### Bidding Strategies for Shapley Value Profit Sharing

### 2

#### **Profit Sharing Rule:**

Calculating the Shapley Value

Shapley Value 
$$_{i} = \sum_{S,i \in S} \frac{(|S|-1)!*(|N|-|S|)!}{|N|!} * [g(S)-g(S\setminus i)]$$

#### Where:

N = Grand Coalition of Carriers

S = Subset of Grand Coalition

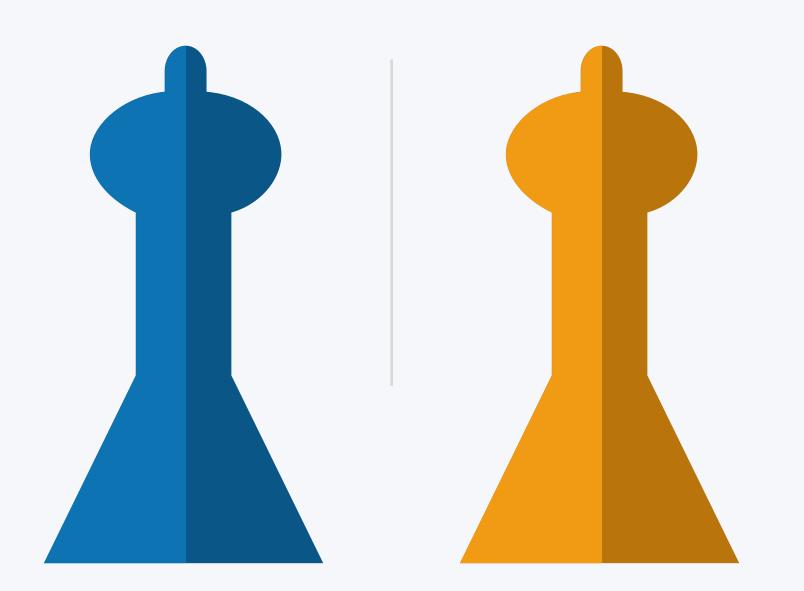
g(S) = Collaboration Gain of Coalition S

See [11]

