

# Fair Division of Objects with Money

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a follow up to the paper

Guarantees in Fair Division: general or monotone preferences

with Anna Bogomolnaia and Richard Stong

[https://www.gla.ac.uk/media/Media\\_700119\\_smxx.pdf](https://www.gla.ac.uk/media/Media_700119_smxx.pdf)

- the manna: *indivisible* objects: mixed goods and bads, *all must go*
- money is available for compensations

Dissolution of partnership: divorce, bankruptcy with both assets and liabilities.

Inheritance: heirlooms, art, jewelry, real estate, financial assets;

jobs between contractors (profitable or not); rooms and rent between flatmates  
(active on *SPLIDDIT.org*)

we look for rules to allocate the indivisible objects that are easy to play and  
“demonstrably fair”

two familiar rules:

- *Divide and Choose (no cash)*: each player is *guaranteed* “his good half”
- *Texas Shoot Out (with cash)*: each player is *guaranteed* at least half of her value for the venture

common features: simple messages requiring small cognitive effort; reveal little:  
preserve privacy

worst case implementation of fairness: *no matter what the other parties do*;  
strategize at your own risk, *only an equal cut is safe*

## Texas Shoot Out with $n$ agents

- auction the bundled manna  $A$
- split the winning bid equally between all agents (including the winner)
- $\implies$  each agent is guaranteed  $\frac{1}{n}u(A)$  by reporting truthfully

assigning the whole manna “is the efficient way” if utilities are superadditive (and symmetric)

but de-bundling the manna is more efficient if utilities are subadditive

Divide and Choose can do the right thing in both cases

but its generalization to  $n$  agents requires some work

and it treats the Divider and Choosers differently

*what we do*: discuss two types of division rules using cash transfers to smooth out indivisibilities (as in TSO), *and* where the agents can implement any partition of the objects (as in D&C)

- the fair version of **Divide and Choose** for  $n$  agents
- the new family of **Bid and Choose** rules, more privacy-preserving than D&C; and ask the manager to select a benchmark price of objects

the model

$A$  a finite set of objects;  $N$  the set of  $n$  agents

*to do*: pick a partition  $\Pi = \{S_i\}_{i=1}^n$  and cash transfers  $t_i$  such that  $\sum_N t_i = 0$

utilities are *quasi-linear*:  $u_i(S_i) + t_i$ ; status quo ante  $u_i(\emptyset) = 0$

utilities are *combinatorial*  $u_i \in \mathbb{R}^{2^A}$



.

an efficient allocation of the objects maximises the sum  $\sum_N u_i(S_i)$  over all partitions, irrespective of cash transfers: this is computationally and cognitively difficult

our simple rules, like Divide and Choose and the Texas Shoot Out, do not deliver fully efficient allocations; they do not require agents to form, let alone report, detailed utilities

the mixed-monotone domain  $\mathcal{M}$ : each object is either *good*:  $\partial_a u(S) = u(S \cup \{a\}) - u(S) \geq 0$  for all  $S \subset A$ , or *bad*:  $\partial_a u(S) \leq 0$  for all  $S \subset A$ . Write  $A = A^+ \cup A^-$

the subadditive domain  $\mathcal{S}ub$ :  $u(S \cup T) \leq u(S) + u(T)$  if  $S \cap T = \emptyset$  the whole is less than the parts, e.g. decreasing marginal utility

the superadditive domain  $\mathcal{S}up$ :  $u(S \cup T) \geq u(S) + u(T)$  if  $S \cap T = \emptyset$  e. g. decreasing marginal cost of tasks

*most general*: the full domain  $\mathcal{D} = \mathbb{R}^{2^A}$  allows more complicated externalities (as in team selection)

a  $n$ -partition of  $A$  is  $\Pi = \{S_k\}_{k=1}^n$ ; shares can be empty

a compensated  $n$ -partition is  $\Delta = (\Pi, \Lambda) = \{(S_k, \lambda_k)\}_{k=1}^n$  where the cash transfers are balanced:  $\sum_1^n \lambda_k = 0$

