KINETICS DRIVEN BY LOCAL NASH EQUILIBRIA AND RISK AVERSE TRADING STRATEGIES

C. Ringhofer



ringhofer@asu.edu, math.la.asu.edu/~chris

joint work with: P. Degond (Imperial College) Jian Guo Liu (Duke University) Work supported by NSF KI-NET

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INTRODUCTION - CONCEPT

Particles vs. rational agents:

Social or biological agents can behave like

- mechanical particles subject to forces: kinetic theory, minimize a global energy functional.
- rational agents trying to optimize an individual goal, given the behavior of the ensemble: game theory, try to minimize individual cost functions.

Goal:

- Try to reconcile these viewpoints.
- Show that kinetic theory can deal with rational agents.
- Incorporate time-dynamics in game theory.

Applications:

Social herding behavior: (Degond , Liu, C.R; J Nonlinear Sci. 2014)

- Economics: (Degond, Liu, C.R; J. Stat. Phys. 2014 and Phil. Trans. R. Soc, to appear)

OUTLINE

- Kinetics vs. game theory.
 - General framework.
 - Differences and similarities; mean field models; non atomic anonymous games; hydrodynamics.
- **2** Wealth distribution I:
 - Strategies \iff Wealth
 - Conservative economies (opinion formation models).
 - Standard hydrodynamics with 'high energy tails' (Pareto tails).
- Wealth distribution II:
 - Non conservative systems.
 - Mean field models and strategies.
 - Macroscopic balance laws and generalized collision invariants.
- Conclusions and outlook.

Kinetics vs. game theory



- General framework.
- Differences and similarities; mean field models; non atomic anonymous games; hydrodynamics.

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- **2** Wealth distribution I:
- Wealth distribution II:
- Conclusions and outlook.

Nash equilibria vs. energy minimization 02

Game with a finite number of players:

- N players $n = 1, \ldots, N$
- Each player can play a strategy y_n , n = 1 : N, $Y = (y_1, ..., y_N)$ in a strategy space \mathcal{Y} .
- The cost function (=-payoff) of player *n* playing strategy y_n in the presence of the other players playing strategy $\hat{Y}_n = (y_1, \dots, y_{n-1}, y_{n+1}, \dots, y_N)$ is $\phi_n(y_n, \hat{Y}_n)$
- Each player tries to minimize its cost function by acting on their strategy y_n , not touching the others' strategies \hat{Y}_n (Best response strategy).

Nash equilibrium:

Strategy $Y = (Y_1, ..., Y_N)$ such that no player can improve on its cost function by acting on its own strategy variable y_n .

$$y_n \rightarrow \psi_n(\hat{Y}_n), \ \phi_n(\psi_n, \hat{Y}_n) = \min_z \phi_n(z, \hat{Y}_n), \ n = 1:N$$

Nash equilibrium \iff Fixed point problem

$$y_n = \psi_n(\hat{Y}), \ n = 1:N$$
.

This is different from minimizing a global energy functional or $\sum_{n} \phi_{n}$ (prisoner's dilemma).

Identical players and anonymous games: $\phi_n(y_n, \hat{Y}_n) = \phi(y_n, \hat{Y}_n).$

• Players with the same strategy cannot be distinguished.

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THE CONTINUUM MODEL 06

$$\phi_n(y_n, \hat{Y}_n) = \phi(y_n, \hat{Y}_n) \Rightarrow \phi(y_n, \hat{Y}_n) \to \phi_f(y)$$

Mean field model using a mean field cost function $\phi_f(y)$, dependent on the distribution of strategies f(y) dy. Nash equilibrium:

$$\int \phi_{f_{N\!E}}(y) f_{N\!E} \, dy = \inf_f \int \phi_{f_{N\!E}}(y) f \, dy$$

General framework of Non-Cooperative, Non-Atomic, Anonymous games with a Continuum of Players (NCNAACP)

References:

- Aumann, Mas Colell, Schmeidler, Shapiro & Shapley,
- Mean-field games: Lasry & Lions, Cardaliaguet

CONTINUUM MODEL WITH MIXED STRATEGIES

The basic model:

Each (identical) player tries to march towards its Nash equilibrium (i.e. in the direction of $-\nabla_y \phi(y; f)$) at each time step. \Rightarrow kinetic equation with state dependent cost function $\phi_f(y)$ (best reply strategy, open loop control).

