

Lecture 1 : fair division of indivisible units

Division according to claims

- $N = \{i\}$ agents
- $\mathbb{N} = \{0, 1, 2, \dots\}$; $t \in \mathbb{N}$: resources; $x_i \in \mathbb{N}$: agent i 's claim
- $t \leq \sum_N x_i = x_N$: rationing, urn emptying, scheduling
- $t < \sum_N x_i$: surplus sharing, urn filling

- (N, t, x) : rationing problem
- $Y = (Y_i)_{i \in N}$: random variable *s.t.* $Y_i(\varpi) \in \mathbb{R}$,
 $0 \leq Y_i \leq x_i$, $\sum_N Y_i = t$
- $(N, t, x) \rightarrow r(N, t, x) = Y$: rationing method

- duality: $r \rightarrow r^* : r^*(t, x) = x - r(x_N - t, x)$
- distribution of the first unit: $\rho_i(x) = \text{proba}\{r(1, x) = e^i\},$
- of the first unit of tax: $\tau_i(x) = \text{proba}\{r(x_N - 1, x) = x - e^i\}$

Examples of rationing methods

- priority $\text{prio}^\sigma : \sigma = \text{fixed ordering of } N, (\pi^\sigma)^* = \pi^{\sigma^*}$
- random priority $rp : rp(t, x) = \text{prio}^\sigma(t, x)$ where σ is uniformly distributed over all orderings of N , $rp^* = rp$
- proportional $pro : \rho_i(x) = \tau_i(x) = \frac{x_i}{x_N}, \text{ iterate; } pro^* = pro$

- $m(x) = \{i \in N \mid x_i > 0\}, M(x) = \{i \in N \mid x_i = \max_j x_j\};$
- fair queuing $fq : \rho(x)$ uniform on $m(x); \tau(x)$ uniform on $M(x);$ iterate on τ
- fair queuing* $fq^* : \rho(x)$ uniform on $M(x), \tau(x)$ uniform on $m(x);$ iterate on ρ
- equal chances $ec : \rho(x)$ uniform on $m(x),$ iterate
- equal chances* $ec^* : \tau(x)$ uniform on $m(x),$ iterate

mild properties:

- Demand Monotonicity $DM : x' = x + e^i \implies r_i(t, x')$ stochastically dominates $r_i(t, x)$
- Demand Monotonicity* $DM^* : x' = x + e^i \implies x'_i - r_i(t, x')$ stochastically dominates $x_i - r_i(t, x)$

basic equity property

- Equal Treatment ExAnte $ETEA: x_i = x_j \implies r_i(t, x)$ and $r_j(t, x)$ identically distributed

All methods above meet DM, DM^*

All except priority meet ETE

It is always interesting to drop the ETE property

axioms with much bite

Two dual markovian properties: $UC^* = LC$

- Upper Composition UC : $t < t' \leq x_N \implies r(t, x) = r(t, r(t', x))$; equivalently: $r(t, x)$ obtains by iteration of $\tau(x)$
- Lower Composition LC : $0 \leq t' < t \leq x_N \implies r(t, x) = r(t', x) + r(t - t', x - r(t', x))$; equivalently: $r(t, x)$ obtains by iteration of $\rho(x)$

examples

- priority, proportional: LC and UC
- fair queuing, equal chances*: UC , not LC
- fair queuing*, equal chances: LC , not UC
- random priority: neither LC nor UC

A variable population property

- Consistency CSY : fix (N, t, x) and write $Y_k = r_k(N, t, x)$; then $Y_i = r_i(N \setminus j, t - Y_j, x_{-j})$

Note: $CSY = CSY^*$

Examples

- priority, proportional, fair queuing, fair queuing*:
YES
- random priority, equal chances, equal chances*:
NO

An incentive-compatibility property

- Strategyproofness SP : fix i, x_{-i} and x_i, x'_i ;
then $r_i(t, (x_i, x_{-i}))$ stochastically dominates
 $proj_{[0, x_i]} r_i(t, (x'_i, x_{-i}))$

Note: $SP \implies DM$ (take $x'_i \leq x_i$)

