Global Climate Models and Downscaling

What (the Heck) Are They and Why Should I Care?

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Fhe Path Ahead...

- Describe what climate models are, what their strengths and limitations are, & why they are useful
- Discuss some ways to correctly (& incorrectly) interpret global climate models
- Describe what downscaling is, what some methods are, what their strengths and limitations are, & why downscaling is useful



What is a "Model"?

 A model is a representation of an object, concept, system, etc. that is used by us to better understand that object, concept, system, etc.



Sean Gallup/Getty Images

Statistical Model



Conceptual Model



Analytical Model $\frac{\mathrm{d}P}{\mathrm{d}t} = kP$

Numerical Model

Population growth rate = $\frac{P(t_2) - P(t_1)}{P(t_1)(t_2 - t_1)}$



Why Do We Model the Climate? • To understand how the processes & feedbacks impact our contemporary climate & our paleoclimate, especially in areas/times with few measurements

- To project what our future climate may be
- To **experiment on our climate** over & over again to learn about what could happen if we change something in our system
- To measure the influence of humans by running models with & without manmade emissions ("fingerprint studies")



Numerical Modeling of Climate

- Numerical modeling uses computers and numerical methods to solve mathematical equations
- Basic steps:
 - Gather appropriate equations (i.e., algebraic & differential equations, parameterizations, statistical relationships) that adequately describe physical system
 - Simplify equations, as necessary, & use numerical/ computational methods to program equations for computers
 - Validate & calibrate the model
 - Run simulations
 - Analyze results





"Essentially, all models are wrong, but some are useful" - George E.P. Box



Governing Prognostic Equations for the Atmosphere

Conservation of momentum, energy, mass and moisture:

$$\frac{\partial \vec{V}}{\partial t} = -(\vec{V} \cdot \nabla)\vec{V} - \frac{1}{\rho}\nabla p - \vec{g} - 2\vec{\Omega} \times \vec{V} + \nabla \cdot \left(k_{\omega}\nabla\vec{V}\right) - \vec{F}_{d}$$

$$\rho c_p \frac{\partial T}{\partial t} = -\rho c_p (\vec{V} \cdot \nabla) T - \nabla \cdot \vec{R} + \nabla \cdot (k_\tau \nabla T) + C + S$$

$$\frac{\partial \rho}{\partial t} = -(\vec{V} \cdot \nabla)\rho - \rho(\nabla \cdot \vec{V})$$

$$\frac{\partial q}{\partial t} = -(\vec{V} \cdot \nabla)q + \nabla \cdot (k_q \nabla q) + S_q + E$$

Equation of state:

$$p = \rho R_d T$$

V = velocitvT = temperaturep = pressure $\rho = density$ q = specific humidityg = gravity $\Omega = rotation of Earth$ $F_d = drag \ force \ of \ Earth$ $R = radiation \ vector$ C = conductive heating $c_p = heat \ capacity, \ constant \ p$ E = evaporationS = latent heating $S_a = phase \ change \ source$ $k = diffusion \ coefficients$ $R_d = dry \ air \ gas \ constant$



Parameterizations



Parameterizations



Global Climate Model (GCM)

 Calculates temperature, moisture, wind, pressure, etc. at all of the "grid points" for every time step (10-20 minutes) over hundreds of years



 Current GCMs calculate at ~70 million points, which would be as many grid points as more than 2¹/₂ million Rubik's cubes



Evolution of Model Resolution

- FAR = First Assessment Report (IPCC; 1990)
- SAR = Second Assessment Report (1996)
- TAR = Third Assessment Report (2001)
- AR4 = Fourth Assessment Report (2007)
- AR5 = Fifth Assessment Report (2014)









Physics in Current Generation of Climate Models





Model or Observations?

Multi-Satellite Image Animation

https://www.youtube.com/ watch?v=m2Gy8V0Dv78

Global Climate Model Simulation

http://www.vets.ucar.edu/ vg/T341/index.shtml



Limitations of GCMs

- They can't calculate every variable everywhere at all times.
- Some physical processes, interactions, and feedbacks are not known (or not known well) and aren't included (or not fully included) in the model.
- Sensitivity of models to the same increase in radiative forcing (e.g., doubling of CO₂) is different between models.



