

Mittag-Leffler Distributions  
and  
Long-run Behavior of Macro-  
economic models

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# Basic Setup

- As time progresses, a stream of innovations hits a model composed of sectors or clusters.
- An innovation either hits sector  $i$  of size  $n_i$  with rate  $(n_i - \alpha)/(n + \theta)$ ,  $0 < \alpha < 1$ ,  $\theta > 0$ , or create a new sector of size 1 with rate
- $1 - \sum (n_i - \alpha)/(n + \theta) = (\theta + k\alpha)/(n + \theta)$ , where
- $n = \sum n_i$ , and  $k$  is the number of sectors existing at that time.

# Basic Facts of M-L function

- Definition:  $E_{\alpha}(x) = \sum_{n=0}^{\infty} x^n / \Gamma(1+n\alpha)$ ,  $\alpha > 0$ . (H. Pollard)
- $E_{\alpha}(-x) = \int_0^{\infty} e^{-xt} dG_{\alpha}(t)$ , with distribution function  $G_{\alpha}$ . From the moment generating function we see:
- Moment condition:
- $\int_0^{\infty} x^p g_{\alpha}(x) dx = \Gamma(p+1) / \Gamma(\alpha p + 1)$ ,  $p=1, 2, \dots$
- where
- Moment generating function
- $\int_0^{\infty} e^{xt} g_{\alpha}(t) dt = E_{\alpha}(x)$ , and
- Laplace transform:  $\int_0^{\infty} e^{-xt} g_{\alpha}(t) dt = \sum_{n=0}^{\infty} (-x)^n / \Gamma(1+n\alpha)$ .

# Remarks

- Mittag-Leffler function is a generalization of the exponential function,  $E_1(t) = e^{-t}$ .
- It is uniquely determined by the moments.
- (it satisfies Carleman's condition:  
•  $\sum_n m_n^{-1/n} = \infty$ .) (Feller vol.2, p. 224).
- Its extension:  $E_{\alpha, \beta} = \Gamma(\beta) \sum_n (-t)^n / \Gamma(\alpha n + \beta)$ .

# Some questions and answers

Question:

How are the M-L functions useful in long-run analysis of macro-models?

Answers:

They are generic ... they generically characterize long-run behavior; tail of M-L distributions are power laws.

Examples of long-run clusters of heterogeneous collections of agents: such as Pitman's chinese restaurant processes, growth patterns of sectors of economies (Markov branching processes, such as Feng-Hoppe analysis of branching model), and

Extension of the one parameter Poisson-Dirichlet (Ewens) model to two-parameter version by J. Pitman

Long-run behavior of both classes of models have M-L distributions

# Some Facts and Applications

- Mittag-Leffler distributions are uniquely determined by their moments. ... Method of moments applies:
- $g_\alpha$  has  $\Gamma(p+1)/\Gamma(\alpha p + 1)$  as its  $p$ -th moment,  $0 < \alpha < 1$
- Fractional master equations ... mean-first passage times, waiting distributions in finance, and possibly others.

# Two-parameter Extensions

- $g_{\alpha, \theta}(x) = B x^{\theta/\alpha} g_{\alpha}(x)$
- where

$$B = \Gamma(\theta + 1) / \Gamma(\theta/\alpha + 1)$$

It is known that as  $n \rightarrow \infty$

$$E(K_n/n^{\alpha}) \rightarrow \theta \Gamma(\theta) / [\alpha \Gamma(\theta + \alpha)].$$

This is the same as the mean of  $Bx^{\theta/\alpha} g_{\alpha}(x)$ .

# Two-parameter Poisson-Dirichlet distribution (extension of the Ewens distribution)

- Let  $K_n$  denote the number of clusters formed by  $n$  agents.
- Suppose
- $P(K_{n+1}=k|K_n=k)=(n-k\alpha)/(n+\theta)$
- $P(K_{n+1}=k+1|K_n=k)=(\theta+k\alpha)/(n+\theta)$
- Then
- $K_n/n^\alpha$  converges a.s. to M-L distribution



# Feng-Hoppe Model

- A simple branching process due to Karlin and McGregor:  
Let  $I(t)$  be a stream of new types of agents (resources) arriving stochastically.
- Arrival rate  $= \theta + k \alpha$ , where  $k = |I(t)|$ ,  $\theta = \beta - \alpha$
- Each new arrival (innovation) starts its own group that grow stochastically.
- Let  $N(t)$  be the total size of the economy
- Its growth rate  $= \alpha (k-1) + \beta + \sum_{j=1}^k (n_j - \alpha) = n + \theta$  where the  $i$ -th arrival (innovation) grows at rate  $n_i - \alpha$ .
- $I(t)/N(t)$  converges to a ratio of two dependent Gamma random variables, which is M-L distributed

# Analysis of Long-run Behavior: Simple Cases

- Let  $F(s)$  be the Laplace transforms of some  $f(t)$ .
- In control or system theory, the final value theorem says
- $\lim_{s \rightarrow 0} sF(s) = \lim_{t \rightarrow \infty} f(t)$ .
- Tauberian theorem of Karamata slowly varying function

# Darling-Kac Theorem

- Under a set of conditions, Mittag-Leffler distributions are the only possible limit laws. (Regular Variations, Bingham, Goldie, Teugels, CUP 1998, pp.388)

# Some Asymptotic Differences in one- and two-parameter Ewens models

- $K_n / n^\alpha$  in the two-parameter Ewens model is not self-averaging.

# Question

- Does simulations of models with non-self averaging properties yield estimate of  $\alpha$  and  $\theta$  ?
- Moments of M-L distributions given earlier can be used for that purpose?