

# CAARMS Talk

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1. Part I - Introduction and History.
2. Part II - Welfare Economics, Sustainable Criteria.
3. Part III - Statistics.

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# Part I

## Introduction and History

# What is Sustainability?

- ▶ Various definitions from various authors and settings.
- ▶ Generally a **process characterization**.
- ▶ To reform Emery's prurient simile: Sustainability is hard to define but obvious when it is absent.

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## History of 'Sustainability'

Thomas Malthus' *An Essay on the Principle of Population*  
(1798-1826 six editions)



*"Of Increasing Wealth, as it affects the Condition of the Poor"*

## History of 'Sustainability'

Frank Ramsey's *A Mathematical Theory of Saving* (1928)



*"[interest on wealth] is ethically indefensible...polite expression for rapacity..."*

## History of 'Sustainability'

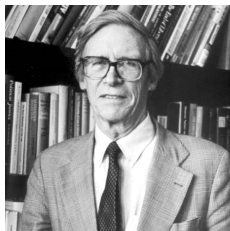
Harold Hotelling's *The Economics of Exhaustible Resources*  
(1931)



*"Problems of exhaustible assets are peculiarly liable to become entangled with the infinite."*

## History of 'Sustainability'

John Rawls' *Theory of Justice* (1972)



*"Just society is one so organized as to promote the greatest...well being of least well off."*

# Early Themes

- ▶ **Implicit Concern for [intergenerational] social welfare**
- ▶ Explicit worry about consumption
- ▶ Beginnings of mathematical formalism, but...
- ▶ ...mostly 'theological' and narrative.
- ▶ Trade-off between wealth [consumption] and sustainability.

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## Working Definition

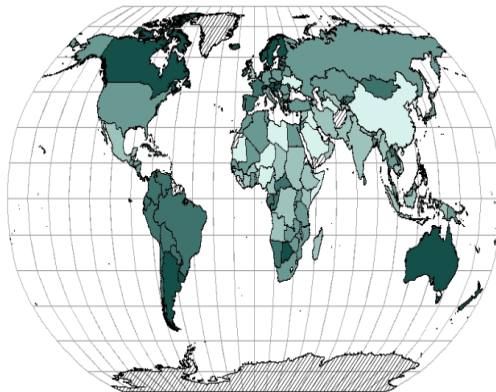
A **Sustainable** process: One that can be maintained at a certain level indefinitely.

**Sustainable Development:** Development of economic systems that can last indefinitely.

Bruntland Commission (1983): *“Meets the needs of the present without compromising the ability of future generations to meet their own needs.”*

## An Aside: The ESI

ESI 2002



Environmental Sustainability Index 2002

## Part II

### A Sustainable Criteria

# Mathematical Formalism: Welfare Economics

A simple setup, let:

- ▶  $c_t$  the consumption of some resource at time  $t$
- ▶  $s_0$  initial stock of resource.
- ▶  $u(c_t)$  an increasing, strictly concave function ( $\dot{u} > 0$ ,  $\ddot{u} < 0$ ).

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# Welfare Economics

The goal under Hotelling's version of **discounted utilitarianism** (1931) is to:

$$\max W(u) = \max \int_0^{\infty} u(c_t) e^{\delta t} dt$$

s.t.

$$\int_0^{\infty} c_t \leq s_0$$

# Welfare Economics

Write:

$$s_t = s_0 - \int_0^t c_f df$$

$$s_t \geq 0 \quad \forall t$$

# Welfare Economics

Yielding...

$$\max W(u) = \max \int_0^{\infty} u(c_t) e^{-\delta t}$$

s.t.

$$s_t \geq 0$$

and

$$\dot{s}_t = -c_t$$

# Welfare Economics

Hamiltonian approach: Add to maximand the RHS of the differential equation constraint times multiplier.

$$H = u(c_t)e^{-\delta t} - \lambda_t e^{-\delta t} c_t$$

with  $\lambda_t$  the **shadow price** at time  $t$  and  $\lambda_t e^{-\delta t}$  the present value shadow price.