Weather vs. Climate

- Common question: "If we can't predict the weather beyond 2 weeks, how can we predict the climate in 100 years?"
- Reminder: There is a difference between weather and climate! ("The climate is what you expect. The weather is what you get.")
 - Weather timing and location of specific weather phenomena (e.g., cold front passage, tornadic thunderstorm) are important to <u>forecast</u>
 - Climate statistics of the overall diurnal/ monthly/seasonal cycles and spatial patterns (e.g., El Niño, sea ice extent) are important to project









Steve Easterbrook

Chaos theory: Does the flap of a butterfly's wings in Brazil set off a tornado in Texas? – Ed Lorenz





Steve Easterbrook



Boundary Value Problem – Climate Projections in a <u>Changing</u> Climate



Steve Easterbrook



GCMs and the IPCC Process

- Projections using an "ensemble" of models from 20 climate modeling groups worldwide
- Models that include <u>both</u> natural forcing and forcing from human activities best relate to the actual observations



What are the Boundary Values?

- Emission scenario a plausible time sequence of anthropogenic and natural forcings (e.g., manmade GHGs, volcanoes, sunspot cycle) that drive changes in radiative forcing on the climate system; based on assumptions about patterns of economic and population growth, technology development, & other driving factors; used in IPCC Assessment Reports 3 & 4 (TAR & AR4)
- Representative concentration pathway (RCP) – a plausible <u>time sequence of changing</u> radiative forcing on the climate system; used in IPCC Assessment Report 5 (AR5)



Radiative Forcing Scenarios for AR5

- RCP 8.5 GHG emissions increase until forcing difference reaches 8.5 Watts per square meter
- RCP 6 radiative forcing stabilized around 2100 using a variety of technologies & strategies to reduce GHGs
- RCP 4.5 similar to RCP 6 but with a lower stabilization target
- RCP 2.6 a "peak-and-decline" scenario where GHG emissions are reduced significantly over time



How "Good" Are GCMs? • Two ways to examine representativeness of GCMs • How well does it do historically? • How well does it represent the main processes of the atmosphere, ocean, land, and ice?

• If we only focus on #1, we run the risk of getting the right answers for the wrong reasons.





















Think About Interpretation of GCM Output







Multi-Model Mean



Consecutive dry days, difference 2050-70 relative to 1980-2000



CLIMDEX Climate Extremes Indices, obtained from Environment Canada

Individual GCMs with Same Forcings



Consecutive dry days, difference 2050-70 relative to 1980-2000 (RCP8.5)

CLIMDEX Climate Extremes Indices, obtained from Environment Canada





'Simple intensity index' for precipitation



CLIMDEX Climate Extremes Indices, obtained from Environment Canada

Individual GCMs with Same Forcings



'Simple intensity index' for precipitation (2050-70 difference from 1980-2000, RCP8.5)





lowest radiative forcing

highest radiative forcing





lowest radiative forcing

highest radiative forcing



But What About Us? – Downscaling to Regions





But What About Us?

- How will climate change affect our water?
- How will it change the price of fuel?
- Can we still grow watermelons?
- Will our favorite beach resort be flooded?
- How do we have to change our behavior?
- How will our values and priorities change?
- Etc., etc.



What is Downscaling?

 Method to use coarse (low) resolution output (e.g., 100-500 km grid) from global climate models and obtain fine (high) resolution datasets (e.g., 10-50 km grid) for regional to local decision making

A "value-added" process





Why Downscale?