#### **Conspiring Bidder Strategies**

#### **Strategic Bidder Strategies**

INPUT\_MAX
Increase price of Input Bid



#### INPUT\_MANIPULATION

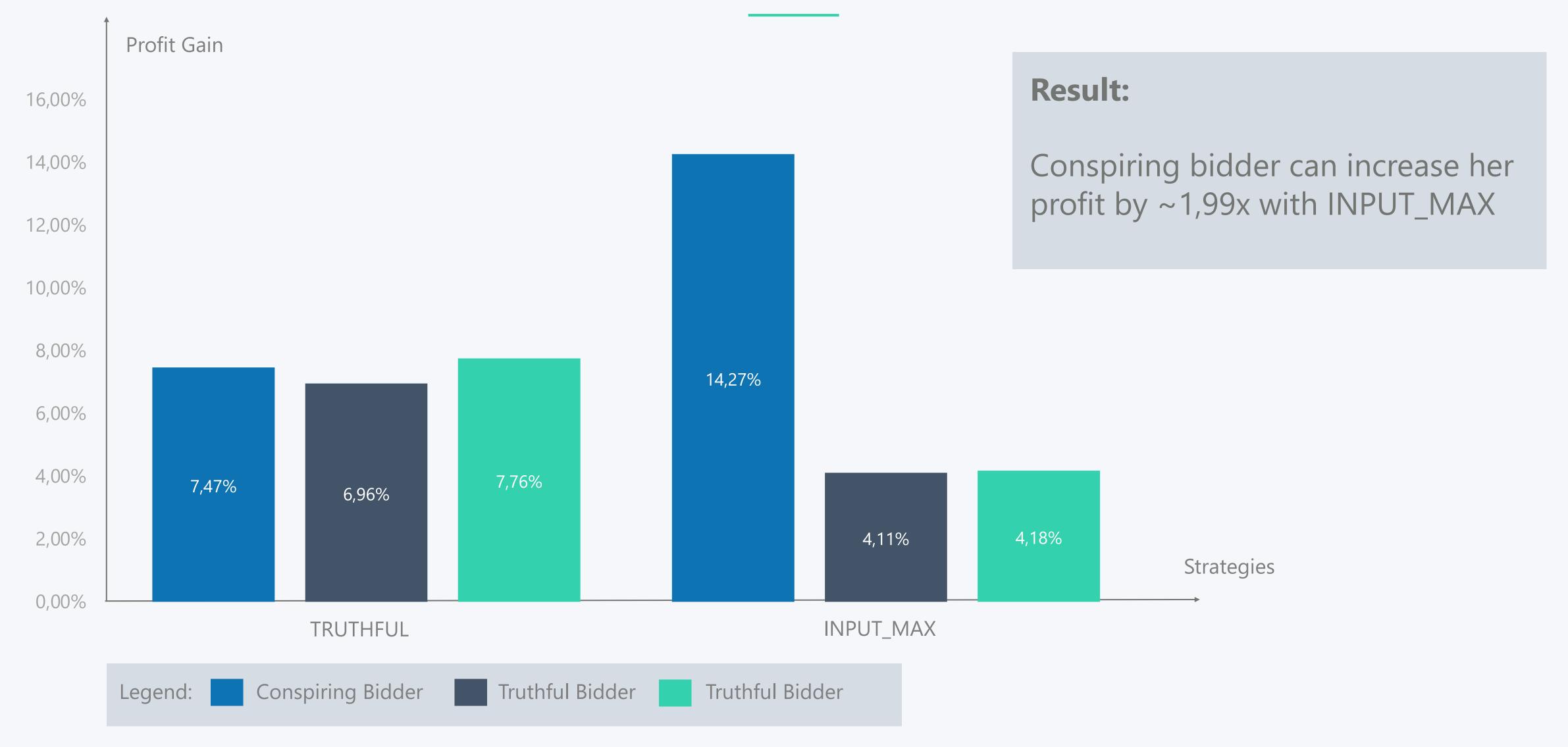
Overbid/Underbid on the Input Bid

#### BID\_MANIPULATION\_REL

Overbid/Underbid on all bids with a relative margin

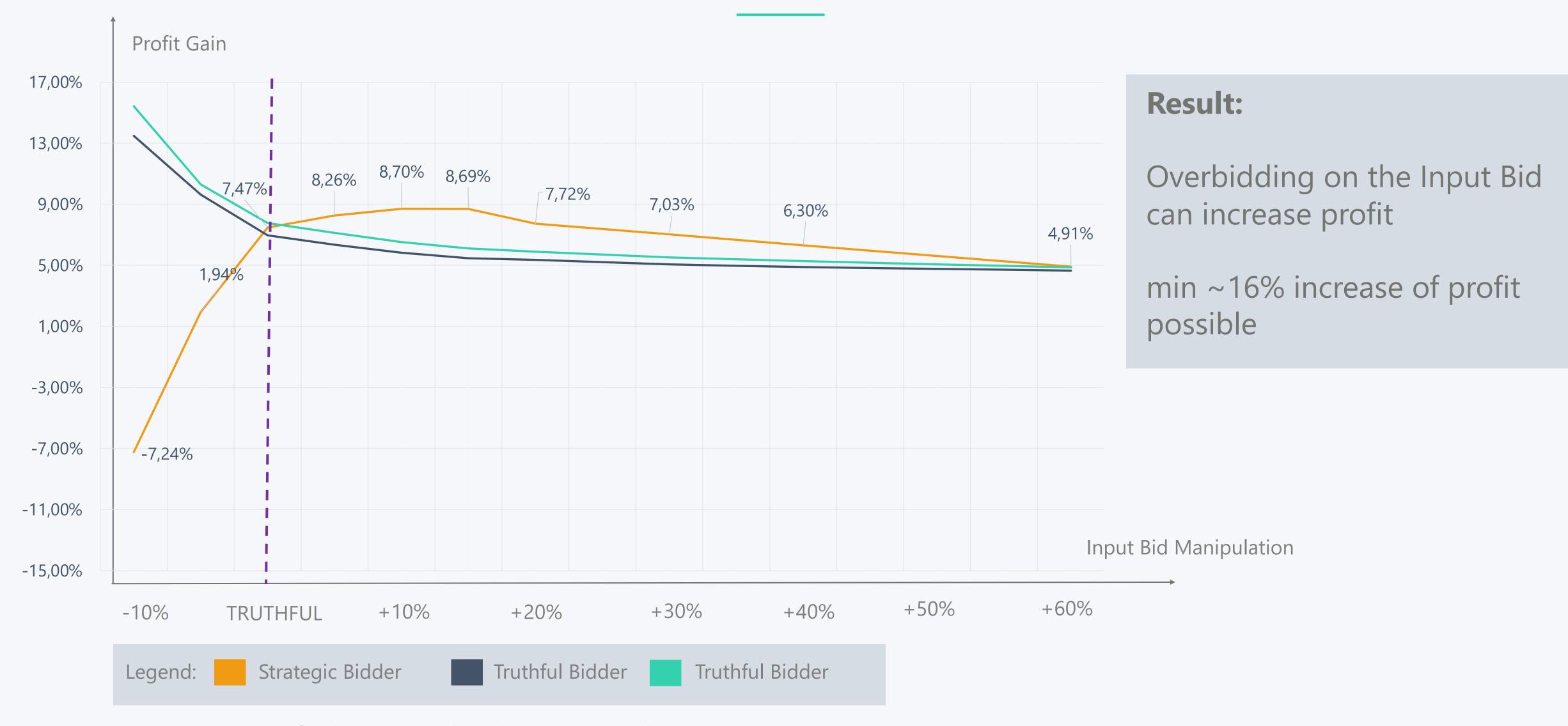
### Bidding Strategies for Shapley Value Profit Sharing Test Results for Conspiring Bidder





## Bidding Strategies for Shapley Value Profit Sharing Test Results for Strategic Bidder

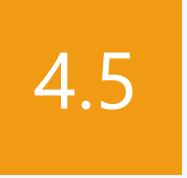




## Bidding Strategies for Shapley Value Profit Sharing Test Results for Strategic Bidder







# Bidding Strategies for Critical Weight Profit Sharing

Valuation

#### **Profit Sharing Rule:**

Use the **Critical Delta** for the calculation of the profit share

#### Note

Paying the Critical Delta to bidders would be equivalent to paying the Vickrey-Clarke-Groves Payment which creates an incentive compatible mechanisms (not budged balanced)

