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## DSICE - Dynamic Stochastic General Equilibrium Analysis of Climate Change Policies and Discounting

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- ► All IAMs (Integrated Assessment Models) are deterministic
- ► Most are myopic, not forward-looking
- This combination makes it impossible for IAMs to consider decisions in a dynamic, evolving and uncertain world
- We formulate dynamic stochastic general equilibrium extensions of DICE (Nordhaus)
- Conventional wisdom: "Integration of DSGE models with long run intertemporal models like IGEM is beyond the scientific frontier at the moment" (Peer Review of ADAGE and IGEM, June 2010)
- Fact: We use multidimensional dynamic programming methods, developed over the past 20 years in Economics, to study dynamically optimal policy responses to climate change

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Today's Presentation

- ► Fix DICE
- ► Introduce DSICE
- Apply DSICE to ask what is optimal policy when faced with abrupt and irreversible climate change?

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 DICE: maximize social utility subject to economic and climate constraints

$$\max \quad c_t, l_t, \mu_t \quad \sum_{t=0}^{\infty} \beta^t u(c_t, l_t)$$

s.t. 
$$k_{t+1} = (1-\delta)k_t + \Omega_t(1-\Lambda_t)Y_t - c_t,$$
  
 $M_{t+1} = \Phi^M M_t + (E_t, 0, 0)^\top,$   
 $T_{t+1} = \Phi^T T_t + (\xi_1 F_t, 0)^\top,$ 

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• output: 
$$Y_t \equiv f(k_t, l_t, t) = A_t k_t^{\alpha} l_t^{1-\alpha}$$

• damages: 
$$\Omega_t \equiv \frac{1}{1 + \pi_1 T_t^{AT} + \pi_2 (T_t^{AT})^2}$$

• emission control effort:  $\Lambda_t \equiv \psi_t^{1-\theta_2} \theta_{1,t} \mu_t^{\theta_2}$ 

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• Mass of carbon concentration:  $M_t = (M_t^{AT}, M_t^{LO}, M_t^{UP})^{\top}$ 

• Temperature: 
$$T_t = (T_t^{AT}, T_t^{LO})^{\top}$$

► Total carbon emission:  $E_t = E_{Ind,t} + E_{Land,t}$ , where

$$E_{\mathit{Ind},t} = \sigma_t(1-\mu_t)(f_1(k_t,l_t,\theta_t,t))$$

Total radiative forcing (watts per square meter from 1900):

$$F_t = \eta \log_2(M_t^{AT}/M_0^{AT}) + F_t^{EX}$$

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- ► DICE has 10 year time periods
- ► First, we compare the deterministic case to Nordhaus DICE model
- Strange finite-difference scheme for dynamics, incompatible with any method in the numerical literature
- We build a 10-year and 1-year period length model, and find Nordhaus' approach is unreliable:

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## Cai-Judd-Lontzek DSICE Model: Dynamic Stochastic Integrated Model of Climate and Economy

- DSICE = DICE2007
  - constraint on savings rate , *i.e.* : s = .22
  - ad hoc finite difference method
  - + stochastic production function
  - $+ \quad {\rm stochastic} \ {\rm damage} \ {\rm function}$
  - + 1-year period length

stochastic means: intrinsic random events within the specific model, not uncertain parameters

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► DSICE: solve stochastic optimization problem

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$$\max_{c_{t}, l_{t}, \mu_{t}} \mathbb{E}\left\{\sum_{t=0}^{\infty} \beta^{t} u(c_{t}, l_{t})\right\}$$
  
i.t.  $k_{t+1} = (1-\delta)k_{t} + \Omega_{t}(1-\Lambda_{t})Y_{t} - c_{t},$   
 $M_{t+1} = \Phi^{M}M_{t} + (E_{t}, 0, 0)^{\top},$   
 $T_{t+1} = \Phi^{T}T_{t} + (\xi_{1}F_{t}, 0)^{\top},$   
 $\zeta_{t+1} = g^{\zeta}(\zeta_{t}, \omega_{t}^{\zeta}),$   
 $J_{t+1} = g^{J}(J_{t}, \omega_{t}^{J})$ 

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$$Y_t \equiv f(k_t, I_t, \underbrace{\zeta_t}, t) = \underbrace{\zeta_t}_{t} A_t k_t^{\alpha} I_t^{1-\alpha}$$
  
•  $\Omega_t \equiv \underbrace{J_t}_{1+\pi_1 T_t^{AT} + \pi_2 (T_t^{AT})^2}, \qquad \Lambda_t \equiv \psi_t^{1-\theta_2} \theta_{1,t} \mu_t^{\theta_2}$ 