$$\partial_t f(y,t) - \nabla_y \cdot [f \nabla_y \phi_f(y)] = 0$$

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In a game with mixed strategies the choice of y is not certain but the player picks y with some randomness. This is generally modeled by a Brownian motion term of the form

$$dy_n = -\nabla_{y_n} \phi(y_n, \hat{Y}_n) dt + \sqrt{2D}B_t$$

which results in the kinetic equation

$$\frac{\partial_{t}f(y,t) - \nabla_{y} \cdot [f\nabla_{y}\phi f(y)] = D\Delta_{y}f}{\partial_{t}f(y,t) - \nabla_{y} \cdot [f\nabla_{y}\phi f(y)]} = D\Delta_{y}f$$

STEADY STATE FOR NE DRIVEN KINETICS

Show that the equilibrium of the kinetic equation is indeed a NE. The equilibrium is given by

$$\boldsymbol{Q}(f) = \nabla_{\boldsymbol{y}} \cdot [f \nabla_{\boldsymbol{y}} \phi(\boldsymbol{y}; f) + D \nabla_{\boldsymbol{y}} f] = 0$$

- The solution of Q(f) = 0 can be reformulated as a fixed point problem.
- For a given ϕ , Q(f) is linear in f.
- So, we write $Q(f) = \mathfrak{C}(f, \phi)$ with \mathfrak{C} bilinear in f and ϕ .

For a given ϕ , the solution of $C(f, \phi) = 0$ is given by

$$f(\mathbf{y}) = \frac{\rho}{Z_{\phi}} e^{-\phi/D}, \ \mathbf{Z}_{\phi} = \int e^{-\phi(\mathbf{y})/D} \ d\mathbf{y}$$

for an arbitrary parameter (the number of agents) $\rho = \int f(y) dy$.

• The solution of $Q(f) = \mathfrak{C}(f, \phi_f) = 0$ is given by $f(y) = \rho g(y), \forall \rho$ with g the Gibbs measure

FIXED POINT PROBLEM FOR THE GIBBS MEASURE

The fixed point problem is of the form

$$g(y) = \frac{1}{Z_{\phi_g}} e^{-\phi_g/D}, \ Z_{\phi_g} = \int e^{-\phi_g(y)/D} \ dy$$

with the normalized Gibbs measure g satisfying $\int g(y) dy = 1, \forall x$.

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NASH EQUILIBRIUM 11

Nash equilibrium:

$$\int \mu_{f_{NE}}(y) f_{NE}(y) \, dy = \inf_{f} \int \mu_{f_{NE}}(y) f(y) \, dy$$

Theorem (Degond, Liu, CR, 2013)

The Gibbs measure g given by the fixed point problem

$$g(y) = rac{1}{Z_{\phi_g}} e^{-\phi_g/D}, \ Z_{\phi_g} = \int e^{-\phi_g(y)/D} \ dy \ ,$$

is a Nash equilibrium for the modified cost function

 $\mu_f(y) = \phi_f(y) + D\ln f(y)$

CONSEQUENCE

The equation

$$\partial_t f = \nabla_y \cdot \left[f \nabla_y \phi_f + D \nabla_y f \right]$$

models the interaction of an ensemble of agents (under an IID assumption), each marching towards a Nash equilibrium in infinitesimal time steps.

• Different from mean field game theory, where players optimize strategy over a finite time horizon.

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MOMENT DEPENDENT COST FUNCTIONS

The special case when ϕ_f depends on f only through the first K normalized moments

$$\phi_f = \phi_{\rho_f, \vec{\Upsilon}_f}$$

$$\rho_f = \int f \, dy, \ \vec{\Upsilon}_f = (\Upsilon_1(f), ..., \Upsilon_K(f)), \ \Upsilon_k(f) = \frac{\int y^k f \, dy}{\int f \, dy}$$

- Yields a nonlinear operator $Q(f) = \mathfrak{C}(f, \phi_{\rho_f, \vec{\mathbf{1}}_f})$, whose nonlinearity is given only via the moments $\rho_f, \vec{\mathbf{1}}_f$.
- In this case, the infinite dimensional fixed point problem, defining the Gibbs measure, reduces to a finite dimensional fixed point problem for the vector *T*.