Critical Delta

Feasible Solutions

Legend: Price of my BID Price of my INPUT BID Price of BIDs (others)

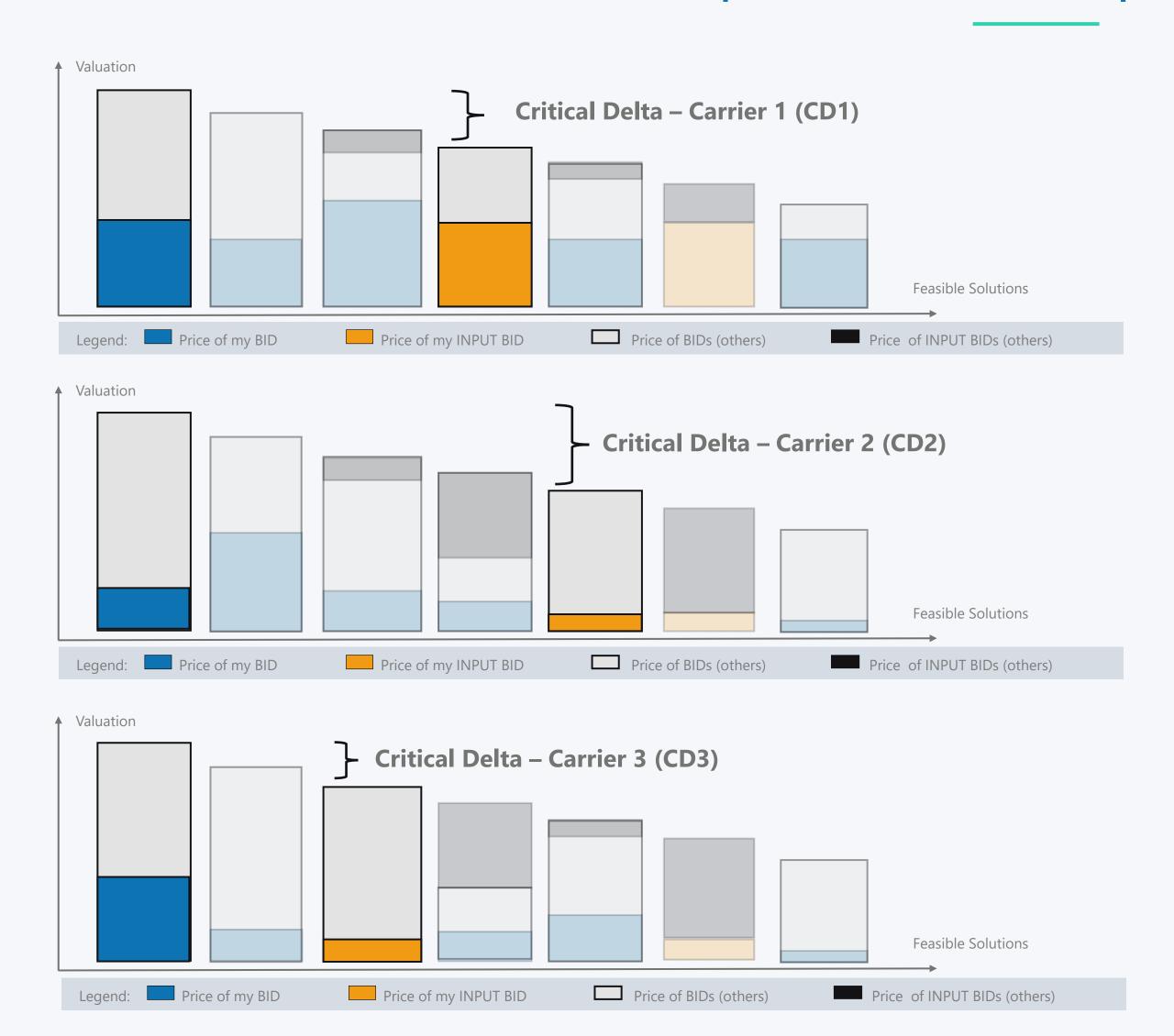
Price of INPUT BIDs (others)

See [9]

#### Bidding Strategies for Critical Weight Profit Sharing

### Perspective of Conspiring Bidder





#### **Critical Weight**

For Carrier 1:

CD1 / (CD1 + CD2 + CD3) ~ 33%

For Carrier 2:

CD2 / (CD1 + CD2 + CD3) ~ 43%

For Carrier 3:

CD3 / (CD1 + CD2 + CD3) ~ 24%

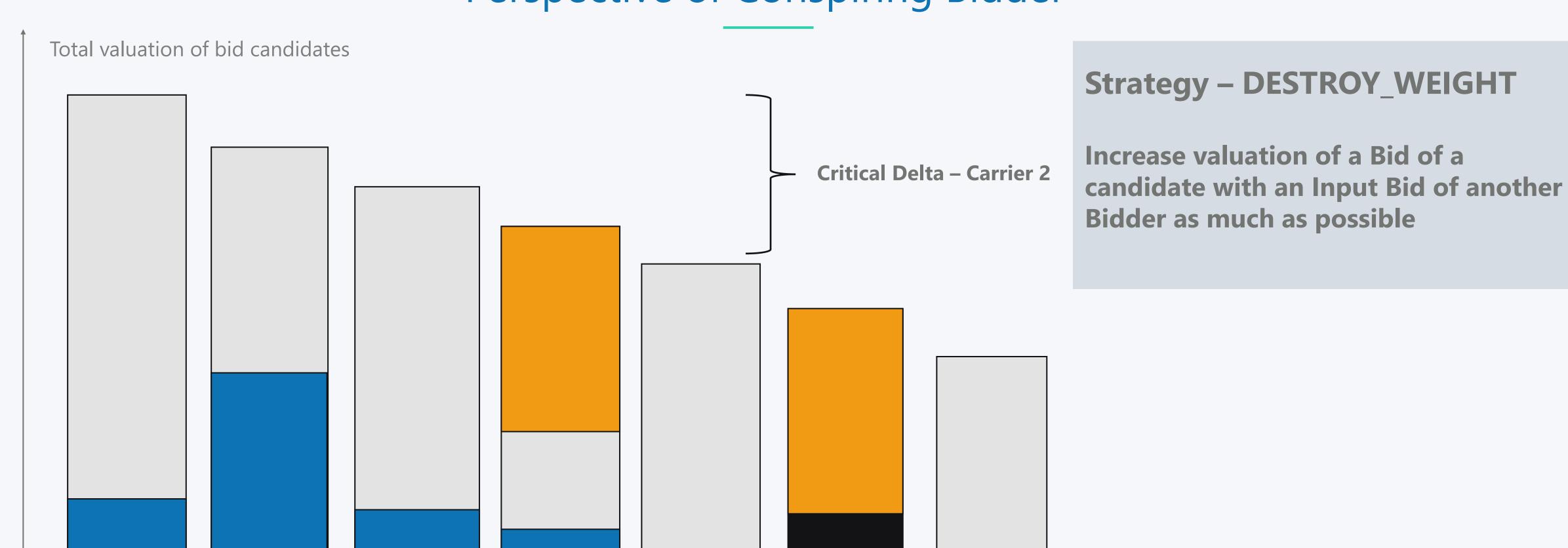
Interpretation

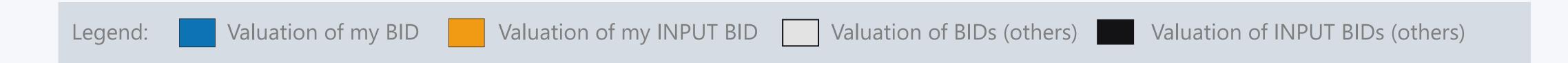
Marginal contribution of the carrier (however, less accurate than the Shapley Value because not considering all sub-coalitions)

