

# Guarantees in Fair Division: beyond Divide and Choose and Moving Knives

Hervé Moulin

*University of Glasgow and HSE St Petersburg*

HSE and European University seminar St Petersburg October 17,  
2019

.

joint work with Anna Bogomolnaia and  
Richard Stong

Divide & Choose (**D&C**<sub>2</sub>): the ancestor of mechanism design

recent (1948) generalisation to any number  $n$  of agents:

- the Diminishing Share (**DS**) rule (one way to generalise D&C: Steinhaus 1948)
- the Moving Knife (**MK**) rule (Dubins and Spanier 1961)

## attractive features

- decentralized implementation of the *Proportional Guarantee*: the utility of my share is at least  $\frac{1}{n}$ -th of that of the whole manna
- informational parsimony as *privacy preservation*: I reveal very little of my preferences, at most one cut and  $n - 1$  queries for DS,  $n - 1$  “queries” for MK
- informational parsimony as *small cognitive effort*: I do not need to form full preferences

## unappealing features

- work for goods, or bads, but not for a mixed manna: both rules requires *co-monotone* utilities (else trimming or padding is ambiguous)
- both require *additive utilities/preferences*: otherwise the Proportional Guarantee is neither feasible nor ordinally meaningful
- (both pick inefficient allocations: a consequence of informational parsimony)

- we generalize D&C<sub>2</sub> to the  $n$ -person D&C <sub>$n$</sub>  implementing the Proportional Guarantee when utilities are additive, but the sign of marginal utilities varies across the manna and across agents; it requires neither trimming nor padding, and is informationally parsimonious
- D&C <sub>$n$</sub>  implements, *for the much, much larger class of continuous, not necessarily monotonic preferences*, the **minMax Guarantee**: the utility of my best share in the worst possible partition
- when preferences are co-monotone (all parts of the manna are desirable *goods*, or all are undesirable *bads*) we generalize MK <sub>$n$</sub>  to the rich family of Bid & Choose (**B&C**) rules: they implement better guarantees than the minMax, though still below the unfeasible **Maxmin** utility

- parsimonious computation of an efficient allocation of resources: Reiter (1972)), e. g. the competitive equilibrium: Mount and Reiter (1972), Reischelstein and Reiter (1988)
- protective/prudent implementation: Moulin (1981), Barbera and Dutta (1982), and in the entire cake-cutting literature: Brams and Taylor (1996), (2000)
- identifying the best welfare bounds (upper or lower guarantees) in cooperative production: Moulin (1990, 1991), Fleurbaey and Maniquet (1996); in fair division: Moulin (1991)
- guarantees when we distribute indivisible objects Buddish (2011), Procaccia and Wang (2014), . . .

## additive utilities, continuous model

the manna  $\Omega$  is a measurable set in an euclidian space

utility  $u_i$  of agent  $i \in N$  is a non atomic *real valued* measure on  $\Omega$  ( $u_i$  is absolutely continuous w. r. t. Lebesgue):  $u_i(S) = \int_S du_i(x) = \int_S \dot{u}_i(x) dx$

compare: in most of the cake-cutting literature all  $u_i$  are positive, or all negative

Fair Guarantee

Proportional Guarantee (**Pro**):  $u_i(S_i) \geq \frac{1}{n} u_i(\Omega)$  for all  $i$



## additive utilities, discrete model

$\Omega$  is a finite set of objects

utility of agent  $i \in N$  is a vector in  $u_i \in \mathbb{R}^\Omega$ ,  $u_i(S) = \sum_{x \in S} u_{ix}$

Fair Guarantee: *proportional up to one object*

$$\mathbf{Pro1:} \exists a \in \Omega \setminus S_i : u_i(S_i + a) \geq \frac{1}{n} u_i(\Omega)$$

$$\text{and/or } \exists b \in \Omega : u_i(S_i - b) \geq \frac{1}{n} u_i(\Omega) \text{ for all } i$$

