

Academic wages, Singularities, Phase Transitions and Pyramid Schemes

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Institute for Mathematics and Its Applications

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Background, challenge, universality

- despite some celebrated successes, economic theory presents a largely untapped source of interesting mathematical problems
- e.g. in a heterogeneous population of N collaborator/competitors, is

$$\lim_{N \rightarrow \infty} \frac{\textit{top wage}}{\textit{average wage}} < +\infty?$$

i.e.

$$\lim_{\textit{firm size} \rightarrow \infty} \frac{\textit{CEO salary}}{\textit{average salary}} = +\infty?$$

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$$\lim_{\text{firm size} \rightarrow \infty} \frac{\text{CEO salary}}{\text{average salary}} = +\infty?$$

i.e. does $(\text{total economy}) \in L^1$ imply $(\text{individual payoffs}) \in L^\infty$?

- some flavor of questions in statistical physics;
- do parallels exist that can be developed?

Matching in the education and labor markets

EDUCATION MARKET

- different students willing to pay teachers to enhance their skills
- different teachers seek students to pay their salaries

LABOR MARKET

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- adults choose a profession (worker, manager, teacher) based on earnings potential given their skills (innate or acquired)
- workers seek managers to produce output (commensurate with skills)
- managers seek workers...
- fruits of output divided competitively (according to what each will bear)
- teachers seek students to educate (depending on the skills of each...)

Interrelation between these markets has unexpected potential for feedback!

Steady-state competitive equilibrium

PROFIT MOTIVE: individuals driven to maximize share of wealth (generated by labor production b_L plus any external value b_E of education)

LARGE MARKET HYPOTHESIS: no individual or small group has market power (i.e. can affect outcomes for a positive fraction of population)

EQUILIBRIA are STABLE: no individual or small group should prefer to abandon their partners in favor of collaboration with each other

STEADY-STATE: educational matching should reproduce the same endogenous distribution of adult skills α at each generation, given an exogenously specified distribution κ of student skills at each generation

A mathematical model

Student skills: $k \in K = [0, \bar{k}[$ distributed according to $d\kappa \geq 0$ on $\bar{K} \subset \mathbf{R}$

Adult skill level $a \in \bar{A}$ has value $cb_E(a)$ outside the labor market, where $0 < b_E \in C^1(\bar{A})$ is *strongly* convex increasing, $c \geq 0$, and w.l.o.g. $A = K$

EDUCATION MARKET: parameterized by $0 < \theta < 1 \leq N$ and $b_E(\cdot)$

- a teacher can teach N students, each inheriting a fraction θ of their skill

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EDUCATION MARKET: parameterized by $0 < \theta < 1 \leq N$ and $b_E(\cdot)$

- a teacher can teach N students, each inheriting a fraction θ of their skill i.e., if $k \in K$ studies with $a \in A$ they acquire skill $z^\theta(k, a) = (1 - \theta)k + \theta a$.

LABOR MARKET: parameterized by $0 < \theta' < 1 \leq N'$ and $b_L(\cdot)$ like $b_E(\cdot)$

- worker $a \in A$ and manager $a' \in A$ produce output $b_L((1 - \theta')a + \theta' a')$
- each manager can manage up to N' workers

Payoffs and matchings

Recall: a map $z : \mathbf{R}^m \rightarrow \mathbf{R}^n$ pushes a measure $\mu \geq 0$ on \mathbf{R}^m forward to a measure $z_{\#}\mu$ on \mathbf{R}^n assigning mass $\mu[z^{-1}(V)]$ to each $V \subset \mathbf{R}^n$ (all Borel)

Seek real functions u, v on $K = A$ and measures $\epsilon, \lambda \geq 0$ on $\bar{K} \times \bar{A}$ where

$u(k)$ = lifetime net income of student of skill k (minus tuition invested)

$v(a)$ = salary (i.e. wage) of an adult of skill a

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$u(k)$ = lifetime net income of student of skill k (minus tuition invested)

$v(a)$ = salary (i.e. wage) of an adult of skill a

$d\epsilon(k, a)$ = fraction of skill k students who study with skill a teachers

$d\lambda(a, a')$ = number of skill a workers who match with skill a' managers

whose marginals $\epsilon^i = \pi_{\#}^i \epsilon$ under $\pi^1(k, a) = k$ and $\pi^2(k, a) = a$

and push-forward $z_{\#}^{\theta} \epsilon$ through $z^{\theta}(k, a) := (1 - \theta)k + \theta a$ satisfy...