# Bidding Strategies for Critical Weight Profit Sharing Perspective of Conspiring Bidder



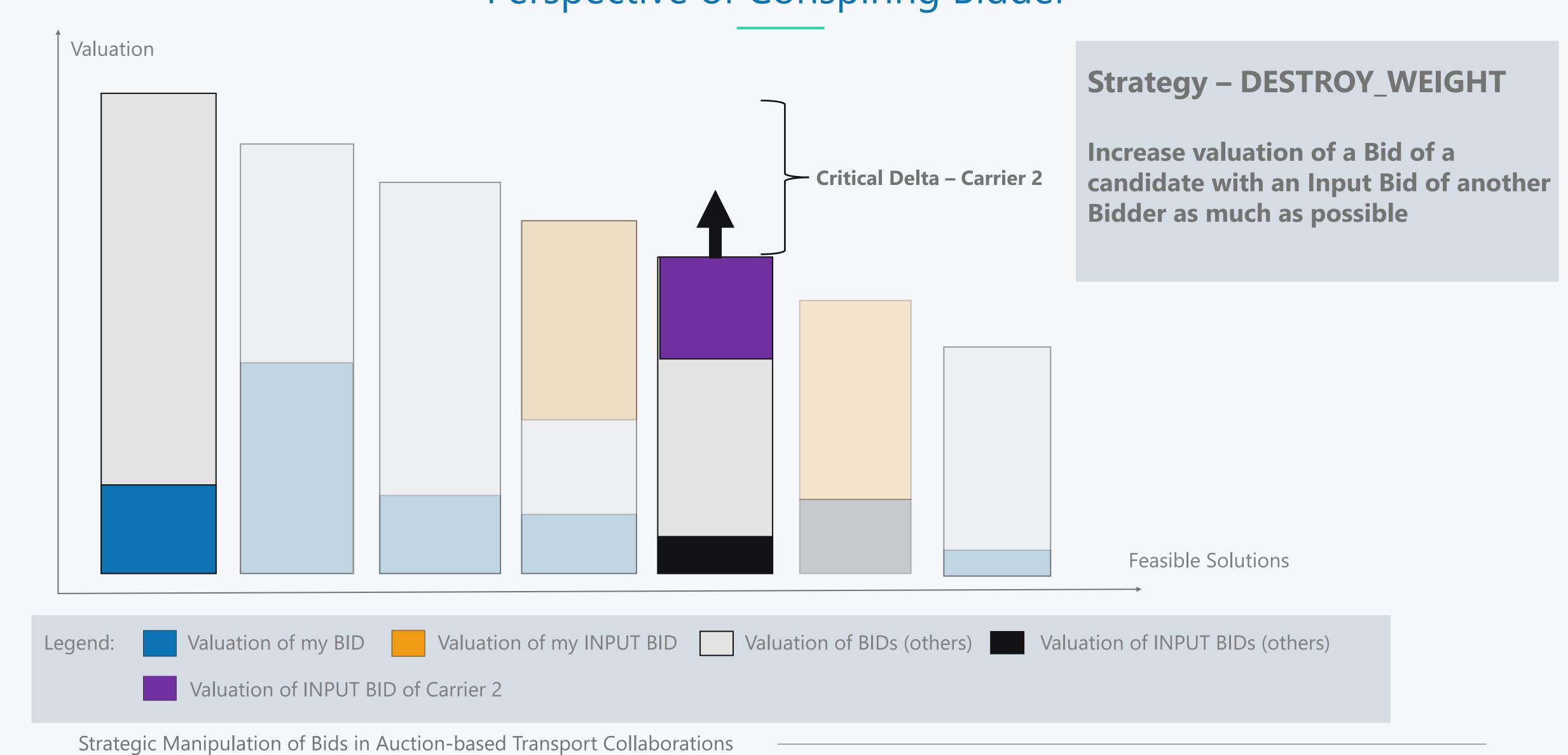
**Feasible Solutions** 





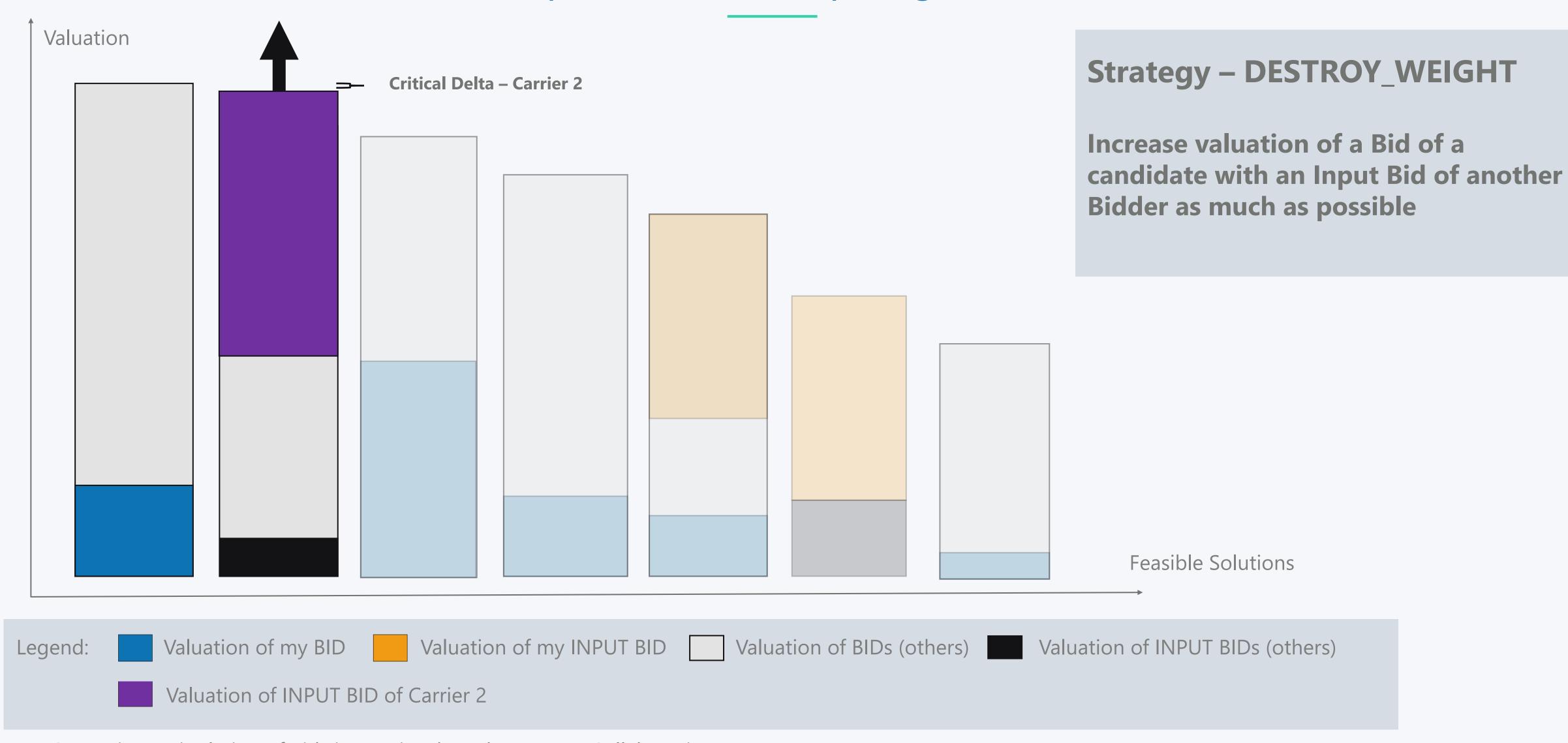
# Bidding Strategies for Critical Weight Profit Sharing Perspective of Conspiring Bidder