*a simple Lemma:* fix for each agent  $j \in N$  a balanced vector of transfers  $\Lambda^j = (\lambda_k^j)_{k=1}^n$ . Then there exists an assignment  $\{1, \dots, n\} \ni k \rightarrow \sigma(k) = j \in N$  with a non negative surplus:

$$\sum_1^n \lambda_k^{\sigma(k)} \leq 0$$

$k$	1	2	3	4	$\sum_k \lambda_k$
$\lambda^1$	0	$-3^*$	4	$-1$	0
$\lambda^2$	$-2$	1	1	$0^*$	0
$\lambda^3$	$-4$	6	$-1^*$	$-1$	0
$\lambda^4$	$-5^*$	1	3	1	0

$D\&C_n$  *Divide and Choose with cash among  $n$  agents*

1 Divider,  $n - 1$  Choosers

Divider picks a compensated partition  $(\Pi, \Lambda^D) = \{(S_k, \lambda_k^D)\}_{k=1}^n$  then each Chooser  $C_j$ ,  $j \in N \setminus \{D\}$ , picks balanced transfers  $\Lambda^j = (\lambda_k^j)_{k=1}^n$ .

the rule picks an assignment  $\sigma$  with the largest surplus (the smallest sum of transfers), assigns  $(S_k, \lambda_k^{\sigma(k)})$  to agent  $\sigma(k)$  and distributes equally the surplus to achieve balanced transfers.

$\Pi$	$S_1$	$S_2$	$S_3$	$S_4$	$\sum_k \lambda_k$
$\lambda^1$	0	$-3^*$	4	-1	0
$\lambda^2$	-2	1	$1^*$	0	0
$\lambda^3$	$-4^*$	4	0	0	0
$\lambda^4$	-3	1	3	$-1^*$	0

surplus: -7

what Guarantees are implemented by D&C<sub>n</sub>?

the Divider exploits optimally the non-additivity of  $u$ :

$$\text{Maxmin}(u; n) = \max_{\mathcal{P}_n} \min_k \{u(S_k) + t_k\} = \frac{1}{n} \max_{\mathcal{P}_n} \sum_1^n u(S_k)$$

( $\mathcal{P}_n$  is the set of partitions)

a Chooser's Guarantee:

$$\text{minMax}(u; n) = \min_{\mathcal{P}_n} \max_k \{u(S_k) + t_k\} = \frac{1}{n} \min_{\mathcal{P}_n} \sum_1^n u(S_k)$$

*Fair Share Guarantee*: the utility level  $\Gamma(u; n; A)$  an agent with utility  $u$  can secure, through some division rule; the agent has no clue about utilities and actions of other agents

built-in Anonymity

feasibility needs to be checked!

simplest feasible Guarantee:  $\frac{1}{n}u(A)$



two general facts in **non atomic** problems of fair division

$Maxmin(u; n)$  is the best possible guarantee, in any mechanism (by the unanimity argument):  $\Gamma$  is feasible  $\implies \Gamma(u; n; A) \leq Maxmin(u; n)$

$minMax(u; n)$  is (weakly) lower than  $Maxmin(u; n)$ , and is *always* a feasible Guarantee

(main Theorem in BMS paper)

(recall from Buddish (2011) that for **atomic** problems with additive utilities and no money,  $Maxmin \leq minMax$ )

in some small domains where utilities are “similar”, *Maxmin* is a feasible Guarantee, *hence the best ever*

examples

utilities are superadditive  $\implies \text{Maxmin}(u_i; n) = \frac{1}{n}u_i(A)$  is feasible

utilities are subadditive and  $n \geq |A| \implies \text{Maxmin}(u; n) = \frac{1}{n} \sum_a u(a)$  is feasible

but this breaks down when utilities are more diverse: for instance some subadditive, some superadditive

Example 1: three identical goods, two agents, one superadditive, one subadditive

	$\emptyset$	1 good	2 goods	3 goods		$Maxmin$	$minMax$
$Sup \ni u$	0	2	8	18	$\implies u$	9	5
$Sub \ni v$	0	10	14	16	$v$	12	8

maximal surplus 18  $\implies (Maxmin(u), Maxmin(v))$  is not feasible

Example 2: four goods  $a, b, c, d$ , two agents, utilities are neither sub- nor super-additive

