

# CALIBRATING THE RBC MODEL

FEBRUARY 2, 2012

Introduction

## STEADY STATE

- Deterministic steady state the natural point of approximation**
- Shut down all shocks and set exogenous variables at their means**
- The idea: let economy run for many (infinite) periods**
  - Time eventually "doesn't matter" any more
  - Drop all time indices

$$\frac{u_n(\bar{c}, \bar{n})}{u_c(\bar{c}, \bar{n})} = \bar{z} F_n(\bar{k}, \bar{n})$$

$$u_c(\bar{c}, \bar{n}) = \beta u_c(\bar{c}, \bar{n}) \left[ \bar{z} F_k(\bar{k}, \bar{n}) + 1 - \delta \right]$$

$$\bar{c} + \delta \bar{k} = \bar{z} F(\bar{k}, \bar{n})$$

$$\ln \bar{z} = (1 - \rho_z) \ln \bar{z} + \rho_z \ln \bar{z} \Rightarrow \bar{z} = \bar{z} \quad (\text{a parameter of the model})$$

- Given functional forms and parameter values, solve for  $(\bar{c}, \bar{n}, \bar{k})$** 
  - The steady state of the model**
  - Taylor expansion around this point**

## CALIBRATION – PHILOSOPHY

- An economic model is a measuring device
- If model makes “believable” predictions along some important dimensions (i.e., “matches some key data”)...
- ...then maybe its predictions are “believable” along the novel dimensions of the model
- Getting some “partial derivatives” of the model in known directions correct...
- ...may build credibility that its “partial derivatives” in novel directions are at least not grossly incorrect

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- ...may build credibility that its “partial derivatives” in novel directions are at least not grossly incorrect
- Make model match some data of interest – often long-run (i.e., time-averaged data) growth facts
  - Preferably well-accepted “stylized facts”
  - Solow growth model in the background
  - Natural candidate: Kaldor growth facts
- Calibration vs. Estimation

## CALIBRATION OF BASELINE RBC MODEL

- **Must take a stand on three (related) points**
  - Which data do we want model to match? (even constructing data is challenging...)
  - Functional forms (utility, production)
  - Parameter values
- **Choose functional forms consistent with "Kaldor-plus facts"**
  - (K1) Capital income share and labor income share of GDP are stationary
  - (K2) All real quantity variables grow at same rate in the long run
  - (K3) Real interest rate is stationary
  - (K4) Hours per worker are stationary
  - (K5) (K2) requires trend productivity to be labor-augmenting (Phelps 1966)

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- **Often start with RBC model that abstracts from long-run growth**
- **But "true" calibration begins with model featuring *only* long-run growth**
  - Puts restrictions on instantaneous utility and production forms
  - Use (K1)-(K5) to obtain these restrictions
- **Richer models: more calibration targets and/or treating data differently**
  - Monopoly markups (e.g., Dixit-Stiglitz and sticky price models)
  - Probability of finding a job (e.g., labor search models)
  - Durable consumption vs. non-durable consumption

## RBC MODEL WITH GROWTH

- Absent shocks, TFP grows at deterministic rate  $\gamma$

- Planner problem/perfect competition

$$\max E_0 \sum_{t=0}^{\infty} \beta^t u(C_t, n_t)$$

subject to

$$C_t + K_{t+1} - (1 - \delta)K_t = z_t F(K_t, n_t, X_t)$$

$$X_t = \gamma X_{t-1}, \quad \gamma \geq 1$$

Red indicates variables or parameters that will be modified when detrending the model

Trend productivity is labor-augmenting (Harrod-neutral) (Makes use of fact (K5))

Flow resource constraint

Evolution of deterministic component of productivity

given stochastic process for evolution of  $z_t$  and  $(K_0, z_0, X_0)$

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- Suppose  $z_t = 1$  always, so only deterministic growth
- Deterministic dynamics of  $(C_t, K_{t+1}, n_t, X_{t+1})$  governed by

$$(1) \quad \frac{u_n(C_t, n_t)}{u_c(C_t, n_t)} = X_t F_2(K_t, n_t, X_t)$$

Labor supply function (aka consumption-labor optimality)

$$(2) \quad \frac{u_c(C_t, n_t)}{\beta u_c(C_{t+1}, n_{t+1})} = F_1(K_{t+1}, n_{t+1}, X_{t+1}) + 1 - \delta$$

Capital supply function (aka consumption-savings optimality)

$$(3) \quad C_t + K_{t+1} - (1 - \delta)K_t = F(K_t, n_t, X_t)$$

$$(4) \quad X_t = \gamma X_{t-1}$$

Normalize  $X_0 = 1$

## RESTRICTIONS ON FUNCTIONAL FORMS

□ **Deterministic dynamics of  $(C_t, K_{t+1}, n_t, X_t)$  governed by**

$$(1) \quad -\frac{u_n(C_t, n_t)}{u_c(C_t, n_t)} = X_t F_2(K_t, n_t, X_t) \quad (3) \quad C_t + K_{t+1} - (1-\delta)K_t = F(K_t, n_t, X_t)$$

$$(2) \quad \frac{u_c(C_t, n_t)}{b u_c(C_{t+1}, n_{t+1})} = F_1(K_{t+1}, n_{t+1}, X_{t+1}) + 1 - \delta \quad (4) \quad X_t = \gamma X_{t-1}$$