Examples

- priority, random priority, fair queuing, equal chances: YES
- proportional, fair queuing*, equal chances*: NO

Characterization results

- $UC + LC + ETE \iff UC + \text{self dual} \iff \text{proportional}$
- the $UC + LC$ family consists of interesting variants of the proportional method
- $UC + LC + CSY \iff \text{priority composition of proportional methods (US bankruptcy law)}$

Equal Treatment Ex Post $ETEP : x_i = x_j \implies |Y_i(w) - Y_j(w)| \leq 1$

- $UC + DM^* + ETEA + ETEP \iff \text{fair queuing}$
- $LC + DM + ETEA + ETEP \iff \text{fair queuing}^*$

- Standard of loss: an ordering $\succsim$ (complete, transitive) of $N \times \mathbb{N}$ such that $x'_i \geq x_i \implies (i, x'_i) \succsim (i, x_i)$
- Standard of loss method: an UC method such that $(i, x_i) \succ (j, x_j) \implies \tau_j(x) = 0$

If the standard is a strict ordering, this defines a *deterministic* method

- $UC + CSY + DM^* + \text{deterministic} \iff \text{standard of loss}$
- $UC + CSY + DM^* \iff \text{probabilistic standard of loss}$
- example: $UC + CSY + DM^* + ETEA \iff \text{"mixtures" of fair queuing and proportional}$

- the dual notion of standards of gain allows a dual description of the family $LC + CSY + DM$

- $LC + SP \iff$ fixed chances; in particular $LC + SP + ETEA \iff$ equal chances
- $UC + SP + ETEA \iff$ fair queuing
- $UC + SP \iff$ "quasi deterministic" standard of loss methods
- $CSY + SP \iff ??$
- $SP + \text{self-dual} \iff$ random priority (*conjecture*)

Lecture 2 :Cost and benefit sharing

- agents N , agent i demands $x_i = 0, 1, 2, \dots$
- cost function $C : N^N \longrightarrow R_+$, non decreasing, $C(0) = 0$
- cost sharing method: $\varphi : (N, C, x) \longrightarrow y = \varphi(N, C, x) \in \mathbb{R}_+^N, \sum_i y_i = C(x)$
- special case $x = (1, \dots, 1)$ is classical cooperative game framework.

- Additivity axiom: $\varphi(C^1 + C^2, x) = \varphi(C^1, x) + \varphi(C^2, x)$
- shared flow on $[0, x]$: $f(z - e^i, z)$ a unit flow on $[0, x]$ from 0 to x ; $s_j(z - e^i, z)$ is agent i 's share, $s_i \geq 0, \sum_i s_i = 1$
- associate to (f, s) an additive method : $\varphi(C, x) = \sum_{z \in]0, x]} \sum_{i: z_i > 0} \partial_i C(z) \cdot f(z - e^i, z) \cdot s(z - e^i, z)$
- *Theorem:* every additive cost sharing method $\varphi(x)$ is represented (in at least one way) by a shared flow on $[0, x]$

Examples of additive cost sharing methods

- fixed shares: $\varphi(C, x) = C(x) \cdot s$, where s is a fixed vector of shares.
- simple proportional: $\varphi_i(C, x) = C(x) \cdot \frac{x_i}{\sum_j x_j}$
- incremental: fix an ordering of N say $\{1, 2, \dots\}$
 $\varphi_1(C, x) = C(x_1, 0), \varphi_2(C, x) = C(x_1, x_2, 0) - C(x_1, 0), \varphi_3(C, x) = C(x_1, x_2, x_3, 0) - C(x_1, x_2, 0), \dots$
- cross-subsidizing serial: say $N = \{1, 2, 3\}$ and $x_1 \leq x_2 \leq x_3$, then
$$\varphi_1(C, x) = \frac{1}{3}C(x_1, x_1, x_1); \varphi_2(C, x) = \varphi_1(C, x) + \frac{1}{2}(C(x_1, x_2, x_2) - C(x_1, x_1, x_1)); \varphi_3(C, x) = \varphi_2(C, x) + C(x) - C(x_1, x_2, x_2)$$

Responsibility in idiosyncratic demand: normative and incentive justification.