	$ab$	$cd$	$ac$	$bd$		$Maxmin$	$minMax$	
$u$	10	10	0	0	$\implies$	$u$	10	0
$v$	0	0	2	10		$v$	6	0

maximal surplus 10  $\implies (Maxmin(u), Maxmin(v))$  is not feasible;

large “duality gap”! Divide and Choose is very unfair

we can remove the Divider's advantage in  $D\&C_n$  by auctioning the role of Divider (old trick: Crawford 1979, Demange 1984)

this Bid-Divide-and-Choose rule is anonymous and implements the Guarantee

$$\Gamma^{BDC}(u; n) = \frac{1}{n} \text{Maxmin}(u; n) + \frac{n-1}{n} \text{minMax}(u; n)$$

we propose a “better” family of division rules

the family of *Bid and Choose* rules

a rule is defined by a price vector  $p \in \mathbb{R}^A$  for the objects (perhaps a market price estimate):  $p_S = \sum_{a \in S} p_a$  is the cost of the share  $S$

**Definition of  $\mathbf{B\&C}_n^p$ :** there are  $n - 1$  rounds of bidding

*Round 1:* each agent  $i$  bids  $\lambda_i$ ; the highest bidder, say  $i^*$  wins: she can pick any share  $S_{i^*}$  in  $A$  (including  $\emptyset$  and  $A$ ) but it costs her  $p_{S_{i^*}}$  on top of her bid  $\lambda_{i^*}$ . Her net payment is  $t_{i^*} = \lambda_{i^*} + p_{S_{i^*}}$ : each agent  $i \neq i^*$  receives  $\frac{1}{n-1}t_{i^*}$

if  $S_{i^*} = A$  Stop; otherwise go to

*Round 2:* repeat among  $N \setminus i^*$  and  $A \setminus S_{i^*}$

the loser in the last round gets the remaining share at no cost

if  $p \equiv 0$  and all objects are "good" the  $B\&C_n^0$  rule is simply  $TSO_n$

$p_S \geq 0$  means that  $S$  is "objectively valuable", while  $p_S \leq 0$  means that clearing  $S$  is "objectively a favour", and the rule compensates accordingly

a related approach: competitive Fair Division moderated by market prices (d'All Aglio (2020))

## Theorem

*i) assume  $u \in \mathcal{M}$  (each object is a good or a bad) and/or  $n = 2$ ; the rule  $B\&C_n^p$  guarantees*

$$\Gamma^p(u; n) = \frac{1}{n}[(u - p)^{\max} + (u - p)^{\min} + p_A]$$

*(this is a lower bound in the general domain  $\mathcal{D} = \mathbb{R}^{2^A}$ )*

interpretation:  $\Gamma^p(u; n)$  is a fair share of the exogenous value of manna, corrected by my largest over- and under-valuations



proof of property *i*) for  $n = 2$

my bid  $\lambda$  guarantees

$$\min \{(u - p)^{\max} - \lambda, \min_{\emptyset \subseteq T \subset A} u(T^c) + (\lambda + p_T)\}$$

$$\implies \lambda^* = \frac{1}{2} \{(u - p)^{\max} - \min_{\emptyset \subseteq T \subset A} (u(T^c) - p_{T^c}) - p_A\}$$

induction to  $n = 3$ : choose the bid  $\lambda$  to maximize

$$\min \{((u - p)^{\max} - \lambda), \min_T \left\{ \frac{1}{2}(p_T + \lambda) + \frac{1}{2}[(u - p)_{T^c}^{\max} + (u - p)_{T^c}^{\min} + p_{T^c}] \right\}\}$$

ii) for each  $u \in \mathbb{R}^{2^A}$  and  $n$ :  $\min\text{Max}(u; n) \leq \Gamma^p(u; n) \leq \text{Maxmin}(u; n)$

iii) the profile of Guarantees  $\Gamma^p$  is Second Best:  $\sum_1^n \Gamma(u_i; n) \geq \min_{\mathcal{P}_n} \sum_1^n u_i(S_i)$   
for all  $u \in \mathbb{R}^{2^A \times N}$

comparison with  $\text{BDC}_n^p$ :

as  $n$  grows  $\Gamma^{\text{BDC}}(u; n)$  gets very close to  $\min\text{Max}(u; n)$

