

# Applied Cooperative Game Theory

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- Potential of the Shapley value
- Self-duality
- Marginal Contributions
- Recursion formulas
- The Shapley Value and the core

ImpSha

PotSh #1

PotSh #2

PotSh #3

Self-du #1

Self-du #2

MCP #1

MCP #2

Rec #1

Rec #2

Rec #3

Rec #4

Rec #5

ShCo #1

ShCo #2

ShCo #3

# The potential to the Shapley value #1

## Definition

A **potential**  $P$  for TU games is an operator that assigns to any TU game  $(N, v)$  a number  $P(N, v) \in \mathbb{R}$  such that

(i)  $P(\emptyset, v) = 0,$

(ii)  $\sum_{i \in N} \left[ P(N, v) - P(N \setminus \{i\}, v|_{N \setminus \{i\}}) \right] = v(N).$

## Theorem

*There is a unique potential for TU games, which satisfies*

$$P(N, v) - P(N \setminus \{i\}, v|_{N \setminus \{i\}}) = \text{Sh}_i(N, v), \quad i \in N.$$

ImpSha

PotSh #1

PotSh #2

PotSh #3

Self-du #1

Self-du #2

MCP #1

MCP #2

Rec #1

Rec #2

Rec #3

Rec #4

Rec #5

ShCo #1

ShCo #2

ShCo #3

## The potential to the Shapley value #2

**Proof.** Uniqueness: Let  $P, Q$  be two potentials. We show  $P = Q$ .

- *Induction basis:*  $|N| = 1$ . by (i+ii),  $P(\{i\}, v) = Q(\{i\}, v) = v(\{i\})$ .
- *Induction hypothesis (H):*  $P = Q$  for  $|N| \leq k$
- *Induction step:* let  $|N| = k + 1$ . this implies

$$P(N, v) \stackrel{(ii)}{=} \frac{v(N) + \sum_{i \in N} P(N \setminus \{i\}, v|_{N \setminus \{i\}})}{|N|} \stackrel{H}{=} Q(N, v)$$

ImpSha  
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Rec #3  
Rec #4  
Rec #5  
ShCo #1  
ShCo #2  
ShCo #3

## The potential to the Shapley value #3

- existence: consider the operator  $P$  given by

$$P(N, v) := \sum_{T \subseteq N, T \neq \emptyset} \frac{\lambda_T(v)}{|T|}$$

- this gives  $P(\emptyset, v) = 0$  and

$$\begin{aligned} & \sum_{i \in N} P(N, v) - P(N \setminus \{i\}, v|_N) \\ &= \sum_{i \in N} \sum_{T \subseteq N, T \neq \emptyset} \frac{\lambda_T(v)}{|T|} - \sum_{i \in N} \sum_{T \subseteq N, T \neq \emptyset, i \notin T} \frac{\lambda_T(v)}{|T|} \\ &= \sum_{i \in N} \sum_{T \subseteq N, T \neq \emptyset, i \in T} \frac{\lambda_T(v)}{|T|} \\ &= \sum_{i \in N} \text{Sh}_i(N, v) = v(N) \end{aligned}$$

ImpSha  
PotSh #1  
PotSh #2  
PotSh #3  
Self-du #1  
Self-du #2  
MCP #1  
MCP #2  
Rec #1  
Rec #2  
Rec #3  
Rec #4  
Rec #5  
ShCo #1  
ShCo #2  
ShCo #3

## Definition

**The dual game**  $(N, v^*)$  of a TU game  $(N, v)$  is defined by

$$v^*(S) = v(N) - v(N \setminus S) \text{ for } S \subseteq N. \quad (1)$$

Interpretation: Lose of the great coalition, if the players of  $S$  leave.