*a combinatorial Lemma*

Fix the sets  $A$  of  $p$  items,  $M$  of  $p - 1$  agents, and an arbitrary bipartite graph of "likes" in  $M \times A$  described for all  $B \subseteq A$  by

$$\ell(B) = \{i \in M \mid i \text{ likes at least one item in } B\}$$

There exists a non empty  $B \subsetneq A$  and a possibly empty  $L \subseteq M$  such that

$$\ell(B) = L ; |L| = |B| - 1 \text{ and}$$

we can assign all but one item in  $B$  to an agent in  $L$  who likes it

Proof: simple application of the Marriage Lemma

the  $D\&C_n$  rule (continuous or discrete model)

order the agents  $1, \dots, n$ ; agent **1** partitions  $\Omega$  in  $n$  shares  $S_k$  she is is reputed to *like* (Fair Guarantee); other agents report **all** the shares they *like*, and **at least one**

find a subset  $B$  of shares and  $L$  of agents in  $\{2, \dots, n\}$  s. t. we can assign to everyone in  $L + 1$  a share he likes, and nobody outside  $L + 1$  likes any share in  $B$

repeat with the remaining manna and agents: the lowest agent in  $[n] - (L + 1)$  partitions  $\Omega - \cup_B S_k$  in  $n - |L| - 1$  shares she is reputed to like, etc..

→ important privacy feature: I do not report which *individual* objects I like or dislike

**Theorem:** *additive utilities*

*continuous model:* an agent who cuts shares of equal value when called to cut, and otherwise reports at each step all shares worth at least  $\frac{1}{n}u_i(\Omega)$  (even if we divide less than  $\Omega$  among less than  $n$  agents), ensures that her share meets Pro.

*discrete model:* an agent who cuts shares meeting Pro1 when called to cut, and otherwise reports at each step all shares meeting Pro (*not Pro1 !*) in the entire  $\Omega$ , ensures that his share meets Pro1.

proof in the continuous model

1. every share in an *equi-partition* gives the utility  $\frac{1}{n}u_i(\Omega)$
2. at each step where  $i$  is not served while  $q$  other agents are, the per capita value to  $i$  of the remaining cake increases weakly

proof in the discrete model: in any partition with per capita value at least  $\frac{1}{n}u_i(\Omega)$ , at least one share meets Pro1; in a *Maxmin* partition, maximizing the utility of her worst share, all shares meet Pro1; so she can at any step partition the remaining manna in shares meeting Pro1

the general continuous model

$\Omega$  is a compact set in an euclidian space s. t.  $\Omega = \overline{\overset{\circ}{\Omega}}$ ; shares are the closed subsets  $\emptyset \subseteq S \subseteq \Omega$  or some subfamilies of these (e. g., connected subsets); "partitions" allow for overlaps of lower dimension

individual utilities are real valued, continuous for the Hausdorff distance, and

$$u(\emptyset) = 0 \text{ and } u(S) = u(\overline{\overset{\circ}{S}})$$

example: the fair division of Arrow Debreu commodities

the general discrete model  $\Omega$  is a finite set,  $u$  is real valued on  $2^\Omega$  and  $u(\emptyset) = 0$

**the hard question:** under general utilities/preferences, what Guarantees are feasible, and parsomoniously implementable?

*the Maxmin share* (Buddish (2011)): a natural (ordinal) proposal in the spirit of D&C:

$$\text{Maxmin}(u; n) = \max_P \min_{1 \leq k \leq n} u(S_k)$$

where  $P = (S_k)_{k=1}^n$  is a  $n$ -partition of  $\Omega$

in the continuous model with additive utilities  $Maxmin(u; n) = \frac{1}{n}u_i(\Omega)$ , but with general utilities the profile  $(Maxmin(u_i; n))_{i \in N}$  is easily not feasible, already with two agents

*Example* agents 1 and 2 with utilities  $u$  and  $v$  divide  $\omega = (1, 1)$

$$u(x, y) = \min\{x, y\} ; v(x, y) = \max\{x, y\}$$

$$Maxmin(u; 2) = u\left(\frac{1}{2}\omega\right) ; Maxmin(v; 2) = v(\omega)$$



consider instead the (ordinal) *minMax share* (Shams et al. (2019))

$$\mathit{minMax}(u; n) = \min_P \max_{1 \leq k \leq n} u(S_k)$$

in the continuous model, if  $P$  is an equi-partition of  $\Omega$  for  $u$  we have

$$\mathit{minMax}(u; n) \leq u(P) \leq \mathit{Maxmin}(u; n)$$

**Lemma** *the continuity assumptions ensure that such an equi-partition exists*

Proof: if  $u$  is non negative (all shares desirable) this follows from Su (1999) or a simple application of the KKM lemma. If  $u$  is real valued, the proof is harder.