$\Gamma^{\text{BDC}}(u; n)$  also fails the “Second Best” property

role of the design parameter  $p$ : the Guarantee  $\Gamma^p$  favors subadditive and penalises superadditive utilities

## Theorem

for any  $p \in \mathbb{R}^A$

$$\Gamma^p(u; n) \geq \frac{1}{n}u(A) \text{ if } u \in \mathcal{Sub} ; \Gamma^p(u; n) \leq \frac{1}{n}u(A) \text{ if } u \in \mathcal{Sup}$$

what empirical choice of  $p$  ? for any  $u \in \mathcal{D}$  and  $n$ ,  $\Gamma^p(u; n) = \frac{1}{n}u(A)$  if  $p$  is either large enough positive or small enough negative

a clue when objects are identical

notation:  $u(S) = U_{|S|}$  and  $|A| = \alpha$

$$\Gamma^p(u; n) = \frac{1}{n} \left[ \max_{1 \leq k \leq \alpha} (U_k - kp) + \min_{1 \leq k \leq \alpha} (U_k - kp) + \alpha p \right]$$

### **Proposition:**

if  $k \rightarrow U_k$  is convex the minimum of  $\mathbb{R} \ni p \rightarrow \Gamma^p(U; n)$  is for  $p_a = \frac{U_\alpha}{\alpha}$  (for all  $a$ )

if  $k \rightarrow U_k$  is concave the maximum of  $\mathbb{R} \ni p \rightarrow \Gamma^p(U; n)$  is for  $p_a = \frac{U_\alpha}{\alpha}$  (for all  $a$ )

Example 1: two agents, three goods total surplus is 18

	$\emptyset$	1 good	2 goods	3 goods
$Sup \ni u$	0	2	8	18
$Sub \ni v$	0	10	14	16

	$Maxmin$	$minMax$	$\Gamma^{BDA}$	$\Gamma^0$	$\Gamma^{5.7}$
$u$	9	5	7	9	7.2
$v$	12	8	10	8	10.2

Example 2: four goods  $a, b, c, d$ , two agents, utilities are neither sub- nor super-additive

	$ab$	$cd$	$ac$	$bd$	$\implies$	$u$	$Maxmin$	$minMax$	$\Gamma^{BDA}$	$\Gamma^0$	$\Gamma^{2.5}$
$u$	10	10	0	0		$u$	10	0	5	5	5
$v$	0	0	2	10		$v$	6	0	3	5	4.75

*difficult mathematical questions*

the most desirable Guarantees  $\Gamma$  are **Maximal**

for all feasible  $n$ -person  $\tilde{\Gamma} : \{\Gamma(u; n) \leq \tilde{\Gamma}(u; n) \text{ for all } u \in \mathcal{D}\} \implies \Gamma = \tilde{\Gamma}$

- a fixed  $n$ -partition  $\Pi$  gives the Guarantee  $\Gamma^\Pi(u; n) = \frac{1}{n} \sum_N u(S_j)$ ; it is maximal (on  $\mathcal{D}$  and  $\mathcal{M}$ ) if and only if  $|\Pi| = 1$  or  $n$ ; what about convex combinations of several such  $\Gamma^\Pi$  ?
- for  $n = 2$  both Guarantees  $\Gamma^p(\cdot; 2)$  and  $\Gamma^{BDA}(\cdot; 2) = \frac{1}{2}(\text{Maxmin} + \text{minMax})$  are maximal (on  $\mathcal{D}$  and  $\mathcal{M}$ ); **but not for  $n \geq 3$** : how to improve them ?

our model, though very common in real life, is not often discussed by the fair division literature

the classic cake-cutting model (Steinhaus 1948) rules out indivisible objects

recent work at the interface of Computer Science and Economics allocates indivisible objects

- either with randomisation in lieu of cash transfers: Bogomolnaia and Moulin (2001), Buddish (2011)
- or without lotteries or cash, and looks for “approximate fairness” (Procaccia and Wang (2014), Caragianis et al. (2016))



take home points:

- Divide and Choose is easily adapted to  $n$  agents problems, but does not offer good Guarantees
- the Bid and Choose rules are equally easy to implement once an objective benchmark value can be agreed upon; this needs to be tested experimentally
- their efficiency benefit above the Texas Shoot Out and Divide and Choose needs to be evaluated numerically

Thank You