• In this case, the infinite dimensional fixed point problem, defining the Gibbs measure, reduces to a **finite dimensional** fixed point problem for the vector $\vec{\Upsilon}$.

$$g(\mathbf{y}) = \frac{1}{Z_{\phi_{1},\vec{\mathbf{Y}}}} e^{-\phi_{1,\vec{\mathbf{Y}}}/D}, \ Z_{\phi_{1,\vec{\mathbf{Y}}}} = \int e^{-\phi_{1,\vec{\mathbf{Y}}}(\mathbf{y})/D} \ d\mathbf{y} \ ,$$

$$\vec{\Upsilon} = \frac{1}{Z_{\phi_{1,\vec{\Upsilon}}}} \int \begin{pmatrix} y \\ \cdot \\ . \\ y^{K} \end{pmatrix} e^{-\phi_{1,\vec{\Upsilon}}/D} \, dy, \, Z_{\phi_{1,\vec{\Upsilon}}} = \int e^{-\phi_{1,\vec{\Upsilon}}(y)/D} \, dy \,,$$

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Games with configuration variables 15

- Add configuration (aka "type") variable $X = (x_1, ..., x_N)$ (e.g. space)
- *x* can be real space, the propensity to trade etc.
- Motion depends on both type X and strategy Y

$$\dot{x}_n = V(x_n, y_n), \qquad n = 1: N$$

• Cost function depends also on types X

$$dy_n(t) = -\nabla_{y_n} \phi(y_n, \hat{Y}_N, \mathbf{X}) dt + \sqrt{2d} dB_t, \qquad n = 1 : N$$

Probability distribution depends on type *x* and strategy *y*: f = f(x, y, t). Satisfies space-dependent kinetic equation.:

$$\partial_t f + \nabla_x \cdot (V(x, y)f) - \nabla_y \cdot (\nabla_y \phi_f f) - D\Delta_y f = 0$$

with $\phi_f = \phi_{f(t)}(x, y)$

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SCALE SEPARATION AND HYDRODYNAMIC CLOSURES 16

- Kinetic theory provides large time macroscopic limits for different time scales.
- Assume that the evolution of the strategy *y* is much faster than that of type *x*.
- Fast equilibration of strategy leads to slow evolution of type

 $\left|\partial_t f + \nabla_x \cdot [V(x, y)f] = \frac{1}{\varepsilon}Q(f) = \frac{1}{\varepsilon}\nabla_y [f\nabla_y \phi_f(x, y, t) + D\nabla_y f]\right|$

 ε : ratio of evolution time scales.

In zero'th order the solution will live on the manifold given by Q(f) = 0, parameterized by a finite set of x- dependent parameters.

THE GIBBS MEASURE AND THE SOLUTION OF Q(F) = 0

Standard Approach:

• Assume the solution of the fixed point problem

$$g(y) = \frac{1}{Z_{\phi_g}} e^{-\phi_g/D}, \ Z_{\phi_g} = \int e^{-\phi_g(y)/D} \ dy \ ,$$

depends on *K* local parameters $S = (s_1, ..., s_K)$. Therefore g = g(x, y; S)

• Assume that, in addition to y = 1, there are *K* collision invariants $C = (c_1, ..., c_K)$ of *Q* such that

$$\int \begin{pmatrix} 1 \\ c_1(y) \\ .. \\ c_K(y) \end{pmatrix} Q(f) \, dy = 0, \, \forall f$$

holds.

• Parameterize the solution of Q(f) = 0 by its moments *C* and close the moment equations.

This gives K + 1 conservation laws of the form

$$\partial_t \left[\rho \int \begin{pmatrix} 1 \\ C(y) \end{pmatrix} g(x, y; S) \, dy \right] + \nabla_x \cdot \left[\int V(x, y) \rho \begin{pmatrix} 1 \\ C(y) \end{pmatrix} g(x, y; S) \, dy \right] = 0$$

This gives K + 1 macroscopic conservation laws for the K + 1 macrovariables $\rho(x)$, S(x).

- **Problem: What happens if there are fewer than** *K* **collision invariants?**
- The local equilibrium f_{loc}(x, y, t) = ρ(x, t)g(x, y, S(x, t)) depends on K parameters S, but there are only L conserved quantities C = (c₁(y), ..., c_L(y)) with L < K?
- Leads to the concept of Generalized Collision Invariants (GCI), (Degond & Motsch; 2009).