# Welfare Economics

Maximizing  $H$  w.r.t.  $c_t$  yields

$$\dot{u}(c_t) = \lambda_t \quad \forall t$$

and

$$\frac{d(\lambda_t e^{-\delta t})}{dt} = -\frac{\partial H}{\partial t}$$

# Welfare Economics

These imply

- ▶ The increase in utility from consumption should equal the shadow price of the resource.
- ▶  $\frac{d\lambda}{dt} - \delta\lambda = 0 \rightarrow \lambda_t = \lambda_0 e^{\delta t}.$

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# Hotelling Rule

- ▶ Consumption is regulated by change in (shadow) price.
- ▶ Difference in welfare functions is governed by state variable  $s_0$  and discount rate parameter  $\delta$ .



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## Variations on measuring utility

Malthus:

$$W(u; \delta)^{Malthus} := \max_u \{ \min_{c_t} \int_0^{\infty} u(c_t) e^{-\delta t} dt \}$$

## Variations on measuring utility

Ramsey:

$$W(u; \delta, B)^{Ramsey} := \min \int_0^{\infty} [B - u(c_t)] dt$$

where  $B = \sup_t u(c_t)$ .

# Variations on measuring utility

Rawls:

$$W(u; \delta)^{Rawls} := \max_u \{ \min_t u(c_t) e^{-\delta t} \}$$

## Objectives under previous criteria

- ▶ The constraint  $\int_0^\infty c_t dt \leq s_0$  applies to all of the above.
- ▶ The shadow prices of the resources,  $\lambda_0$ , oppose consumption - with additional parameters ( $B, \delta$  for example).
- ▶ Thinking statistically, the criteria are **estimating equations** for parameters.

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## Objectives under previous criteria

The criteria yield this inequality:

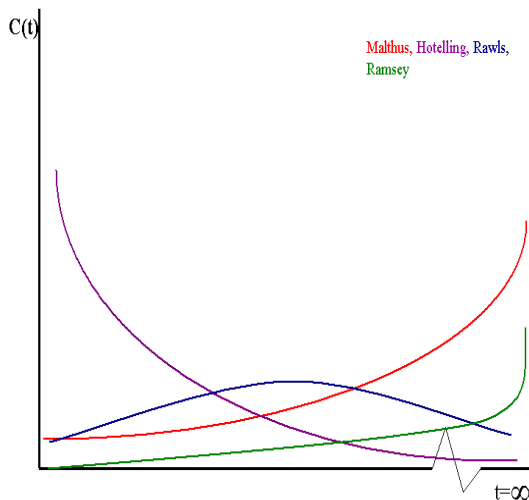
$$\lambda_0^{Rawls} > \lambda_0^{Ramsey} > \lambda_0^{Malthus} > \lambda_0^{Hotelling}$$

**So the relevant effect - for sustainability - is to raise the shadow price of the exhaustible resource.**

**And the relevant effect - for statistics - is to define consumption (and discount rate) as solution to estimating equations**



# Comparison of criteria



# Insensitivity to Present or Future

Notice...

- ▶ ...the Malthus and Ramsey welfare functions 'weigh' the infinite future greater than the finite present.
- ▶ ...the Hotelling and Rawlsian criteria 'weigh' the finite present greater than the infinite future.

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## Part III

# Statistical Methods for Sustainability

## Sustainability Characterized

Chichilnisky (1997) introduces an axiomatization for intergenerational equity as a criteria for sustainability:



# Sustainability Characterized

Letting  $\mathbf{u} = \{u_t\}_{t=1}^{\infty}$  be a bounded, real valued utility stream - on  $(\Omega, \mathcal{F}_t, \mathbb{P} = \mathbb{P}^* + \mathbb{P}_{\infty})$ .

- ▶ **Insensitivity to the future:**  $\mathbb{P}_{\infty}(W(\mathbf{u})) = 0$  if  $\mathbb{P}_{\infty}$  is a *purely finitely additive* measure.
- ▶ **Insensitivity to the present:**  $E_{\mathbb{P}^*}[W(\mathbf{u})] = 0$  for all countably additive measures  $\mathbb{P}^*$

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# Chichilnisky's axiomatization

Chichilnisky's axiomatization [1996,1997]:

$$W(\mathbf{u}) = \alpha \int_{R^+} u(c_t) d\mathbb{P}^*(t) + (1 - \alpha) \mathbb{P}_\infty(\mathbf{u})$$

where  $\mathbb{P}_\infty$  is measure zero on finite sets. This characterization ensures equity to present and unforeseen generations.