 To help answer stakeholders' questions about how the climate will change in their location (i.e., impact assessments) & better represent local climates



Urban climates

Main Downscaling Methods

 Dynamical downscaling – uses highresolution numerical models (i.e., regional climate models) to produce high-resolution, three-dimensional fields

 Statistical downscaling – uses statistical relationships to relate the value of the largescale grid box to site-specific values at the surface (two-dimensional fields); different methods include: (1) transfer functions, (2) weather typing, and (3) weather generators



Model Resolution of GCMs vs. RCMs



- Regional climate models (RCMs) are used for dynamical downscaling
- RCM resolutions range from about 4–50 km
- Depending on the resolution, RCMs may include explicit representations of processes rather than use parameterizations



Roles of GCM vs. RCM

- GCM simulates large-scale circulations responding to large-scale forcings (e.g., GHG concentrations)
- RCM is "nested" within GCM domain & simulates sub-GCM-grid-scale forcings (e.g., complex topography, land cover inhomogeneities) using physically based equations; can couple to ocean, seaice, hydrology, chemistry, & land-biosphere models





x (longitude)

Dynamical Downscaling using RCMs

- Historical simulations large-scale forcing provided by either GCM or "reanalysis" datasets
 - Output of historical GCM simulations that are <u>not</u> forced by observations is used as input for a limitedarea domain simulation using a high-resolution RCM
 - Output of dynamically consistent gridded dataset that has been <u>forced by assimilating all available observations</u> (i.e., a reanalysis dataset) is used as input to the RCM

Future projections –

large-scale forcing provided by GCM projections; output of GCM projection used as input to RCM



Benefits & Limitations of RCMs

- Benefits
 - Physically representative of how atmosphere works
 - Can capture "new extremes", as it considers dynamics, feedbacks, interactions, & physical processes
 - Does not require observations (which may not exist in poorer countries or over expanses of ocean/sea waters)

• Limitations

- Needs huge computational resources (i.e., supercomputer) & storage capacity, so only certain variables may be output, only selected "time slices" may be examined (e.g., 2050-2060), no ensembles may be available, or only a couple of scenarios may be used (e.g., RCP 2.6 & RCP 8.5)
- RCMs inherit biases from driving GCMs & are biased themselves, so bias correction must be applied



High-resolution Modeling at OU

North American Regional Climate Change Assessment Program

High-Resolution Weather Research and Forecasting (WRF) Model



WRF Domains for Low (25km) and High (4km) Resolutions





Interpretation Questions to Ask

- Has the model been compared to historical observations?
- Are the results bias corrected? (Were the model biases in temperature, precipitation, etc. removed?)
- How many scenarios were used? How many GCMs were used to force the RCM? How many RCMs were used? (Is there a sufficient ensemble of models to capture the possibilities of the future?)
- If only one RCM was used, did they run it multiple times using perturbations in the physics?



Coordinated Modeling Efforts

 North American Regional Climate Change Assessment Program (NARCCAP) – an

"international program that serves the high resolution climate scenario needs of the United States, Canada, and northern Mexico"

 Uses several AOGCMs that force several RCMs to produce an <u>ensemble</u> of projections for SRES A2 emissions scenario

	Driving AOGCMs						
RCMs	NCEP	CCSM	CGCM3	GFDL	HadCM3		
CRCM		x		X	x		
ECP2	x		x		x		
HRM3	x		x		x		
MM5I	1		x	X	x		
RCM3	x	X			x		
WRFG	1	X		X	x		
ECPC					X		
WRFP					X		





Coordinated Modeling Efforts • CORDEX (Coordinated Regional Climate Downscaling Experiment) – to "advance and coordinate the science and application of regional climate downscaling through global partnerships;" sponsored by the World Climate Research Programme (WCRP)







Future of Dynamical Downscaling

• Variable resolution GCM (adaptive mesh refinement) – run GCM with adaptable grid spacing, increasing resolution over region of interest



Statistical Downscaling Methods

- Scaling/delta methods spatially interpolate GCM output; more for "bias correction" of GCMs
- Transfer function methods use a function to relate predictors & predictands; includes linear & non-linear regression, artificial neural network, & machine learning techniques
- Weather pattern (typing) methods use pattern recognition techniques to classify historical patterns & relate them to future patterns
- Stochastic weather generator methods use random number generators to simulate daily time series of variables



Statistical Downscaling using Delta Method





GCM output (historical & future) is interpolated to...

