

# What Can We Learn from Benefit Transfer Errors? Evidence from 20 Years of Research on Convergent Validity

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# Motivation

- U.S. Presidential Executive Order 12866 (1993) requires federal agencies to design “*cost-effective*” regulations, and assess “*costs and benefits*” based “*on the best reasonably obtainable scientific, technical, economic, and other information.*”
- The most common valuation method used to compute benefits and costs of environmental RIAs is a benefit transfer (U.S. EPA, 2010).
- An existing value estimate (or estimates) is transferred to a new policy application.

# Benefit Transfer Validity Discussed for Two Decades

- Benefit Transfers became a topic of academic interest in 1992 with a special issue of *Water Resources Research*.
- In 2005 U.S. EPA sponsored “a forum for informed discussion regarding the practice of benefits transfer ...” Presenters were from Australia, Canada, France Spain, Singapore, United Kingdom and United States.
- In 2006 *Ecological Economics* published a special issue on benefit transfer.

# Validity of Benefit Transfer

- Tests of convergent validity:
  - Function transfers more accurate than value transfers (Kirchhoff, Colby and LaFrance, 1997)
  - Similar study and policy cases (Johnston, 2007)
- Still no overall consensus in the literature:

*“The size, complexity and relative disorganization of the literature may represent an obstacle to the use of updated methods by practitioners”* Johnston and Rosenberger (2009).

# Objectives

- Identify benefit-transfer practices that enhance or diminish the accuracy of benefit transfers using meta-analysis
- Review all benefit transfer validity studies conducted over the past 20 years
- Estimate meta-regression
  - Manski's (2007) "*bottom-up*" approach
  - Non-parametric regression - *robust*
  - Parametric regression – *specific predictions*

# Conceptual Framework

- Willingness to pay for improved quality:

$$V_{ij} \left( p_j, x_j, q_j^1, M_i - wtp_{ij}; \alpha_i, d_i \right) = V_{ij} \left( p_j, x_j, q_j^0, M_i; \alpha_i, d_i \right)$$

- Benefit transfer error:

$$BTE = \hat{wtp}_{i,j}^t - \hat{wtp}_{i,j}^p$$

Study case “t”	Policy case “p”
Transferred value	Original value

# Convergent Validity Error

- Accuracy measurements:

$$|\% \text{ Transfer error}| = \left| \left( \frac{\hat{wtp}^t}{\hat{wtp}^p} - 1 \right) \times 100 \right|$$

- Meta-analysis equation:

$$y = m(x) + \varepsilon$$

$y$  – |%Transfer Error|

$x$  – Benefit-transfer variables ( $q, \alpha, d, v, t$ )

# Non-Parametric Analysis

- Ouyang, Li and Racine (2009) - NP estimator for discrete regressors:

$$\hat{f}(x) = \frac{\sum_{i=1}^n Y_i L(X_i, x, \lambda)}{\sum_{i=1}^n L(X_i, x, \lambda)}$$

$L$  is the product kernel and  $\lambda$  are the bandwidths associated with regressors.