# Bidding Strategies for Critical Weight Profit Sharing Perspective of Conspiring Bidder





#### Bidding Strategies for Critical Weight Profit Sharing

### Perspective of Conspiring Bidder







#### Strategy - DESTROY\_WEIGHT

Increase valuation of a Bid of a candidate with an Input Bid of another Bidder as much as possible

#### For Bidder 1:

CD1 / (CD1 + CD2 + CD3) ~ **57%**→ (+) Increase of Collaboration Share

#### For Bidder 2:

CD2 / (CD1 + CD2 + CD3) ~ **0**%

→ (-) Decrease of Collaboration Share

#### For Bidder 3:

CD3 / (CD1 + CD2 + CD3) ~ **43**%

→ (+) Increase of Collaboration Share





#### **Conspiring Bidder Strategies**

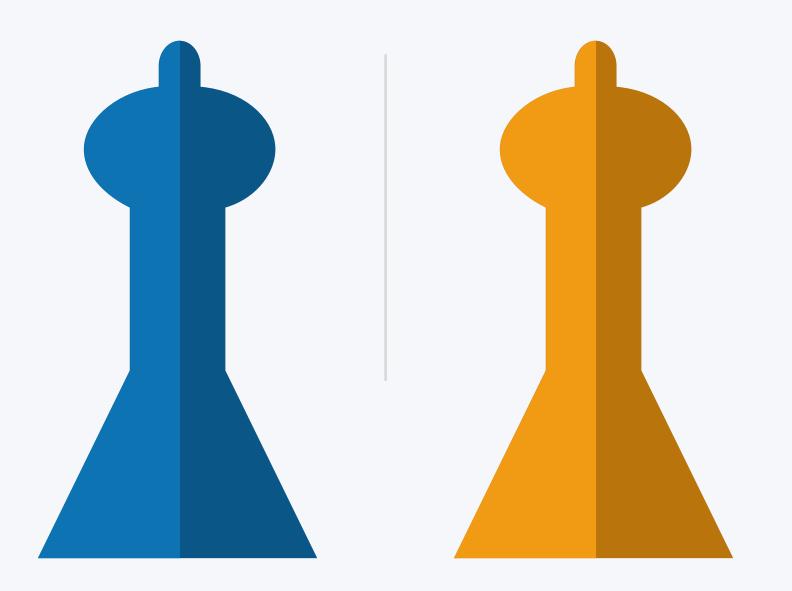
#### **Strategic Bidder Strategies**

#### INPUT\_MAX

Increase price of Input Bid

#### **DESTROY\_WEIGHT**

Increase prices of bids in the feasible solutions with an Input Bid of other carrier(s) as much as possible



#### INPUT\_MANIPULATION

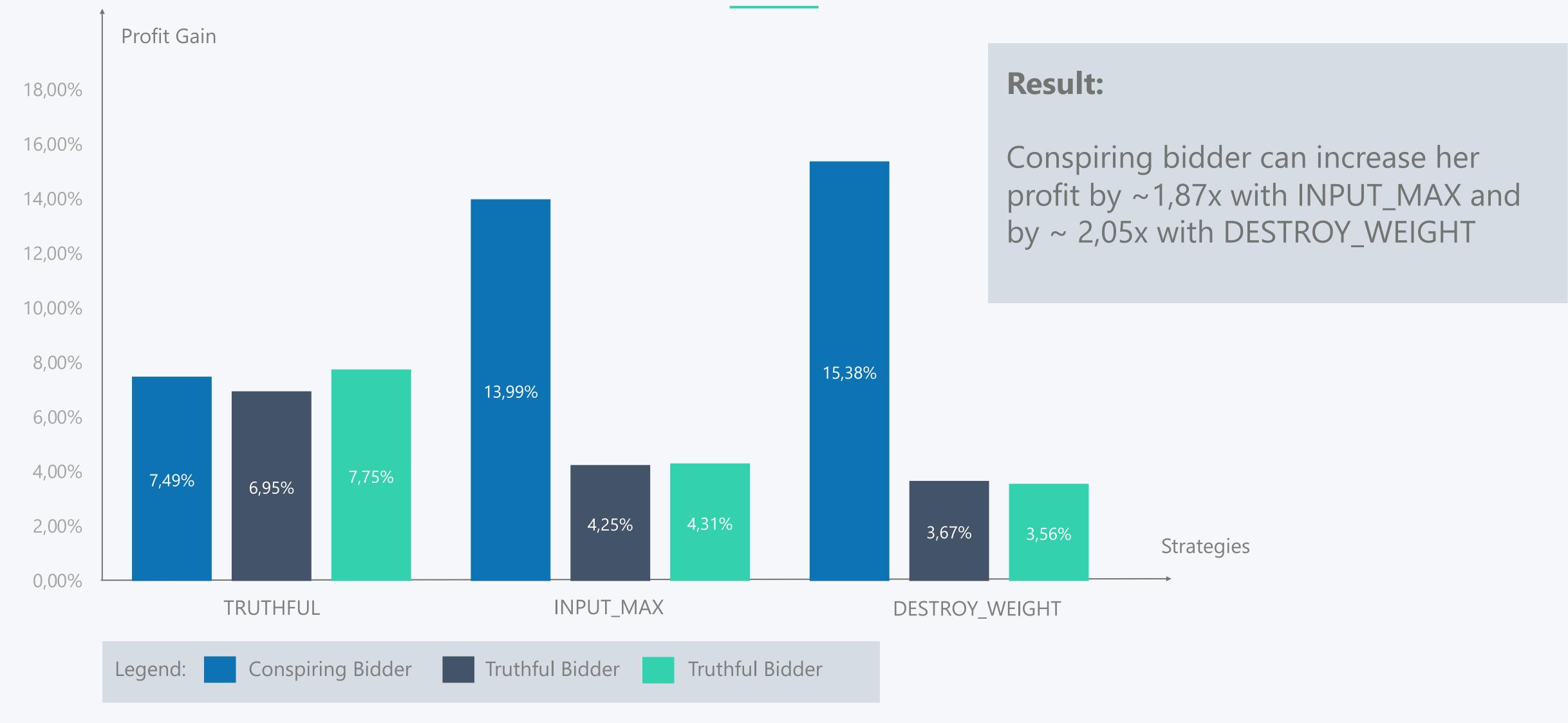
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#### BID\_MANIPULATION\_REL