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RELATION TO MEAN FIELD GAMES (Lasry & Lions) 22

- Mean-field game approach directly provides continuum equations without Kinetic Eq. step.
- Relies on an optimal control approach within a finite horizon time [0, *T*] using the Hamilton Jacobi Bellman system.

$$\partial_t \rho + \nabla_x \cdot (V\rho - mDu) = D\Delta\rho, \ , \rho(x,0) = \rho_I(x)$$
$$\partial_t u = \frac{1}{2} |\nabla u|^2 - D\Delta u + \nabla_x \phi(x,\rho), \ u(x,T) = 0$$

- *u* is a control corresponding to agents' mean strategy at *x*. (Plays the role of the parameter *S* in the kinetic theory.)
- Optimizes not only the local cost in time, but the cost along a particle path *x*(*t*), *t* ∈ [0, *T*].
- Infinite dimensional two point boundary value problem for $t \in [0, T]$.

In special cases the hydrodynamic system, arising from the kinetic model is equivalent to the limit $T \rightarrow 0$ in the Lasry - Lions model,

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SUMMARY PART I:

- Kinetic equation can be interpreted as incremental march towards Nash equilibrium.
- Kinetic equilibria are Nash equilibria if the correct mean field cost function is used.
- Relation to mean field games via infinitesimal time horizon (open loop vs. closed loop control)

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OUTLINE:Wealth distribution I

- Minetics vs. game theory.
- Wealth distribution I:
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- Wealth distribution II:
- Onclusions and outlook.

A MODEL OF CONSERVATIVE ECONOMIES 24

Bouchaud & Mézard ; Cordier, Pareschi & Toscani ; Düring & Toscani

$$\partial_t f(x, y, t) + \nabla_x \cdot [fV(x, y)] = \frac{1}{\varepsilon} \mathfrak{C}(f, \phi_{\rho_f, \Upsilon_f})$$

$$\mathfrak{C}[f,\phi] = \partial_{y}[f\partial_{y}\phi + \omega\partial_{y}(y^{2}f)]$$

The cost function ϕ depends on f only through its moments!

$$\rho_f(x) = \int f(x, y) \, dy, \ \Upsilon_f(x) = \frac{\int f(x, y) \, dy}{\rho_f(x)}$$

- Note: y > 0. Diffusion operator $\partial_y^2(y^2 f)$ associated to geometric Brownian motion.
- In the work of Cordier, Pareschi & Toscani ; Düring & Toscani etc., *y* is the individual wealth of an agent (identified with a strategy in a game theoretical framework).

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The potential $\phi_{\rho,\Upsilon}$ is taken to be a quadratic. ϕ is of the form

$$\phi_{\rho,\Upsilon}(x,y) = \frac{\kappa}{2} \frac{\int (y-y')^2 f(x,y') \, dy'}{\int f(x,y') \, dy'} = \frac{\kappa}{2} (y-\Upsilon_f)^2 + const(x)$$

- Υ_f denotes the local mean wealth.
- Quadratic pairwise interaction potential φ_Υ; models binary trading with the strategy to equalize the wealth.
- ϕ depends on f only through its moments.

Solving the fixed point problem gives

$$\partial_{y}[\kappa(y-\Upsilon_{g})]g+\omega\partial_{y}(y^{2}g)]=0, \ \int g \, dy=1 \Rightarrow g=const \cdot e^{-\frac{\kappa}{2\omega}(y-\Upsilon)^{2}}$$

$$\Upsilon = \frac{1}{Z_{\phi_{\Upsilon}}} \int y e^{-\frac{\kappa}{2\omega}(y-\Upsilon)^2} \, dy, \ Z_{\phi_{\vec{\Upsilon}}}(x) = \int e^{-\frac{\kappa}{2\omega}(y-\Upsilon)^2} \, dy \,,$$

which is a trivial identity.

So, the solution of of $C(f, \phi_f) = 0$ depends on the two macroscopic parameters ρ, Υ (the density of agents and their mean wealth $\Rightarrow K = 1$).