# Parametric Analysis

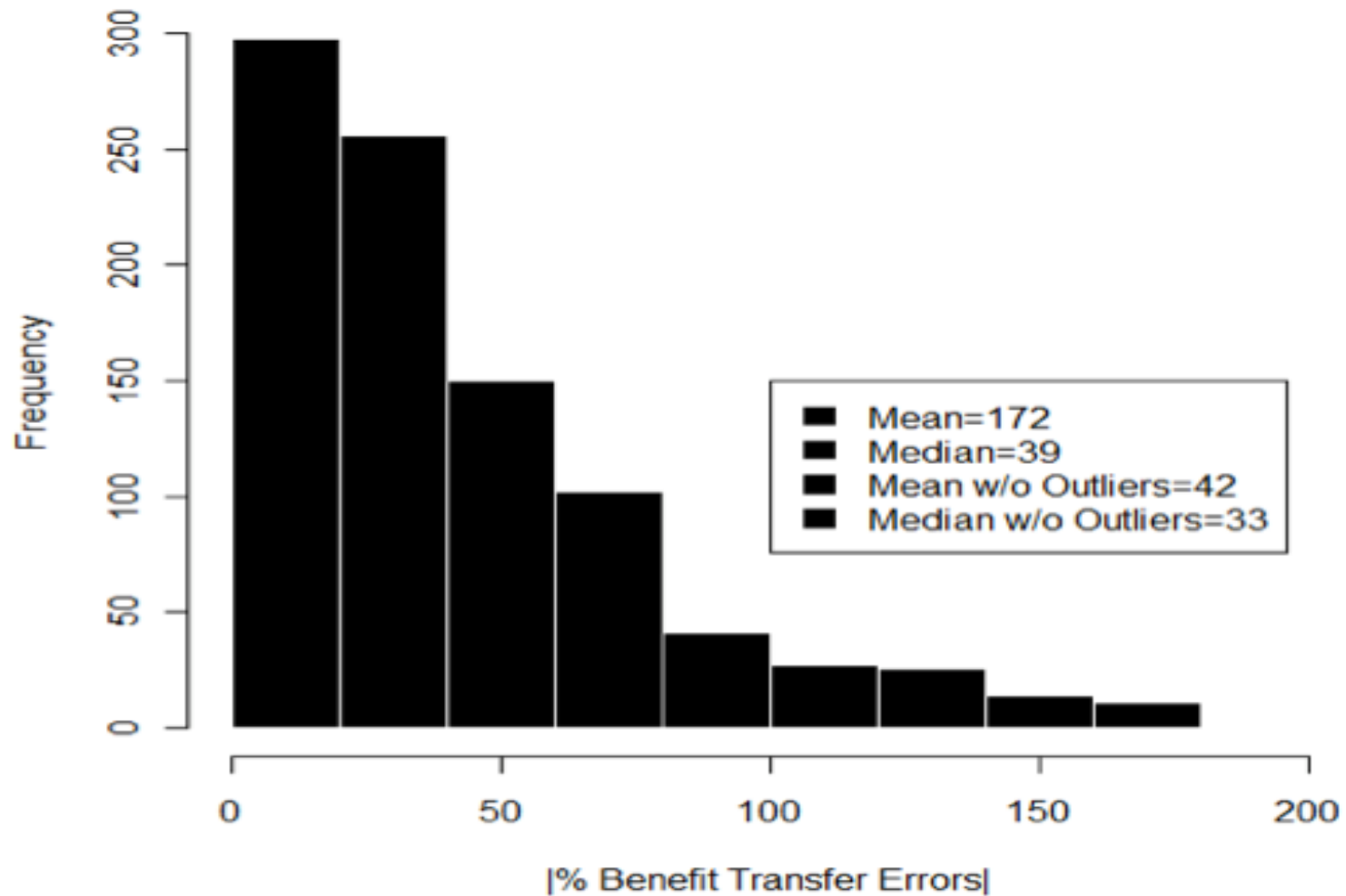
- WLS –  $k_i$  where  $i=1,2,\dots,31$  and is the number of observations from study  $i$
- Outliers in %TE detected using Inter Quartile Range criterion
- IQR -  $x$  is an outlier if:

$$Q_1 - 1.5 \times IQR > x > Q_3 + 1.5 \times IQR$$

# Data

- Identified 40 BT validity studies (1990 – 2009).
  - 9 studies were excluded
    - non- peer reviewed (2), duplicate (1), could not code data (1), hedonic model (1), hedonic and could not code data (1), and missing data (3)
- Uniform protocol for coding BTE and modeling decisions. Coding by undergraduate and graduate research assistants
- Excluded flip error calculations
- $N = 1071$                        $N$  (w/out outliers) = 925

