}{dt} = F(\phi, \Lambda, f); \phi \Big|_{t=0} = \phi_0; \phi, \phi_0 \in \Phi \quad (\#)$$

Interested in

$$\langle A(\phi) \rangle = \int A(\phi) \rho(\phi) d\phi$$
, for stationary PDF  $\rho$ 

Suppose f is changed by a small  $\delta f$ . Want linear U ]  $\delta \langle A(\phi) \rangle = U \delta f$ 

If (Deker & Haake, 1975; Risken, 1984)

\*(#) is assumed to include a small noise term so its PDF is not fractal

\*(#) has a <u>F - P equation with unique solution</u>,

then

$$U_{ij}(t) = \int_{0}^{t} \left\langle A(\phi_{i}(t' + \tau)) \frac{\partial \ln \rho(\phi(t'))}{\partial \phi_{j}(t')} \right\rangle d\tau$$



Berner & Branstator (2006)

### **Generalized FDT -- Simplifications**

For a system like the earth's atmosphere  $\rho \approx \rho_0 \exp\left\{ \frac{(C^{-1}(0)\phi', \phi')}{2} \right\}$ 

So  $U(t) \cong \int_{0}^{t} \left\langle A(\phi'(t'+\tau))(\phi'(t))^{T} \right\rangle C^{-1}(0) d\tau$ 

Note if 
$$A = I$$
,  
$$U(t) = \int_{0}^{t} C(\tau)C^{-1}(0)d\tau$$

Majda, Abramov & Grote (2005) found third order accuracy for A = I and second order accuracy for quadratic A.





# Application

Atmospheric general circulation model (NCAR's CCM0)

\* Avoid sampling limitations when calculating lag covariances\* Enables rigorous testing of the resulting operator

Primitive equations, circa 1980 physical parameterizations

Perpetual January, fixed boundary conditions

R15 9 level } 18352 degrees of freedom

8 million 12hrly simulated states

#### **Reduce Dimensionality**

1. Pick fields from

\* ps \* psi x 9 \* chi x 9 \* T x 9

\* water vapor mixing ratio x 9

2. Truncate each field using EOFs

\* psi 100x9 (>90%)

\* T 496x9 (100%)

3. Form multivariate (truncated) fields,

normalize by std dev & overweight T,

calculate EOFs

truncate (1800 EOFs, >95%)

Assume lagged covariances vanish for  $\tau > 30d$ 



24 case average response to sinusoidal equatorial heating

(streamfunction)

 $\mathsf{CCM0}\,\Psi$ 





24 case average response to sinusoidal equatorial heating

(temperature)

CCM0 T









#### FD skill for individual cases



CONTOUR FROM -9 TO 88 BY 9 (x.001)





# SVD of transformed FD operator





# **Time-dependent Forcing**

For f fixed in time

$$R(t) = U(t)f$$
  
with  $U(t) = \int_{0}^{t} C(\tau)C^{-1}(0)d\tau$ 

So for a delta function forcing at t', the response at t is

$$\delta R(t) = \delta U(t - t') f(t') \delta t$$
  
for  $\delta U(t - t') = C(t - t')C^{-1}(0)$ 

And so for time - dependent f

$$R(t) = \int_0^t C(\tau) C^{-1}(0) f(\tau) d\tau$$

# 3day pulse forcing

### CCM0







### July - September 1987 OLR





Straub & Kiladis (2003)

FD







# Summary

The FDT can be used to estimate the response of the mean state and functionals of state.

The FDT can be used to estimate the response to constant and time-dependent forcing.

The FDT gives solutions that are accurate enough to be useful for optimization and inverse problems and for systematic explorations of atmospheric response.

Explorations using FDT operators for CCM0 indicate large sensitivities to forcing position and propagation speed. In particular they show the potential for short-lived or moderately propagating heat sources to affect midlatitudes.