►  $\zeta_t$ : productivity shock,  $J_t$ : damage function shock

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► DP model for DSICE :

$$V_{t}(k,\zeta,J,M,T) = \max_{c,l,\mu} u(c,l) + \beta \mathbb{E}[V_{t+1}(k^{+},\zeta^{+},J^{+},M^{+},T^{+})]$$
  
s.t.  $k^{+} = (1-\delta)k + \Omega_{t}(1-\Lambda_{t})f(k,l,\zeta,t) - c,$   
 $M^{+} = \Phi^{M}M + (E_{t},0,0)^{\top},$   
 $T^{+} = \Phi^{T}T + (\xi_{1}F_{t},0)^{\top},$   
 $\zeta^{+} = g^{\zeta}(\zeta,\omega^{\zeta}),$   
 $J^{+} = g^{J}(J,\omega^{J})$ 

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Application: Uncertain climate change & discounting

- Standard assumption in DICE: damages are a function of contemporaneous temperature
- However, many scientists are worried about triggering abrupt and irreversible climate change
- Consequence: permanent and significant damage over a large time horizon
- ► Abrupt climate change must be modeled stochastically
- How does optimal emission control policy respond to the threat of abrupt and irreversible climate change?

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What is the appropriate discount rate?

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hazard rate				

Lenton et al. (PNAS, 2008) characterize some major tipping elements in the earth's climate system:

Tipping Element	key Impacts
Thermohaline circulation collapse	reg. sea level rise (1m) cool North Atl, warm south. ocean
West Antarctic ice sheet	sea level (up to 5 m)
changes in El Niño Southern Oscillation	Drought (e.g: SE Asia) + El Niño frequency and persistence
Permafrost melting	enhanced global warming due to <i>CH</i> 4 and <i>CO</i> 2release

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Zickfeld et al. (2007, Climatic Change): Expert's subjective probability (%) that a collapse of THC will occur or be irreversibly triggered by 2100



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- Kriegler et al. (PNAS, 2009) conduct an extensive expert elicitation on some major tipping elements and their likelihood of abrupt change.
  - THC collapse
  - Greenland ice sheet melting
  - WestAntarctic ice sheet melting
  - Amazon rainforest dieback
  - ► ElNiño/Southern Oscillation
- They compute conservative lower bounds for the probability of triggering at least 1 of those events
  - ▶ 0.16 for medium  $(2 4^{\circ}C)$  global mean temperature change
  - 0.56 for high (above  $4^{\circ}C$ ) global mean temperature change

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We calculate (reverse engineer) the annual hazard rate of THC collapse as a function of global mean temperature rise based on Zickfeld et al. (2007, Climatic Change)



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- The time of tipping is a poisson process
- Once the tipping point is reached the shock to the damage function persists
- We assume a tipping point causes a permanent 10 % reduction in output.
- Probability of a tipping point occurring at time t is equal to the hazard rate as a function of temperature at t

- ▶  $h_t = 0.01 \cdot T_t T_{2000}$
- ▶ We simulate 1000 optimal paths
- ▶ We report mean, median and quartiles





- the Nordhaus (DICE) specification of externality implies a rising emission control rate
- intuition
  - temperature is rising
  - damage at time t is rising
  - present value of damages is rising
  - marginal benefit of emissions control is rising

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- ► In RICE (Nordhaus, 2010 PNAS) seal level rise is a linear function of current temperature and hence persistent.
- ► However, it is reversible and deterministic.
- ► DSICE has stochastic irreversible damages.

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- $\mu$  is higher if the tipping has not yet occurred
- the drop in  $\mu$  after the tipping represents the effort to delay tipping
- the anti-tipping effort is constant over time even though the danger and costs are rising

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Summary of Application

- ► DSICE is the first example of a stochastic IAM
- DSICE models tipping points where current temperature can have a permanent damage effect on output
- DICE model damage function does not incorporate this kind of externality which is in the nature of tipping points.
- DICE implies steeply rising emission control rates
- DSICE implies a constant effort to delay a catastrophe despite the rising prob. of crossing a tipping point and higher expected damage as percentage of GDP
- Policies towards catastrophes resemble insurance expenditures which always have a negative return

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Conclusion

- ► Stochastic IAM analysis with short time periods is tractable
- ► DSICE implies a constant effort to delay a catastrophe, not a "ramp"
- Including stochastic elements in climate and economics can substantially effect policy results

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