## Definition

A value  $\phi$  for a TU game  $(N, v)$  is called **self-dual**, if

$$\phi(N, v) = \phi(N, v^*). \quad (2)$$

ImpSha  
PotSh #1  
PotSh #2  
PotSh #3  
Self-du #1  
Self-du #2  
MCP #1  
MCP #2  
Rec #1  
Rec #2  
Rec #3  
Rec #4  
Rec #5  
ShCo #1  
ShCo #2  
ShCo #3

## Theorem

*The Shapley value is self-dual.*

**Proof:** For  $i \in N$  and  $K \subseteq N \setminus \{i\}$ , we have

$$\begin{aligned}
 MC_i^{v^*}(K) &= v^*(K \cup \{i\}) - v^*(K) \\
 &= v(N) - v(N \setminus (K \cup \{i\})) - (v(N) - v(N \setminus K)) \\
 &= v(N \setminus K) - v((N \setminus K) \setminus \{i\}) \\
 &= MC_i^v((N \setminus K) \setminus \{i\}).
 \end{aligned}$$

Further,

$$\begin{aligned}
 \text{Sh}_i(N, v^*) &= \sum_{K \subseteq N \setminus \{i\}} \frac{|K|! (|N| - |K| - 1)!}{|N|!} MC_i^{v^*}(K) \\
 &= \sum_{K \subseteq N \setminus \{i\}} \frac{(|N| - |K| - 1)! |K|!}{|N|!} MC_i^v((N \setminus K) \setminus \{i\}) \\
 &= \text{Sh}_i(N, v).
 \end{aligned}$$

□

# Marginal Contributions Property 1

## Definition

Let  $S \subseteq N$  and  $v \in \mathbb{V}(N)$ . The TU game  $(N \setminus S, v^S)$  defined by

$$v^S(T) = v(S \cup T) - v(S) \text{ for all } T \subseteq N \setminus S \quad (3)$$

is called **the  $S$  - marginal game of  $(N, v)$** .

Interpretation: The first players in a rank order of  $N$  are the players of coalition  $S$ . If the coalition  $T$  joins  $S$ ,  $v^S(T)$  describes the contribution of  $T$  to  $S$ .

## Problem

*Show: For any  $S \subseteq N$  and any monotonic game  $v \in \mathbb{V}(N)$ ,  $v^S \in \mathbb{V}(N \setminus S)$  is nonnegative.*

ImpSha  
PotSh #1  
PotSh #2  
PotSh #3  
Self-du #1  
Self-du #2  
MCP #1  
MCP #2  
Rec #1  
Rec #2  
Rec #3  
Rec #4  
Rec #5  
ShCo #1  
ShCo #2  
ShCo #3



## Marginal Contributions Property 2

### Definition

A value  $\phi$  suffices the **marginal contributions property**, if for any TU game  $(N, v)$  and any  $i, j \in N, i \neq j$

$$\phi_i(N, v) - \phi_i(N \setminus \{j\}, v^j) = \phi_j(N, v) - \phi_j(N \setminus \{i\}, v^i).$$

### Theorem

*The Shapley value suffices the marginal contributions property.*

ImpSha  
PotSh #1  
PotSh #2  
PotSh #3  
Self-du #1  
Self-du #2  
MCP #1  
MCP #2  
Rec #1  
Rec #2  
Rec #3  
Rec #4  
Rec #5  
ShCo #1  
ShCo #2  
ShCo #3

# Recursion formulas for the Shapley value 1

## Theorem

For all  $v \in \mathbb{V}(N)$  and  $i \in N$ ,

$$Sh_i(N, v) = \frac{1}{|N|} (v(N) - v(N \setminus \{i\})) + \frac{1}{|N|} \sum_{j \in N \setminus \{i\}} Sh_i(N \setminus \{j\}, v|_{N \setminus \{j\}}).$$

Interpretation: The Shapley value of  $i$  is the sum of the marginal contribution to  $N \setminus \{i\}$  ( $i$  is the last player in the rank order) and the sum of all Shapley values, such that another player is the last player.