Overbid or Underbid on all bids with a relative margin

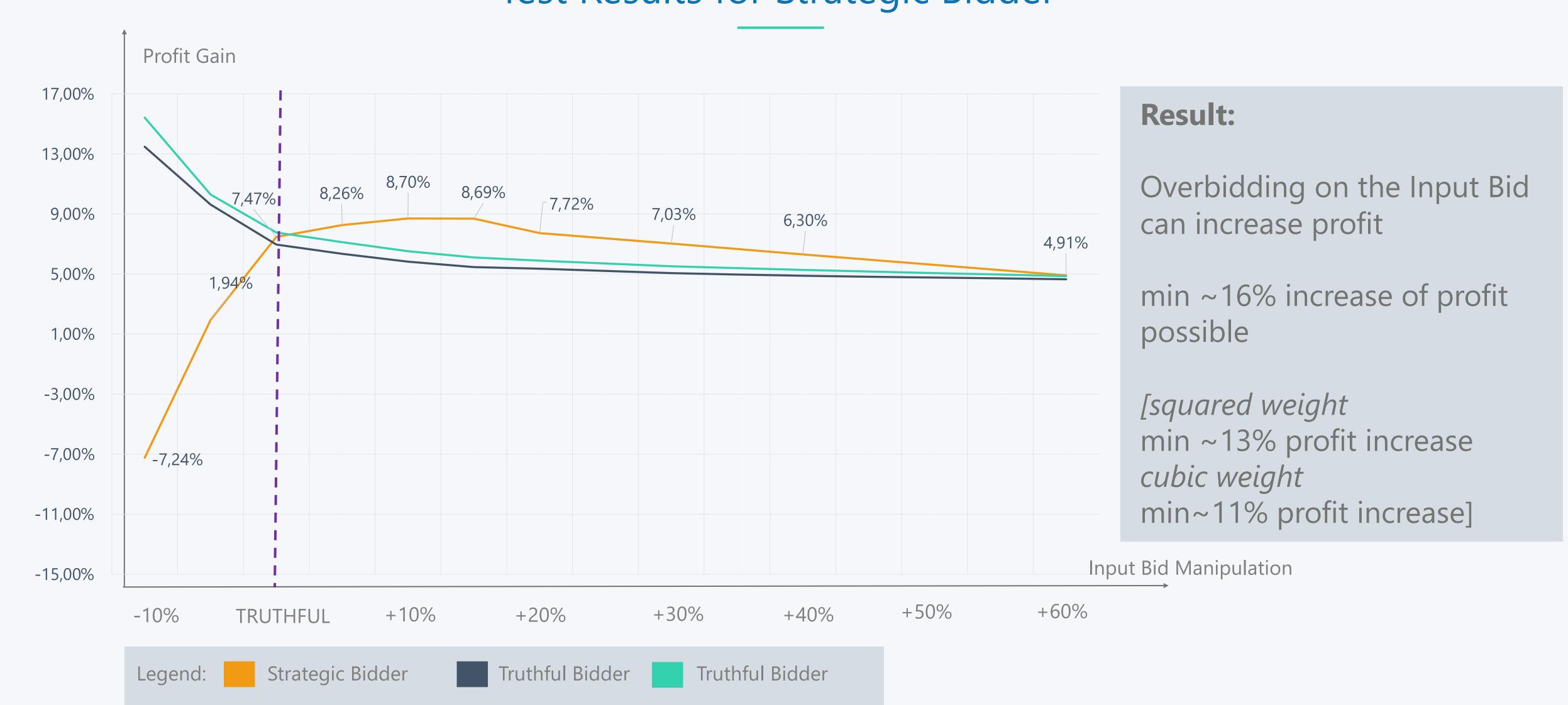
### Bidding Strategies for Critical Weight Profit Sharing Test Results for Conspiring Bidder