MNEMONIC TABLE

Generation	Skill range	Skill distribution	Distribution type
Kids Adults	$K = [0, \bar{k}[$ $A = K$	$d\kappa(k) \geq 0$ $d\alpha(a) \geq 0$	exogenous endogenous: $\alpha = z_{\#}^{\theta} \epsilon$

$$z^{\theta}(k, a) := (1 - \theta)k + \theta a$$

Sector	Exogenous parameters	Endogenous matching	Direct (exogenous) payoff	Indirect (endogenous) payoff
Education Labor	(N, θ) (N', θ')	$d\epsilon(k, a) \geq 0$ $d\lambda(a, a') \geq 0$	$cb_E(z)$ $b_L(z)$	$u(k)$ $v(a)$

MOTIVATING EXAMPLE: $N = N'$, $\theta = \frac{1}{2} = \theta'$ and $b_L(a) = e^a = b_E(a)$,
 $c \geq 0$, with $c = 0$ being a case of primary interest

Competitive equilibrium

STEADY-STATE

$$\epsilon^1 = \kappa \quad \text{and} \quad (1a)$$

$$\lambda^1 + \frac{1}{N'}\lambda^2 + \frac{1}{N}\epsilon^2 = z_{\#}^{\theta}\epsilon, \quad (1b)$$

i.e. worker + manager + teacher skills = output of educational match

STABLE

$$u(k) + \frac{1}{N}v(a) \geq cb_E(z^{\theta}(k, a)) + v(z^{\theta}(k, a)) \quad \text{and} \quad (2a)$$

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$$u(k) + \frac{1}{N}v(a) \geq cb_E(z^{\theta}(k, a)) + v(z^{\theta}(k, a)) \quad \text{and} \quad (2a)$$

$$v(a) + \frac{1}{N'}v(a') \geq b_L((1 - \theta')a + \theta'a') \quad \text{on } \bar{K} \times \bar{A}, \quad (2b)$$

BUDGET FEASIBLE

$$\text{equality holds } \epsilon\text{-a.e. in (2a) and } \lambda\text{-a.e. in (2b)} \quad (3)$$

A variational approach...

But how can we find and analyze such equilibria?

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Assume a marriage of man k to woman a generates surplus $s(k, a)$, to be divided between them as they see fit. Given probability measures $d\kappa(k)$ and $d\alpha(a)$ representing the frequency of different types of men and women in a given population, can we pair each man to a woman STABLY, meaning that, when the pairing is done, no man and woman would both prefer to leave their assigned partners and marry each other?

e.g. M men and M women:

$$\kappa = \frac{1}{M} \sum_{i=1}^M \delta_{k_i} \text{ and } \alpha = \frac{1}{M} \sum_{j=1}^M \delta_{a_j}, \text{ payoff matrix } (s_{ij}) = s(k_i, a_j)$$

Shapley and Shubik's (1972) solution:

The solutions are precisely those pairings $d \in \mathcal{E}(a, k)$ of men to women which attain the maximum

$$\max_{\{\epsilon \geq 0 \mid \epsilon^1 = \kappa, \epsilon^2 = \alpha\}} \int_{\bar{K} \times \bar{A}} s(k, a) d\epsilon(k, a).$$

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The solution $(u, v) \in C(\bar{A})^2$ to its DUAL PROGRAM,

$$\inf_{u(k) + v(a) \geq s(k, a)} \int_{\bar{K}} u(k) d\kappa(k) + \int_{\bar{A}} v(a) d\alpha(a)$$

shows how the surplus $s(k, a)$ will be split between the husband and wife in each couple at equilibrium, *provided the infimum is attained*; it satisfies $u(k) + v(a) \geq s(k, a)$ on $\bar{K} \times \bar{A}$, with equality ϵ -a.e.