□ **(K1) Capital income share and labor income share of GDP are stationary  
And viewing economic profits as zero**

$$\Rightarrow F(K, nX) = K^\alpha (nX)^{1-\alpha} \quad (\alpha \approx 0.4)$$

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- **(K2) All real quantity variables grow at same rate in the long run**

$$\Rightarrow \frac{Y_{t+1}}{Y_t} = \frac{C_{t+1}}{C_t} = \frac{K_{t+1}}{K_t} = \frac{X_{t+1}}{X_t} = \gamma, \quad \forall t$$

$$\Rightarrow y_t \equiv \frac{Y_t}{X_t} = \bar{y}, \quad k_t \equiv \frac{K_t}{X_t} = \bar{k}, \quad c_t \equiv \frac{C_t}{X_t} = \bar{c}, \quad \forall t$$

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- **And scale (3) by  $X_t$  to make stationary**

$$\frac{u_n(C_t, n_t)}{u_c(C_t, n_t)} = (1-\alpha)X_t \left( \frac{k_t}{n_t} \right)^\alpha$$

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$$c_t + \gamma k_{t+1} - (1-\delta)k_t = k_t^\alpha n_t^{1-\alpha} \quad X_t = \gamma X_{t-1}$$

Note long run growth rate affects capital accumulation even in stationary representation!

## RESTRICTIONS ON FUNCTIONAL FORMS

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- **(K4) Hours per worker are stationary**

$$\Rightarrow n_t = \bar{n} \quad \text{along deterministic path.}$$

**BUT  $\bar{n}$  is endogenous...**

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- **Implied already (RHS of (2)) is**

- **(K3) Real interest rate is stationary**

- **Final step – functional form for utility?**

- **Observations**

- **Optimal choice of labor ( $\bar{n}$ ) must be independent of  $X_t$  (from (1))**
- **Requires offsetting income and substitution effects of wages (long-run productivity) on labor supply**
- **IMRS can only depend on  $C_{t+1}/C_t$  (from (2)), which in turn =  $\gamma$**

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- **Two requirements together imply**

$$u(C_t, n_t) = \begin{cases} \frac{[C_t v(n_t)]^{1-\sigma} - 1}{1-\sigma} & \text{if } \sigma > 0, \sigma \neq 1 \\ \ln C_t + v(n_t) & \text{if } \sigma = 1 \end{cases} \quad \text{King, Plosser, Rebelo (1988 JME)}$$

## STEADY STATE

- **Steady state  $(\bar{c}, \bar{n}, \bar{k})$  solves (1), (2), (3)**

- **A dynamic phenomenon!**

- **Not static!**

- **Economy is moving exactly along its long-run (i.e., deterministic) growth path**

- **Balanced growth path**

- **Scale of absolute quantity outcomes within model is meaningless**

- **What does, e.g.,  $\bar{c} = 1.56$  mean?**



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  - Economy is moving exactly along its long-run (i.e., deterministic) growth path
  - **Balanced growth path**
- **Scale of absolute quantity outcomes within model is meaningless**
  - What does, e.g.,  $\bar{c} = 1.56$  mean?
- **Relative quantity outcomes are interpretable**
  - Provide calibration targets
  - e.g.,  $\bar{c} / \bar{y} = 0.70$ ,  $\bar{k} / \bar{y} = 2.5$  (if annual measurement)
- **Time use and intertemporal price outcomes within model are interpretable**
  - Provide calibration targets
  - $\bar{n}$  is fraction of time spent in paid market work
    - Empirical:  $n \approx 0.30$
  - Return on capital  $\alpha \left( \frac{\bar{k}}{\bar{n}} \right)^{\alpha-1} + 1 - \delta$
- **Use ss calibration targets to set parameter values, given functional forms**

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## RBC MODEL WITHOUT GROWTH

- Often start instead with

$$u(c_t, n_t) = \begin{cases} \frac{[c_t v(n_t)]^{1-\sigma} - 1}{1-\sigma} & \text{if } \sigma > 0, \sigma \neq 1 \\ \ln c_t + v(n_t) & \text{if } \sigma = 1 \end{cases} \quad \text{and} \quad \sum_{t=0}^{\infty} \beta^t u(c_t, n_t)$$

$c_t = C_t / X_t$      $\uparrow$

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- For this transformed model to deliver same steady state (relative quantities, time use, and  $r$ ), require

- Resource constraint  $c_t + \gamma k_{t+1} - (1-\delta)k_t = z_t k_t^\alpha n_t^{1-\alpha}$

- Subjective discount factor  $\beta \equiv b\gamma^{1-\sigma}$  (King and Rebelo, p. 945)