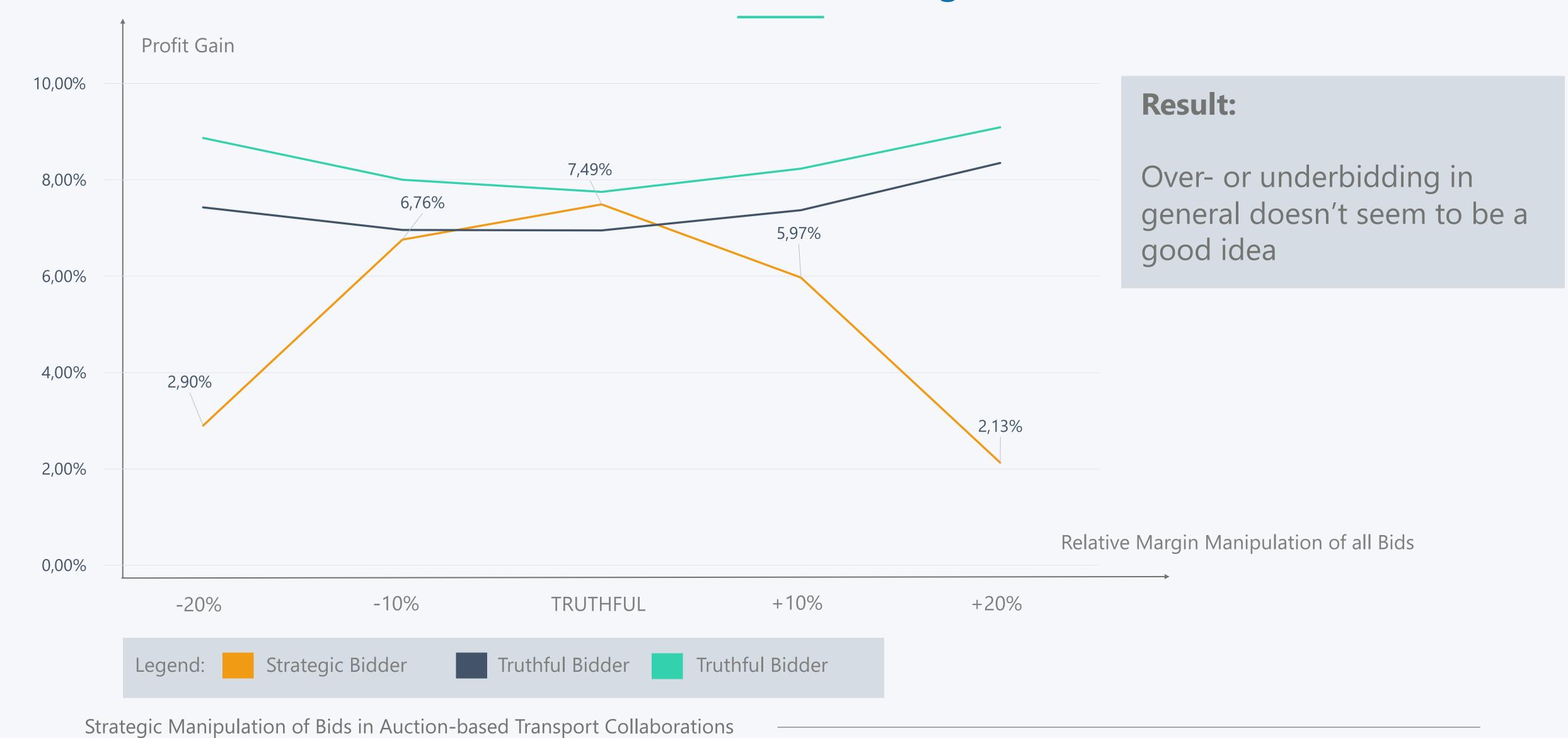
## Bidding Strategies for Critical Weight Profit Sharing Test Results for Strategic Bidder





# Bidding Strategies for Critical Weight Profit Sharing Simulation Results for Strategic Bidder





# Comparison of the analysed Profit Sharing Methods

#### Egalitarian

- computational efficient
- easy to understand
- could be considered unfair
- encourages overbidding the Input Bid

(Sidenote: Modified Egalitarian superior)

#### Purchase/Sale Weights

- computational efficient
- incentivizes contribution
- manipulable through overbidding

#### Shapley Value

- well-known economic formula
- desirable economic properties\*
- could be considered fair
- quite robust against strategic manipulation
- computational inefficient
- requires evaluation of all sub-coalitions

\* e.g., efficieny, symmetry, linearity, null player exclusion, anonymity etc.

See [9]

#### Critical Weights

- could be considered fair
- orobust against simple strategic manipulation
- no need to evaluate all sub-coalitions
- less easy to understand
- operation potentially vulnerable to complex strategies

See [9]

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Critical Weights

- could be considered fair
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<sup>\*</sup> e.g., efficieny, symmetry, linearity, null player exclusion, anonymity etc.

### Outlook

#### Potentially part of my Master Thesis

- Comparison of the Shapley Value and Critical Weight Profit Sharing for more than 3 carriers
- Research/Development of complex strategies for manipulating the Shapley Value or Critical Weight Profit Sharing

#### Further Research

- Evaluation of strategic behaviour during the request selection phase
- Evaluation/development of additional profit sharing methods
- Evaluation of various methods that approximate the Shapley Value
- Evaluation of equilibria and expected outcomes of a setting with multiple strategic carriers
- Strategic evaluation of payment methods that don't guarantee Individual Rationality
- Experimental analysis of strategic behaviour

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