CONSERVATION LAWS

Using geometric Brownian motion, the trading operator *C* also conserves the mean wealth, i.e.

$$\int inom{1}{y} \partial_y [f\kappa(y-\Upsilon)+\omega\partial_y(y^2f)] \ dy=0, \ orall
ho,\Upsilon$$

This gives a standard hydrodynamic limit for the macroscopic variables of the form

$$\partial_t \begin{pmatrix} \rho \\ \rho \Upsilon \end{pmatrix} + \int \begin{pmatrix} 1 \\ y \end{pmatrix} \nabla_x \cdot \left[Vf_{loc}(x, y) \right] dy = 0$$

with the local equilibrium density f_{loc} given by an inverse Γ -distribution:

$$f_{loc} = \rho g_{\Upsilon}, \ g_{\Upsilon} = \frac{1}{Z_{\Upsilon}} y^{-\frac{\kappa}{2}-2} e^{-\frac{\kappa\Upsilon}{\omega y}}$$

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• This can be interpreted as a march of agents towards local Nash equilibria for game associated to cost

$$\mu_{\rho,\Upsilon}(\mathbf{y}) = (\kappa + 2\omega) \ln \mathbf{y} + \kappa \frac{\bar{\Upsilon}}{\mathbf{y}} + \omega \ln \rho$$

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(Degond, Liu, Cr, 2012)

- The local equilibrium $g_{\Upsilon} = \frac{1}{Z_{\Upsilon}} y^{-\frac{\kappa}{2}-2} e^{-\frac{\kappa\Upsilon}{\omega y}}$ is an inverse Γ -distribution, and has "fat Pareto tails" as $y \to \infty$ (Düring & Toscani, 2007).
- f(x, y) decays only rationally as $y \to \infty$.

OUTLINE:Wealth distribution II

- Minetics vs. game theory.
- Wealth distribution I:
- Wealth distribution II:
 - Non conservative systems.
 - Mean field models and strategies.
 - Macroscopic balance laws and generalized collision invariants.

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Onclusions and outlook.

NON CONSERVATIVE ECONOMIES 30

Basic concept:

- Agents do not trade with each other individually, but rather with a local market, optimizing the individual wealth w.r.t. the moments of the local wealth in the market.
- Their trading frequency as well as their goals depend on the local value and and risk (uncertainty) of the market (i.e. higher order moments of *f*).

• \Rightarrow The total wealth during trading is not conserved. The cost function for the individual agent is then given by

$$\phi_n = \phi(x_n, y_n, \vec{\Upsilon}), \ \vec{\Upsilon} = (\Upsilon_1, ..., \Upsilon_K), \ \Upsilon_k = \frac{1}{\rho(x_n)} \sum_n y_n^k$$

and in the continuum model

$$\phi_f(x,y) = \phi_{\vec{\Upsilon}_f(x)}(y), \ \vec{\Upsilon}_f(x) = \frac{1}{\rho_f(x)} \int \begin{pmatrix} y \\ \vdots \\ y^{\underline{K}} \end{pmatrix} f(x,y) \ dy$$

HARMONIC POTENTIALS

• As in the previous case, we use a harmonic potential $\phi_{\vec{\Upsilon}}$ of the form

$$\phi_{\vec{\Upsilon}}(y) = \frac{a_{\vec{\Upsilon}}}{2}(y - \boldsymbol{b}_{\vec{\Upsilon}})^2$$

- $a_{\vec{T}}$ is the agent's propensity to trade and $b_{\vec{T}}$ is its goal.
- $a_{\vec{\gamma}}$ and $b_{\vec{\gamma}}$ depend now on higher order moments of f!
- We consider the case K = 2, $\vec{\Upsilon} = \begin{pmatrix} \Upsilon_1 \\ \Upsilon_2 \end{pmatrix}$. (dependence on value and risk of the local market).

RISK AVERSE STRATEGIES 32

The agent uses the mean Υ₁ and the variance Υ₂ - Υ₁² of the market worth, i.e. the risk, as its basis for making decisions. So K = 2, Υ̃ = (Υ₁, Υ₂).

• We set
$$a_{\vec{\Upsilon}} = \frac{\Upsilon_2}{\Upsilon_2 - \Upsilon_1^2}$$
.

• $\frac{1}{a_{\vec{T}}} = \frac{\Upsilon_2 - \Upsilon_1^2}{\Upsilon_2}$ is the variation coefficient (dimensionless measure of the uncertainty in the market). Agent behavior is risk averse!

Goals:

- Freedom in choosing $b_{\vec{\Upsilon}}$.
- One choice: $b_{\vec{\Upsilon}} = (1 + \lambda)\Upsilon_1$, i.e. the agent tries to beat the market by a factor $1 + \lambda$.