ImpSha  
PotSh #1  
PotSh #2  
PotSh #3  
Self-du #1  
Self-du #2  
MCP #1  
MCP #2  
Rec #1  
Rec #2  
Rec #3  
Rec #4  
Rec #5  
ShCo #1  
ShCo #2  
ShCo #3

## Recursion formulas for the Shapley value 2

**Proof:** For  $|N| = 1$  the claim is immediate. Let now  $|N| > 1$ . The Shapley value satisfies *BC* and *E*. By *BC* we get

$$Sh_i(N, v) - Sh_j(N, v) = Sh_i(N \setminus \{j\}, v \upharpoonright_{N \setminus \{j\}}) - Sh_j(N \setminus \{i\}, v \upharpoonright_{N \setminus \{i\}}).$$

By summing up over  $j \in N \setminus \{i\}$  we get

$$\begin{aligned} \sum_{j \in N \setminus \{i\}} Sh_i(N \setminus \{j\}, v \upharpoonright_{N \setminus \{j\}}) - Sh_{N \setminus \{i\}}(N \setminus \{i\}, v \upharpoonright_{N \setminus \{i\}}) = \\ (|N| - 1) Sh_i(N, v) - Sh_{N \setminus \{i\}}(N, v) \end{aligned}$$

ImpSha  
PotSh #1  
PotSh #2  
PotSh #3  
Self-du #1  
Self-du #2  
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MCP #2  
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Rec #3  
Rec #4  
Rec #5  
ShCo #1  
ShCo #2  
ShCo #3

## Recursion Formulas for the Shapley value 3

Adding a zero term leads to

$$\begin{aligned} & |N| Sh_i(N, v) - Sh_N(N, v) \\ &= \sum_{j \in N \setminus \{i\}} Sh_i(N \setminus \{j\}, v |_{N \setminus \{j\}}) - Sh_{N \setminus \{i\}}(N \setminus \{i\}, v |_{N \setminus \{i\}}). \end{aligned}$$

Using efficiency

$$|N| Sh_i(N, v) - v(N) = \sum_{j \in N \setminus \{i\}} Sh_i(N \setminus \{j\}, v |_{N \setminus \{j\}}) - v(N \setminus \{i\})$$

Hence

$$Sh_i(N, v) = \frac{1}{|N|} (v(N) - v(N \setminus \{i\})) + \frac{1}{|N|} \sum_{j \in N \setminus \{i\}} Sh_i(N \setminus \{j\}, v |_{N \setminus \{j\}}).$$

and we are done.

ImpSha  
PotSh #1  
PotSh #2  
PotSh #3  
Self-du #1  
Self-du #2  
MCP #1  
MCP #2  
Rec #1  
Rec #2  
Rec #3  
Rec #4  
Rec #5  
ShCo #1  
ShCo #2  
ShCo #3

## Recursion Formulas for the Shapley value 4

### Theorem

For all  $v \in \mathbb{V}(N)$  and  $i \in N$ ,

$$Sh_i(N, v) = \frac{1}{|N|} v(\{i\}) + \frac{1}{|N|} \sum_{j \in N \setminus \{i\}} Sh_i(N \setminus \{j\}, v^j),$$

**Proof** For  $j \in N$  and  $S \in N \setminus \{j\}$ :

$$\begin{aligned} (v^j)^*(S) &= v^j(N \setminus j) - v^j(N \setminus \{j\} \setminus S) \\ &= v(N) - v(\{j\}) - v(N \setminus S) + v(\{j\}) \\ &= v(N) - v(N \setminus S) \\ &= v^*(S). \end{aligned}$$

ImpSha  
PotSh #1  
PotSh #2  
PotSh #3  
Self-du #1  
Self-du #2  
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MCP #2  
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Rec #3  
Rec #4  
Rec #5  
ShCo #1  
ShCo #2  
ShCo #3