The analogous linear programs for our steady-state match

PLANNER'S PROBLEM: a maximization over steady-state matches (ϵ, λ)

$$LP^* := \max_{\{\epsilon, \lambda \geq 0 | (1a)-(1b)\}} c \int_{\bar{K} \times \bar{A}} b_E \circ z^\theta d\epsilon + \int_{\bar{A} \times \bar{A}} b_L \circ z^{\theta'} d\lambda$$

(recall $z^\theta = (1 - \theta)k + \theta a$)

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DUAL LINEAR PROGRAM: a minimization over stable payoffs (u, v)

$$LP_* := \inf_{\{u, v \in F \mid (2a)-(2b)\}} \int_{\bar{K}} u(k) d\kappa(k)$$

$$F = \{u_0 + u_1 = u \in L^1(d\kappa) \mid u_0 \in C(\bar{K}) \text{ and } u_1 > 0 \text{ non-decreasing}\}$$

Proof of duality ($LP_* = LP^*$): \geq 'easy'; \leq standard

Rockafellar-Fenchel duality in $(C(K), \|\cdot\|_\infty)^2$ implies $LP_* \leq LP^*$.

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The reverse inequality is formally clear: integrating educational stability

$$u(k) - cb_E(z^\theta(k, a)) \geq v(z^\theta(k, a)) - \frac{1}{N}v(a) \quad (2a)$$

against $d\epsilon(k, a)$ yields

$$\int_{\bar{K}} u d\kappa - c \int_{\bar{A}} b_E d(z_{\#}^\theta \epsilon) \geq \int_{\bar{A}} v d(z_{\#}^\theta \epsilon) - \frac{1}{N} \int_{\bar{A}} v d\epsilon^2$$

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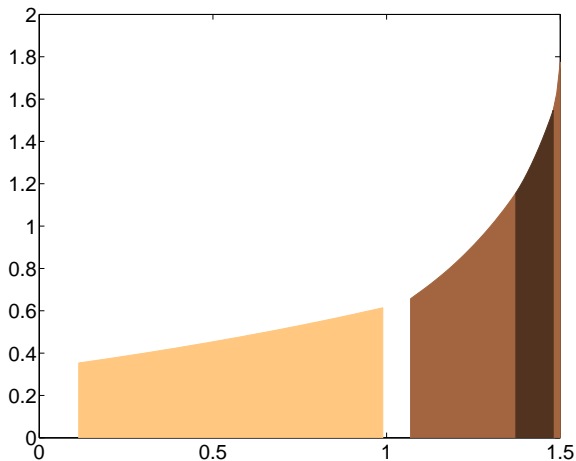
$$\begin{aligned} \int_{\bar{K}} u d\kappa - c \int_{\bar{A}} b_E d(z^\theta_\# \epsilon) &\geq \int_{\bar{A}} v d(z^\theta_\# \epsilon) - \frac{1}{N} \int_{\bar{A}} v d\epsilon^2 \\ &= \int_{\bar{A}} v d(\lambda^1 + \frac{1}{N'} \lambda^2) \\ &\geq \int_{\bar{A} \times \bar{A}} b_L((1 - \theta')a + \theta' a') d\lambda(a, a') \end{aligned}$$

for all (ϵ, λ) & $u, v \in F \subset L^1(d\kappa)$ satisfying (1)-(2)

provided the integrals converge.

Strict inequalities would violate the budget constraint.

Numerics: Equilibrium wage $v(a)$ as a function of adult skill $a \in [0, \bar{a}[$



$\kappa = \mathcal{L}^1$ uniform, $c = 0$, $b_L(a) = e^a$, and $(N, \theta) = (N', \theta') = (10, \frac{1}{2})$,
Note segregation: workers=yellow, managers=brown, and teachers=beige

Doubling condition

To guarantee this convergence, we henceforth assume a doubling condition on the student skill distribution at its upper endpoint: for some $C < \infty$ and all $D > 0$:

$$\int_{[\bar{k}-2D, \bar{k}]} d\kappa \leq C \int_{[\bar{k}-D, \bar{k}]} d\kappa. \quad (D.C.)$$

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Proposition (Variational characterization of competitive equilibria)

(D.C.) implies $LP_ = LP^*$. If LP_* is attained, then for (u, v) and (ϵ, λ) to optimize LP_* and LP^* is equivalent to forming a competitive equilibrium.*

Thus it is crucial to know the infimum is attained — if not in $C(\bar{A})^2$ — then at least in the larger class $u, v \in F$.

Moreover, we want to analyze the optimal (ϵ, λ) and (u, v) .

Theorem (Existence of equilibrium wages)

Fix $c \geq 0$ and positive constants $\bar{k} = \bar{a}$ and $\max\{\theta, \theta'\} < 1 < \min\{N, N'\}$. If $b_{E/L} \in C^1(\bar{A})$ are positive, uniformly convex and increasing and κ satisfies (D.C.) on $K = [0, \bar{k}[$, then LP_* is attained by convex non-decreasing functions $u, v \in F$, uniformly convex and increasing if either $c > 0$ or $N\theta^2 \geq 1$.