GIBBS MEASURE AND FIXED POINT PROBLEM

The resulting fixed point problem for the Gibbs measure is

$$\vec{\Upsilon} = \int \begin{pmatrix} y \\ y^2 \end{pmatrix} g(y) \, dy, \ g(y) = y^{-2} \exp(-\frac{a_{\vec{\Upsilon}} y + b_{\vec{\Upsilon}}}{y^2})$$

The fixed point problem has a one parameter family of solutions, given by

$$\Upsilon_2 = (1 + rac{1}{\lambda})\Upsilon_1^2, \ \forall \Upsilon_1$$

and the corresponding local equilibrium is given by

$$f_{equ}(x,y) = \frac{\rho}{Z_{\Upsilon_1}} \frac{1}{y^{\lambda+3}} \exp\left(-\frac{(1+\lambda)\Upsilon_1}{y}\right)$$

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i.e. again by an inverse $\Gamma-$ distribution, giving the 'fat Pareto tails'.

MACROSCOPIC BALANCE LAWS

• The difference to the binary interaction model is that the operator $C(f, \phi_{\vec{\Upsilon}}) = \partial_y [f \partial_y \phi_{\vec{\Upsilon}} + \omega \partial_y (y^2 f)]$ does not conserve y.

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So we have two parameters ρ(x, t), Υ₁(x, t) in the local equilibrium, but only one conservation law.

GENERALIZED COLLISION INVARIANTS (GCI'S)36

- Idea: (Degond, Motsch; 2009) Find $C_f(y)$ such that $\int C_f(y)Q(f) dy = 0$ holds on a manifold containing the local equilibrium $f_{loc}(x, y, t)$!
- Q does not conserve f for all solutions, but the moment vanishes in the local equilibrium.
- Gives a (non- conservative) large time equation in the hydrodynamic limit of the form

$$\int C_{f_{loc}} \partial_t f_{loc} \, dy + \int C_{f_{loc}} \nabla_x \cdot \left[V(x, y) f_{loc} \right] \, dy = 0$$

• This equation evolves on the macroscopic time scale, but is not conservative, since $C_{f_{loc}}$ depends on the spatial variable x and time.

In the case
$$\phi_{\vec{\Upsilon}} = \frac{a_{\vec{\Upsilon}}}{2} (y - b_{\vec{\Upsilon}})^2$$
 with $a_{\vec{\Upsilon}} = \frac{\Upsilon_2}{\Upsilon_2 - \Upsilon_1^2}$ and $b_{\vec{\Upsilon}} = (1 + \lambda)\Upsilon_1$, the GCI is given by

$$C_{f_{loc}} = C_{\Upsilon_1}(x, y, t) = y(\frac{y}{2} - \Upsilon_1(x, t))$$

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HYDRODYNAMIC EVOLUTION EQUATIONS FOR THE NON-CONSERVATIVE ECONOMY

The macroscopic system for the local agent density ρ and mean wealth Υ_1 is of the form

$$\partial_t \rho + \nabla_x \big(\rho \boldsymbol{u}_0 \big) = 0$$

$$\rho \partial_t \Upsilon_1 + \frac{\lambda}{2\Upsilon_1} \nabla_x \cdot (\rho \boldsymbol{u}_2) - \lambda \nabla_x \cdot (\rho \boldsymbol{u}_1) - \frac{1-\lambda}{2} \Upsilon_1 \nabla_x \cdot (\rho \boldsymbol{u}_0) = 0$$

うして 山田 マイボット ボット シックション

with

- $u_k = u_k(x; \Upsilon_1) = \int V(x, y) y^k g_{\Upsilon_1}(y) \, dy, \ k = 0:2$
- g_{Υ1}(x,t)(y) the Gibbs measure given by the inverse Γdistribution.

• The local Nash equilibrium is given by $\int y^2 g_{\Upsilon_1} \, dy = (1 + \frac{1}{\lambda}) \Upsilon_1^2$

Summary 40

- Interplay between Kinetic Theory and Game Theory
 - Best-reply strategy
 - Nash equilibria are Kinetic equilibria of associated dynamics
- Used this analogy to derive:
 - large-scale evolution of system of agents subject to fast relaxation towards Nash equilibrium
 - Hydrodynamic models of games
- Application to wealth distribution
 - Equilibria are inverse gamma distributions
 - Parameters evolve through system of macroscopic equations
 - Applied to non-conservative economy through GCI concept

Perspectives:

- Development in other contexts of social dynamics
- Comparisons with data in real-world applications
- Rigorous proofs