## Recursion Formulas for the Shapley value 5

By using this equation and the self-duality of the Shapley value we get

$$\begin{aligned} Sh(N, v) &= Sh(N, v^*) \\ &= \frac{1}{|N|} (v^*(N) - v^*(N \setminus \{i\})) + \\ &\quad \frac{1}{|N|} \sum_{j \in N \setminus \{i\}} Sh_i(N \setminus \{j\}, v^*|_{N \setminus \{j\}}) \\ &= \frac{1}{|N|} (v(N) - v(\emptyset) - v(N) + v(\{i\})) + \\ &\quad \frac{1}{|N|} \sum_{j \in N \setminus \{i\}} Sh_i(N \setminus \{j\}, (v^j)^*) \\ &= \frac{1}{|N|} v(\{i\}) + \frac{1}{|N|} \sum_{j \in N \setminus \{i\}} Sh_i(N \setminus \{j\}, v^j) \end{aligned}$$

and we are done.

ImpSha  
PotSh #1  
PotSh #2  
PotSh #3  
Self-du #1  
Self-du #2  
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MCP #2  
Rec #1  
Rec #2  
Rec #3  
Rec #4  
Rec #5  
ShCo #1  
ShCo #2  
ShCo #3

# The Shapley value and the core 1

## Theorem

*Let  $(N, v)$  be a convex TU-game. Then the Shapley payoff  $(Sh_i(N, v))_{i \in N}$  lies in the core of the game  $(N, v)$*

## Proof:

Efficiency: The Shapley payoffs fulfill the efficiency axiom, therefore

$$\sum_{i \in N} Sh_i(N, v) = v(N),$$

ImpSha  
PotSh #1  
PotSh #2  
PotSh #3  
Self-du #1  
Self-du #2  
MCP #1  
MCP #2  
Rec #1  
Rec #2  
Rec #3  
Rec #4  
Rec #5  
ShCo #1  
ShCo #2  
ShCo #3

## The Shapley value and the core 2

Non-blockability: Let  $S \subseteq N$ , we have to show

$$\sum_{i \in S} Sh_i(N, v) \geq v(S).$$

Let  $\sigma \in \Sigma(N)$  be an order of  $N$  and define  $\tau: S \rightarrow S$  the induced order of  $S$  which is defined by

$$\sigma(i) > \sigma(j) \implies \tau(i) > \tau(j).$$

Because of convexity of  $v$  and  $K_i(\tau) \subseteq K_i(\sigma)$  we have:

$$MC_i(\tau) \leq MC_i(\sigma).$$

Therefore we have

$$\sum_{i \in S} MC_i(\sigma) \geq \sum_{i \in S} MC_i(\tau) = v(S).$$

ImpSha  
PotSh #1  
PotSh #2  
PotSh #3  
Self-du #1  
Self-du #2  
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Rec #3  
Rec #4  
Rec #5  
ShCo #1  
ShCo #2  
ShCo #3



## The Shapley value and the core 3

Now we obtain

$$\begin{aligned} \sum_{i \in S} Sh_i(N, v) &= \sum_{i \in S} \frac{1}{|\Sigma(N)|} \sum_{\sigma \in \Sigma(N)} MC_i(\sigma) \\ &= \frac{1}{|\Sigma(N)|} \sum_{\sigma \in \Sigma(N)} \sum_{i \in S} MC_i(\sigma) \\ &\geq \frac{1}{|\Sigma(N)|} \sum_{\sigma \in \Sigma(N)} v(S) \\ &\geq v(S). \end{aligned}$$

Therefore for convex games the Shapley payoffs fulfills non-blockability.

ImpSha  
PotSh #1  
PotSh #2  
PotSh #3  
Self-du #1  
Self-du #2  
MCP #1  
MCP #2  
Rec #1  
Rec #2  
Rec #3  
Rec #4  
Rec #5  
ShCo #1  
ShCo #2  
ShCo #3