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Moreover, $v = \max\{v_w, v_m, v_t\}$ and

$$u(k) = \sup_{a \in \bar{A}} cb_E(z^\theta(k, a)) + v(z^\theta(k, a)) - \frac{1}{N}v(a)$$

where the worker / manager / teacher wages for an adult of skill $a \in K$ are

$$v_w(a) := \sup_{a' \in \bar{A}} b_L((1 - \theta')a + \theta'a') - \frac{1}{N'}v(a')$$

$$v_m(a') := N' \sup_{a \in \bar{A}} b_L(z^{\theta'}(a, a')) - v_w(a)$$

$$v_t(a) := N \sup_{k \in \bar{K}} cb_E(z^\theta(k, a)) + v(z^\theta(k, a)) - u(k).$$

Idea of proof:

- 1) the conclusion becomes true if we restrict the infimum by replacing F with the compact set $F_0 = \{v \in F \mid v \text{ convex, non-decreasing}\}$
- 2) we then need to check that these artificially imposed constraints do not bind for the minimizing pair $u, v \in F_0$ under this restriction;
- 3) this requires positive lower bounds for first two derivatives of $v_{w/m/t}$
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A few technical issues:

- 5) get $v = \max\{v_w, v_m, v_t\}$ for a.e. adult, but need it \mathcal{L}^1 -a.e. in K
- 7) need to perturb the problem to ensure $\mathcal{L}^1 \ll \kappa$ and $\mathcal{L}^1 \ll \alpha = z_{\#}^{\theta} \epsilon$
- 8) finally, let this perturbation (and $c > 0$ if desired) tend to zero, using convexity and monotonicity of (u_k, v_k) to extract a convex monotone limit
- 9) more work shows uniform convexity/monotonicity survives if $N\theta^2 \geq 1$

Let

$$\underline{b}'_{E/L} := b'_{E/L}(0)$$
$$\bar{b}'_{E/L} := b'_{E/L}(\bar{a}).$$

Lemma (Specialization by type; the educational pyramid)

In any equilibrium:

a) $N'\theta' \geq \bar{b}'_L / \underline{b}'_L \implies$ *least manager skill \geq highest worker skill*

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c) if $N\theta > 1$ education strictly improves everyone's skill and

d) in this case the academic descendents of a skill $a \in A$ teacher display at most finitely many skill types unless differentiability of v fails at a .

i.e. finitely many academic descendents, yet INFINITELY many ancestors

Corollary (Uniqueness; positive assortativity)

- a) *If (ϵ, λ) maximize the planner's problem, spt $\lambda \subset \mathbf{R}^2$ is non-decreasing; i.e. managerial skill varies directly with worker skill.*
- b) *Moreover, there exist maximizers (ϵ, λ) with spt ϵ non-decreasing also, i.e. with teacher skill varying directly with student skill.*

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- d) *If also κ is free from atoms, the equilibrium match (ϵ, λ) is unique.*

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- d) *If also κ is free from atoms, the equilibrium match (ϵ, λ) is unique.*
- e) *If also $N\theta > 1$, then $u'(k)$ and $v'(a)$ are uniquely determined for κ -a.e. student k and $\alpha = z_{\#}^{\theta}$ ϵ -a.e. adult $a \in K$*
- f) *If also κ dominates some a.c. measure whose support fills \bar{K} , then u is unique (among locally Lipschitz functions on $K = [0, \bar{k}[$).*

Theorem (Transition to unbounded wage gradients)

- If κ given by an L^∞ probability density, continuous and positive at \bar{k} , and
- i) all sufficiently skilled adults become teachers (as when $N\theta \geq \bar{b}'_L / \underline{b}'_L$)
 - ii) $\text{spt } \epsilon \subset \text{Graph}(a_t)$ for $a_t : \bar{K} \rightarrow \bar{A}$ non-decreasing (as when $N\theta^2 > 1$)
 - iii) the student-to-teacher skill map $a = a_t(k)$ is differentiable at \bar{k}
 - iv) $v(a)$ is differentiable on $]\bar{a} - \delta, \bar{a}[$ for some $\delta > 0$, then for $N\theta \neq 1$