# Chichilnisky's axiomatization

The combination of measures which are singular w.r.t each other disallows ordinary optimization procedures.

$$\mathbb{P}^* \perp \mathbb{P}_\infty$$

# Chichilnisky's axiomatization

However:

Both  $d\mathbb{P}^*$  and  $d\mathbb{P}_\infty$  are absolutely continuous with respect to  $d\mathbb{P}$

# Statistical Estimation

The goal here is to introduce statistical estimators for a sustainable development path - or utility stream - via a representation of Kullback-Leibler divergence.

# Probability Measure Based Distance

Call:

$$D(d\mathbb{P}^k, d\mathbb{P}) = E_{d\mathbb{P}}[\log(\frac{d\mathbb{P}^k}{d\mathbb{P}})]$$

## Probability Measure Based Distance

Let  $d\mathbb{P}^k$  be the probability density induced by the filtration  $\mathcal{F}$  at the  $k$  – *th* cutoff of the utility stream.

Then

$$KL(d\mathbb{P}^k, d\mathbb{P}) = \sum^k d\mathbb{P} \log\left(\frac{d\mathbb{P}^k}{d\mathbb{P}}\right)$$

## Probability Measure Based Distance

But  $d\mathbb{P} = d\mathbb{P}^* + d\mathbb{P}_\infty$ . So

$$\begin{aligned} KL(d\mathbb{P}^k, d\mathbb{P}) &= \\ &= \sum^k d\mathbb{P}^* \log\left(\frac{d\mathbb{P}^k}{d\mathbb{P}^* + d\mathbb{P}_\infty}\right) + \sum^k d\mathbb{P}_\infty \log\left(\frac{d\mathbb{P}^k}{d\mathbb{P}^* + d\mathbb{P}_\infty}\right) \end{aligned}$$

## Probability Measure Based Distance

$$= \sum^k (d\mathbb{P}^* + d\mathbb{P}_\infty) \log(d\mathbb{P}_k) - \sum^k (d\mathbb{P}^* + d\mathbb{P}_\infty) \log(d\mathbb{P}^* + d\mathbb{P}_\infty)$$

The second term is just the entropy of the full measure.

Looking at the first term...

## Probability Measure Based Distance

...and taking the conditional expectation

$$\begin{aligned} &= E\left(\sum^k (d\mathbb{P}^* + d\mathbb{P}_\infty) \log(d\mathbb{P}_k) \middle| \mathcal{F}_k\right) \\ &= E\left(\sum^k d\mathbb{P}^* \log(d\mathbb{P}_k) \middle| \mathcal{F}_k\right) + E\left(\sum^k d\mathbb{P}_\infty \log(d\mathbb{P}_k) \middle| \mathcal{F}_k\right) \end{aligned}$$



## Probability Measure Based Distance

yields

$$= \sum^k \log(d\mathbb{P}_k) E(d\mathbb{P}^*) + \sum^k \log(d\mathbb{P}_k) E(d\mathbb{P}_\infty)$$

This is  $\mathrel{:=} \textit{data} \cdot \textit{parameters} + \textit{data} \cdot \textit{parameters}$ , as well as a convex sum of singular measures meeting Chichilnisky's criteria.

# Probability Measure Based Distance

Minimizing

$$= \sum^k \log(d\mathbb{P}_k) E(d\mathbb{P}^*) + \sum^k \log(d\mathbb{P}_k) E(d\mathbb{P}_\infty)$$

with respect to the parameters of the measures (which can include mixing parameter  $\alpha$ ) yields estimating equations which yield inference on utility/developments (i.e. consumption) paths

## Next steps

- ▶ Derive examples for singular measure pairs
- ▶ Investigate distribution of  $D$ , estimating equations, possible CUSUM test.
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