example 1

$\Omega$  is a square in  $\mathbb{R}^2$  and  $u(S)$  is the diameter of  $\overset{\circ}{S}$ :  $\frac{Maxmin(u;2)}{minMax(u;2)} = \frac{\sqrt{2}}{2/\sqrt{5}} =$

$$1.27; \frac{Maxmin(u;4)}{minMax(u;4)} = 2$$

example 2: in the Arrow Debreu model:  $minMax(u; n) \leq u(\frac{1}{n}\omega) \leq Maxmin(u; n)$

for  $n = 2$  and  $\omega = (1, 1)$

$$u(x, y) = \min\{x, y\}: minMax(u; 2) = 0 < u(\frac{1}{2}\omega) = Maxmin(u; 2)$$

$$v(x, y) = \max\{x, y\}: minMax(v; 2) = v(\frac{1}{2}\omega) < v(\omega) = Maxmin(v; 2)$$

**Theorem:** *continuous model*

in the  $D\&C_n$  rule, an agent who cuts shares of equal value when called to cut, and otherwise reports at each step all shares worth at least  $\min\text{Max}(u_i; n)$  (over the entire  $\Omega$  and with  $n$  agents), guarantees that utility level

note that agent 1 who cuts first is guaranteed  $\text{Maxmin}(u_1; n)$ , but other agent only  $\min\text{Max}(u_i; n)$

proof

1. at each step where  $i$  is not served, the shares served to the leaving agents are worth strictly less to  $i$  than  $\min\text{Max}(u_i; n)$
2. so if  $i$  is not cutting in the next step, at least one of the shares on offer is worth at least  $\min\text{Max}(u_i; n)$
3. and if  $i$  is cutting in the next step, any equi-partition of the remaining manna guarantees  $\min\text{Max}(u_i; n)$  as well

in the discrete model with general preferences, things are not so simple

- equi-partitions typically do not exist
- the *minMax* and *Maxmin* utilities are no longer comparable, e. g., if  $u$  is additive  $Maxmin(u; n) \leq minMax(u; n)$
- neither guarantee is feasible, even under additive utilities (Procaccia and Wang (2014))

so the  $D\&C_n$  rule is not interesting any more

note: the *Maxmin* Guarantee is at least  $\frac{3}{4}$ -feasible if utilities are additive (Ghodsi et al. (2017)), but the corresponding algorithm is anything but simple or informationally parsimonious

**monotone preferences:** *increasing*  $\mathcal{M}^+(\Omega)$ , or *decreasing*  $\mathcal{M}^-(\Omega)$

$$\forall S \subset \Omega, T \subseteq \Omega \setminus S : u(S) \leq u(S \cup T) \text{ (or } u(S) \geq u(S \cup T))$$

increasing: the manna is (weakly) desirable, *freely disposable*

decreasing: we divide non disposable “bads”, “chores”

**result:** *in each domain we can improve substantially the minMax Fair Guarantee*

the Moving Knife rule inefficiently restricts the available shares

the Bid & Choose rules (**B&C**) generalize MK by running a “more inclusive” knife

the  $B\&C_2^\theta$  rule: definition for **two** agents(continuous or discrete model)

$\theta$  is an increasing and continuous *calibration* (benchmark utility) of the shares  
s. t.  $\theta(\emptyset) = 0$ ,  $\theta(\Omega) = 1$ , and  $\theta(S) = 0$  if  $S$  is not full dimensional

agent  $i$  bids  $x_i \in [0, 1]$ ; (one of) the lowest bidder  $i$  can choose any share  $S_i$   
such that  $\theta(S_i) \leq x_i$ ; the loser  $j$  gets  $\Omega \setminus S_i$

**Theorem** preferences in  $\mathcal{M}^+(\Omega)$ , continuous or discrete model

i) in the B&C $^\theta_2$  rule each agent can guarantee the utility level  $\Gamma_2^\theta$

$$\Gamma_2^\theta(u_i) = \max_{1 \leq x \leq 0} \min\{u_i^+(x), u_i^-(x)\} \quad (1)$$

$$\text{where } u_i^+(x) = \max_{\theta(S) \leq x} u_i(S) ; u_i^-(y) = \min_{\theta(S) \leq x} u_i(\Omega \setminus S)$$

ii) the bid(s)  $x_i^*$  securing this Guarantee solves the program (1) above

iii) the Guarantee  $\Gamma_2^\theta$  is maximal (unimprovable) and we have

$$\min \text{Max}(u; 2) \leq \Gamma_2^\theta(u) \leq \text{Maxmin}(u; 2) \text{ for all } u$$



the rule  $B\&C_2^\theta$  is anonymous like MK; it is MK if  $\theta(S) = \max_{S \subseteq S(t)} t$ , where  $t \rightarrow S(t)$  is the cut at time  $t$

whether in prudent or in Nash equilibrium strategies, numerical simulations show that it collects a larger share of the surplus than MK