- Typical assumption  $\gamma = 1$  omits growth altogether
- What if trend growth rate fluctuates,  $\gamma_t$ ?
  - Typical representation cannot accommodate **trend shocks** because  $\gamma = 1$
  - Trend shocks** fairly common in small-open-economy models
  - Affects discount factor and capital accumulation equation

## BASELINE RBC MODEL

- Assuming  $\gamma = 1$ ...
- ...complete calibration?
- Data: long-run labor income share of GDP  $\approx 0.60$** 
  - Cobb-Douglas  $F(\cdot)$  implies

$$\frac{wn}{F(k,n)} = \frac{(1-\alpha)k^\alpha n^{1-\alpha}}{k^\alpha n^{1-\alpha}} = 1-\alpha \quad \Rightarrow \quad \alpha = 0.40$$

- Data: long-run ratio of (annual) gross investment to capital stock  $\approx 0.07$**

$$\frac{k - (1-\delta)k}{k} = \frac{\delta k}{k} = 0.07 \quad \Rightarrow \quad \delta = 0.07 \text{ (annual) or } 0.018 \text{ (quarterly)}$$

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- Data: long-run ratio of (annual) output to capital stock  $\approx 0.4$** 
  - Steady-state Euler equation

$$1 = \beta \left[ \frac{\alpha k^\alpha n^{1-\alpha}}{k} + 1 - \delta \right] = \beta \left[ \frac{\alpha F(k,n)}{k} + 1 - \delta \right] \quad \Rightarrow \quad \beta = 0.95 \text{ (annual) or } 0.99 \text{ (quarterly)}$$

- OR** **Data: avg. net real return on capital  $\approx 5\%$  per year (e.g, return on S&P500)**
  - Steady-state Euler equation

$$f_k(k,n) = \frac{1}{\beta} - 1 + \delta \quad \Rightarrow \quad \beta = 0.96 \text{ (annual) or } 0.99 \text{ (quarterly)}$$

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## BASELINE RBC MODEL

- Utility parameters**

$$u(c_t, n_t) = \begin{cases} \frac{[c_t v(n_t)]^{1-\sigma} - 1}{1-\sigma} & \text{if } \sigma > 0, \sigma \neq 1 \\ \ln c_t + v(n_t) & \text{if } \sigma = 1 \end{cases}$$

- Data: IES is around unity(?) or lower**
  - Implies  $\sigma > 1$
  - (Recall: IES =  $1/\sigma$  for time-separable CRRA utility)
  - $\sigma = 1$  a conventional value

- Labor subutility**

- Common form

$$v(n) = -\frac{\psi}{1+1/\eta} n^{1+1/\eta}$$

- $\eta$  measures Frisch elasticity of labor supply (use C-L optimality condition)
- Calibrate  $\psi$  to hit  $\bar{n} \approx 0.3$
- Empirical evidence on Frisch elasticity?

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## BASELINE RBC MODEL

- ❑ Labor supply elasticity “controversial”
  - ❑ **Micro evidence:** very low –  $\eta$  (substantially) smaller than one
  - ❑ **Macro evidence:** very high –  $\eta$  (substantially) larger than one
- ❑ “Tension” between macro and micro evidence not useful way to frame the “controversy”
- ❑ Micro studies pick up **intensive** margin of labor supply
- ❑ Macro studies pick up (mostly) **extensive** margin of labor supply
  - ❑ And other frictions in allocation of workers to jobs...
- ❑ Chetty (2010): uses both macro and micro evidence to put bounds on labor supply elasticity
- ❑ Common in DSGE models:  $\eta > 1$

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## BASELINE RBC MODEL

- ❑ Exogenous process for TFP (deviations from long-run trend productivity)

$$\ln z_{t+1} = (1 - \rho_z) \ln \bar{z} + \rho_z \ln z_t + \varepsilon_{t+1}$$

$$\varepsilon_{t+1} \sim \text{iid } N(0, \sigma_z^2)$$

- ❑ **Normalize  $\bar{z} = 1$** 
  - ❑ Only governs absolute scale of model, which is arbitrary
  - ❑ What does, e.g.,  $\bar{c} = 1.56$  mean?
- ❑ **Construct time-series for  $z_t$  using**
  - ❑ Data on labor, (detrended) capital, and (detrended) output
- ❑ **AR(1) estimation**
  - ❑ Quarterly frequency

$$\Rightarrow \rho_z = 0.95 \quad \text{and} \quad \sigma_z = 0.006$$

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## USING THE RBC (OR ANY DSGE) MODEL

1. **Dream up/construct/write fully-articulated model**
  - **Ideally to answer questions motivated by data and with hypotheses**
2. **Choose parameter values**
  - **Perhaps extremely rigorously, if goal is to match certain empirical facts very precisely**
  - **Perhaps adopting generally-accepted values, if goal is to illustrate some insight**
3. **Solve for deterministic steady state (balanced growth path)**
4. **Solve for dynamic decision rules (e.g., linear approximation, second-order approximation, global approximation)**
5. **Conduct informative battery of experiments (impulse responses, simulations, etc.) to try to falsify hypotheses**
6. **Tabulate results, write a (good!) paper, get it published**