- Dummy axiom: for any i , $\{\partial_i C(z) = 0 \text{ for all } z \in \mathbb{N}^N\} \implies \varphi_i(C, x) = 0$
- Non Dummy axiom: for any i , $\{C(z) = c(z_i) \text{ for all } z \in \mathbb{N}^N\} \implies \varphi_i(C, x) = c(z_i)$
- Lemma: $\{\text{Additivity} + \text{Dummy}\} \iff \{\text{Additivity} + \text{Non Dummy}\}$

The Dummy axiom eliminates the fixed shares, simple proportional, and cross subsidizing serial methods.

Representation of Additive + Dummy methods

- a unit flow f from 0 to x defines a simple shared flow by $s(z - e^i, z) = e^i$.
- we associate to flow f the probabilistic rationing method where $\text{proba}\{r(t, x) = z\}$ is the in-flow at z .
- we associate to flow f a cost sharing method $\varphi_i(C, x) = \sum_{z \in]0, x], z_i > 0} \partial_i C(z) \cdot f(z - e^i, z)$. Dummy holds true.
- *Theorem* : every additive c.s. method $\varphi(x)$ meeting Dummy is represented *uniquely* by a unit flow f .

Thus the Additive and Dummy methods are in one-to-one correspondence with the subset of rationing methods constructed by flows.

Examples

- priority rationing $\longleftrightarrow$ incremental cost sharing
- random priority rationing $\longleftrightarrow$ Shapley-Shubik cost sharing : uniform average of all incremental methods $\Leftrightarrow$ Shapley value of the stand alone game $v(S) = C(x(S), 0(N \setminus S))$
- proportional rationing $\longleftrightarrow$ Aumann-Shapley cost sharing : uniform average over all paths from 0 to x .

Note that *Aumann Shapley* and *simple proportional* coincide when outputs are perfect substitute: $C(x) = c(\sum_i x_i)$.

- fair queuing $\longleftrightarrow$ subsidy-free serial cost sharing

The cost sharing methods corresponding to fair queuing*, equal chances rationing, equal chances*, are easy to define but have not emerged in the literature.

Characterization results: not as developed as one may want.

- Ordinality axiom: for all $i \in N, z_i \in \mathbb{N}, \{\partial_i C(z_i, z_{-i}) = 0 \text{ for all } z_{-i}\} \implies \{\text{we can } \textit{merge} \text{ } z_i \text{ and } z_i - 1\}$

Theorem: Additivity + Dummy + Ordinality $\iff$ {convex combinations of incremental methods}.

Corollary: add Equat Treatment of Equals to pick the Shapley-Shubik method.

The Aumann Shapley method is characterized by Additivity, Dummy, and 2 additional properties:

- Simple proportional for perfect substitutes
- The corresponding rationing method meets Upper Composition

Limits of the additive approach

- Demand Monotonicity axiom: for all i , C and x ,
$$\frac{\partial \varphi_i}{\partial x_i}(C, x) \geq 0$$

Note that the Aumann-Shapley method fails Demand Monotonicity !

- *Theorem:* if an additive method meets Dummy and Demand Monotonicity, it can't be simple proportional for perfect substitute outputs.

Strengthening Demand Monotonicity

- Group Demand Monotonicity: for all i, S, C and x , $i \in S \implies \frac{\partial \varphi_S}{\partial x_i}(C, x) \geq 0$
- Solidarity : for all i, j, k all distinct, all C, x , $\frac{\partial \varphi_j}{\partial x_i}(C, x) \cdot \frac{\partial \varphi_k}{\partial x_i}(C, x) \geq 0$

Theorem: Additivity + Dummy + { Group Demand Monotonicity or Solidarity } = $\emptyset$

Generalized proportional methods :

$\varphi(C, x) = \frac{f_i(x_i)}{\sum f_j(x_j)} \cdot C(x)$, where f_i is nondecreasing and positive.

- *Theorem:* The generalized proportional methods meet Group Demand Monotonicity and Solidarity. They are *characterized* by the combination {Additivity + Demand Monotonicity + Solidarity}.