alternative definitions: the lowest bidder  $i$  chooses any  $S_i$  such that  $\theta(S_i) \leq x_j$ : achieves the same guarantees and is more balanced

version for bads  $\mathcal{M}^-(\Omega)$ : the highest bidder  $i$  can choose any share  $S_i$  such that  $\theta(S_i) \geq x_i$

example  $n = 2$  ;  $\omega = (1, 1)$  with  $\theta(x, y) = \frac{1}{2}(x + y)$

for  $u(x, y) = \min\{x, y\}$ :

$$\min \text{Max}(u; 2) = 0 < \Gamma_2^\theta(u) = u\left(\frac{1}{3}\omega\right) \leq \text{Maxmin}(u; 2) = u\left(\frac{1}{2}\omega\right)$$

for  $v(x, y) = \max\{x, y\}$ :

$$\min \text{Max}(v; 2) = u\left(\frac{1}{2}\omega\right) \leq \Gamma_2^\theta(v) = u\left(\frac{2}{3}\omega\right) \leq \text{Maxmin}(v; 2) = u(\omega)$$

so that  $(\Gamma_2^\theta(u), \Gamma_2^\theta(v))$  is a fair Pareto optimal utility profile at the profile  $(u, v)$ .

Agent 1 bids  $\frac{1}{3}$ : if she wins she picks  $(\frac{1}{3}, \frac{1}{3})$ , if she loses she is guaranteed at least  $\frac{1}{3}$  of each good

Agent 2 also bids  $\frac{1}{3}$  and chooses  $(\frac{2}{3}, 0)$  or is guaranteed at least  $\frac{2}{3}$  of some good.

a discrete example:  $n = 2$ , eight balls  $a, b, \dots, h$

agent 1's utility: largest number of lexicographically adjacent balls

agent 2's utility: largest number of adjacent balls for the order  $a, e, c, g, b, f, d, h$

benchmark:  $\theta(S) = |S|$  who needs the smallest number of balls

for both agents, the prudent bid is 3 or 2 and

$$\min \text{Max}(u_i) = 1 < \Gamma_2^\theta(u_i) = 2 \leq \text{Maxmin}(u_i) = 4$$

here  $(3, 3)$  is a Pareto optimal utility profile

the B&C $_n^\theta$  rule: definition for  $n$  agents

Step 1 each agent  $i$  bids  $x_i^1 \in [0, 1]$

(one of) the winners (lowest bidders), 1, chooses  $S_1$  s. t.  $\theta(S_1) \leq x_1^1$

Step 2 each agent  $i \geq 2$  bids  $x_i^2 \in [x_1^1, 1]$

(one of) the winners, 2, chooses  $S_2 \subseteq \Omega \setminus S_1$  s. t.  $\theta(S_1 \cup S_2) \leq x_2^2$

Step  $n - 1$ : the two remaining agents bid  $x_i^{n-1} \in [\sum_1^{n-2} x_j^j, 1]$

the winner,  $n - 1$ , chooses  $S_{n-1} \subseteq \Omega \setminus \cup_1^{n-2} S_j$  s. t.  $\theta(\cup_1^{n-1} S_j) \leq x_{n-1}^{n-1}$

the last agent gets  $S_n = \Omega \setminus \cup_1^{n-1} S_j$

the B&C Welfare Guarantee for general  $n$

$$\Gamma_n^\theta(u, \Omega) = \max_X \min_{1 \leq k \leq n} u^*(x^{k-1}; x^k)$$

where  $X$  is any weakly increasing sequence  $0 = x^0 \leq x^1 \leq x^2 \leq \dots \leq x^n = 1$ , and for any  $y, z$  s.t.  $0 \leq y \leq z \leq 1$ , we define

$$u^*(y; z) = \min_{\theta(S) \leq y} \max_{T \subseteq \Omega \setminus S, \theta(S \cup T) \leq z} u(T)$$

for instance

$$\Gamma_3^\theta(u, \Omega) = \max_{0 \leq x^1 \leq x^2 \leq x^3 \leq 1} \min\{u^+(x^1), u^*(x^1; x^2), u^-(x^2)\}$$

**Theorem** repeating the same three points

## take home points

- we generalise both the Divide and Choose and the Moving Knife rules
- our  $D\&C_n$  rule requires only equi-partitions and “like” reports; it applies to the maximal domain of continuous utilities and respects the privacy of preferences just like  $D\&C_2$
- our versatile  $B\&C_n^\theta$  rules allow great flexibility in the choice of  $\theta$ , and preserve the simplicity and anonymity of MK; they only apply to co-monotone preferences

Thank You