...higher resolution, then relative change (delta) between historical & future GCM output is computed. Delta is applied spatially to highresolution, historical observations... ... to yield downscaled projection for future.



Statistical Downscaling using Delta Method

- Benefits very simple computationally; straightforward to implement; time sequence of events matches the historic record in the gridded data sets; bias from GCMs is not passed on; & easily interpreted
- Limitations can not resolve regional-local scale processes & relationships; assumes changes only in the means (i.e., no changes in higher statistical moments); does not allow for changes in variability and/or extremes (i.e., can underestimate low-frequency, high-impact events)



Statistical Downscaling using Transfer Functions

- Predictor values of a climate variable (e.g., air temperature, precipitation) at the GCM grid box
- **Predictand** site-specific variable (e.g., max. temperature at the surface) that is predicted, usually on a daily time scale, from the predictors
- **Transfer function** a statistical model that relates the predictor to the predictand using an appropriate technique & actual observations for calibration & validation



Statistical Downscaling using Transfer Functions

- Main assumption of stationarity statistical relationship between large-scale predictors & small-scale predictands (i.e., transfer function) that was <u>computed using</u> historical observations is valid in the future
- Benefits relatively simple computationally; easy to produce; can provide point estimates; can produce ensembles of high-resolution climate projections for long time periods; reduces biases from GCM output
- Limitations requires long time series of quality observations of predictand variable for calibration & validation; may not be a relationship between large & small scales for some predictands; relationships only valid for range of observational data at location; does not consider dynamics, feedbacks, interactions, & physical processes

Predictors

 Common predictors – daily/monthly maximum/ minimum/average temperature; daily/monthly precipitation; sea-level pressure; humidity; winds

- Predictors require a long time series of observations to calibrate the statistical model
- May relate multiple predictors to a single predictand to obtain between statistical relationships; may also relate a predictor across multiple grid boxes to a predictand in a single grid box
- **Decisions are subjective** on how to implement the transfer function



Empirical Statistical Downscaling Cautions

 Statistical methods rely on the amount of available data, so results using fewer observations (top) can be significantly different from results using more observations (bottom)





Statistical Downscaling using Weather Typing

 Statistically relate large-scale, GCM output to regional spatial patterns, classify patterns either objectively or subjectively, & create conditional probability distributions from local observations





GCM output

Statistical Downscaling using Weather Typing

 Advantages – represents daily extremes better than transfer functions; founded on physical linkages between large and small scales; can produce high-resolution climate projections

 Disadvantages – also assumes stationarity; requires long-term spatial observations across region of interest; does not account for biases in the GCM output; pattern matching dependent on the domain extent & location; no analogs for future climates



Statistical Downscaling using Weather Generators

- Stochastic weather generator creates artificial time series of weather data at a given site based on its statistical characteristics of observed weather; usually precipitation is estimated for wet days based on precip. frequency distribution from observations, then other variables (e.g., daily max. & min. temperature) are conditionally based on precipitation occurrence (i.e., different relationships whether it's a wet or dry day)
- Advantages can produce projections in data sparse areas; can produce hourly time series
- Disadvantages does not represent extremes, rare events, or spatial correlation well; also assumes stationarity





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Getting the Data

Index of /RedRiver/Downscaled/CCSM4/rcp85/

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pr day RRprp1-BCOM-A18aaL01K00 rcp85 r6ilp1 RR>	14-Apr-2015	22:06	3651419332
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<u>http://data.cybercommons.org/organization/south-central-</u> <u>climate-science-center</u>



.. the End of the Path

 Global climate models are not intended to replicate the weather of the past or to forecast the weather of the future. Treat their results as "representative" of the past and future climate.

- Downscaling methods have their limitations. Be sure you understand those before you apply them.
- It's best to use "ensemble" results that include multiple scenarios, multiple GCMs, & multiple downscaling methods. There is no "best" one of each.
- If you care about extremes, don't just use the means.
- Understand your application & choose wisely.