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$$\frac{dv}{da}(\bar{a} - \Delta a) = \frac{\text{const}}{|\Delta a|^{\frac{\log N\theta}{\log N}}} + \frac{c\bar{b}'_E}{\frac{1}{N\theta} - 1} + o(1) \quad \text{as } \Delta a \downarrow 0.$$

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Corollary

- If $N\theta > 1$ then (i)&(ii) \implies a singularity must occur in u or in v near \bar{a} .
If also (iii)-(iv) hold, then $\lim_{a \rightarrow \bar{a}} v(a) < +\infty$

Idea of proof (theorem and corollary):

A student-teacher match produces equality in the stability constraint

$$u(k) + \frac{1}{N}v(a) - [cb_E + v]((1 - \theta)k + \theta a) \geq 0 \quad (2a)$$

Assuming differentiability, the first-order conditions for equality

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$$\frac{u'(k)}{1 - \theta} = [cb'_E + v']_{(1-\theta)k+\theta a} = \frac{v'(a)}{N\theta}$$

$$\implies a = a_t(k) = \frac{1}{\theta}[cb'_E + v']^{-1} \left(\frac{u'(k)}{1 - \theta} \right) + (1 - \theta^{-1})k$$

and

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A student-teacher match produces equality in the stability constraint

$$u(k) + \frac{1}{N}v(a) - [cb_E + v]((1 - \theta)k + \theta a) \geq 0 \quad (2a)$$

Assuming differentiability, the first-order conditions for equality

$$\frac{u'(k)}{1 - \theta} = [cb'_E + v']_{(1-\theta)k+\theta a} = \frac{v'(a)}{N\theta}$$

$$\implies a = a_t(k) = \frac{1}{\theta}[cb'_E + v']^{-1} \left(\frac{u'(k)}{1 - \theta} \right) + (1 - \theta^{-1})k$$

and

$$v'(a) = N\theta[cb'_E + v']_{(1-\theta)k+\theta a}$$

This last formula shows $N\theta$ acts as a multiplier relating the marginal wage $v'(z)$ of an adult with skill $z = (1 - \theta)k + \theta a$ to the marginal wage $v'(a)$ of his or her teacher. If $N\theta > 1$ and we know to first-order how a and hence z relate to k , we can compute the rate at which $v'(a)$ diverges as $a \rightarrow \bar{a}$.

QED

Returning to point (9) of our earlier proof:

uniform convexity of v_c for $N\theta^2 \geq 1$ survives $c \downarrow 0$

is derived from the analogous second-order condition for a minimum of

$$v(a) + \frac{1}{N'}v(a') - b_L((1 - \theta')a + \theta'a') \geq 0 : \quad (2b)$$

$$v_c''(a) \geq \begin{cases} (1 - \theta')^2 b_L''|_{(1-\theta')a + \theta'a'} \geq \delta & \text{if } a \text{ works} \\ N'(\theta')^2 b_L''|_{(1-\theta')a' + \theta'a} \geq \delta & \text{if } a \text{ manages} \\ N\theta^2 [cb_E'' + v_c'']_{(1-\theta)k + \theta a} \geq 0 & \text{if } a \text{ teaches.} \end{cases}$$

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Thus

$$\underline{v}_c'' := \inf_{a \in A} v_c''(a) \geq \begin{cases} \delta & \text{independent of } c > 0 \text{ or} \\ N\theta^2 (c\underline{b}_E'' + \underline{v}_c'') & \end{cases}$$

Since $\underline{v}_c'' \geq 0$, we get a $c > 0$ independent bound $\bar{v}_c'' > \delta > 0$ if $N\theta^2 \geq 1$.

QED

Conclusions and open questions:

- 1) Hidden recursion in education market can generate wage singularities with universal exponents;
- 2) but only if a teacher's impact $N\theta \geq 1$ does not decrease from one generation of students to the next.
- 3) Such singularities lead to subtle questions, some remaining open.
- 4) In this model, they occur at the level of gradients rather than wages.
- 5) Do singularities persist with discounting? (ie. interest on student loans)
- 6) What about models with a countable number of management layers?
- 7) Does competition allow a tiny fraction of the population to extract a positive fraction of the total wealth?
- 8) Can one analyze the limiting behaviour of finite population models?
- 9) Parallels to statistical physics?
- 10) Economic theory remains largely ripe for mathematization...



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Thank you