# Distribution w/o Outliers



**Outliers = 14%**

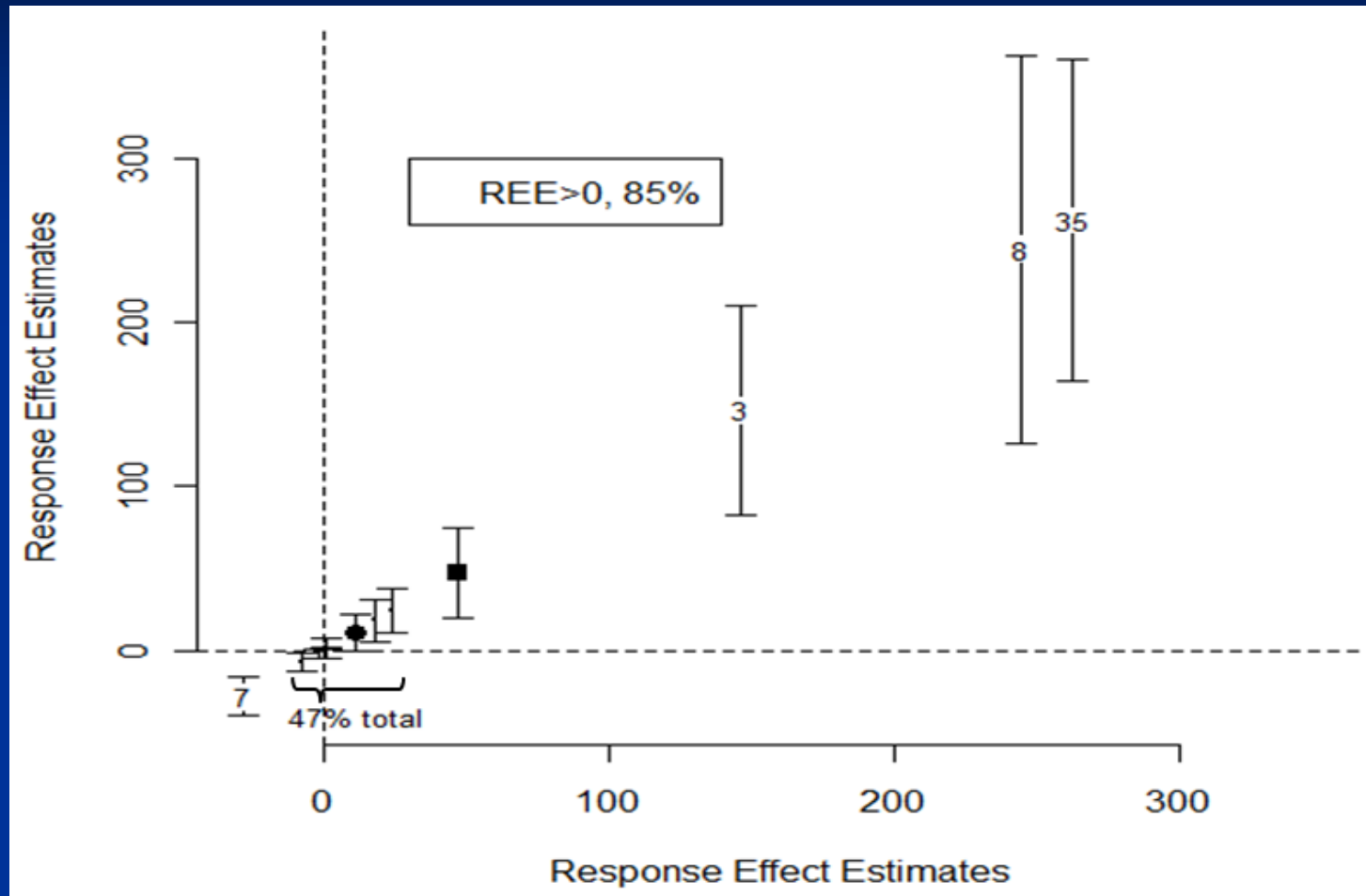
# Independent Variables

	<i>Variable</i>	<i>Mean</i>
<i>q variables</i>	Policy Change	0.24
	Quality Change	0.51
	Use Value	0.66
<i>d variables</i>	Population	0.09
	Study Area	0.18
<i>v variables</i>	META (omitted)	0.17
	RUM	0.11
	TC	0.12
	CV	0.29
	CM	0.31
<i>t variables</i>	Value Transfer	0.38
	Multiple Study	0.27
	Mean Value	0.15

# NP & Parametric Results

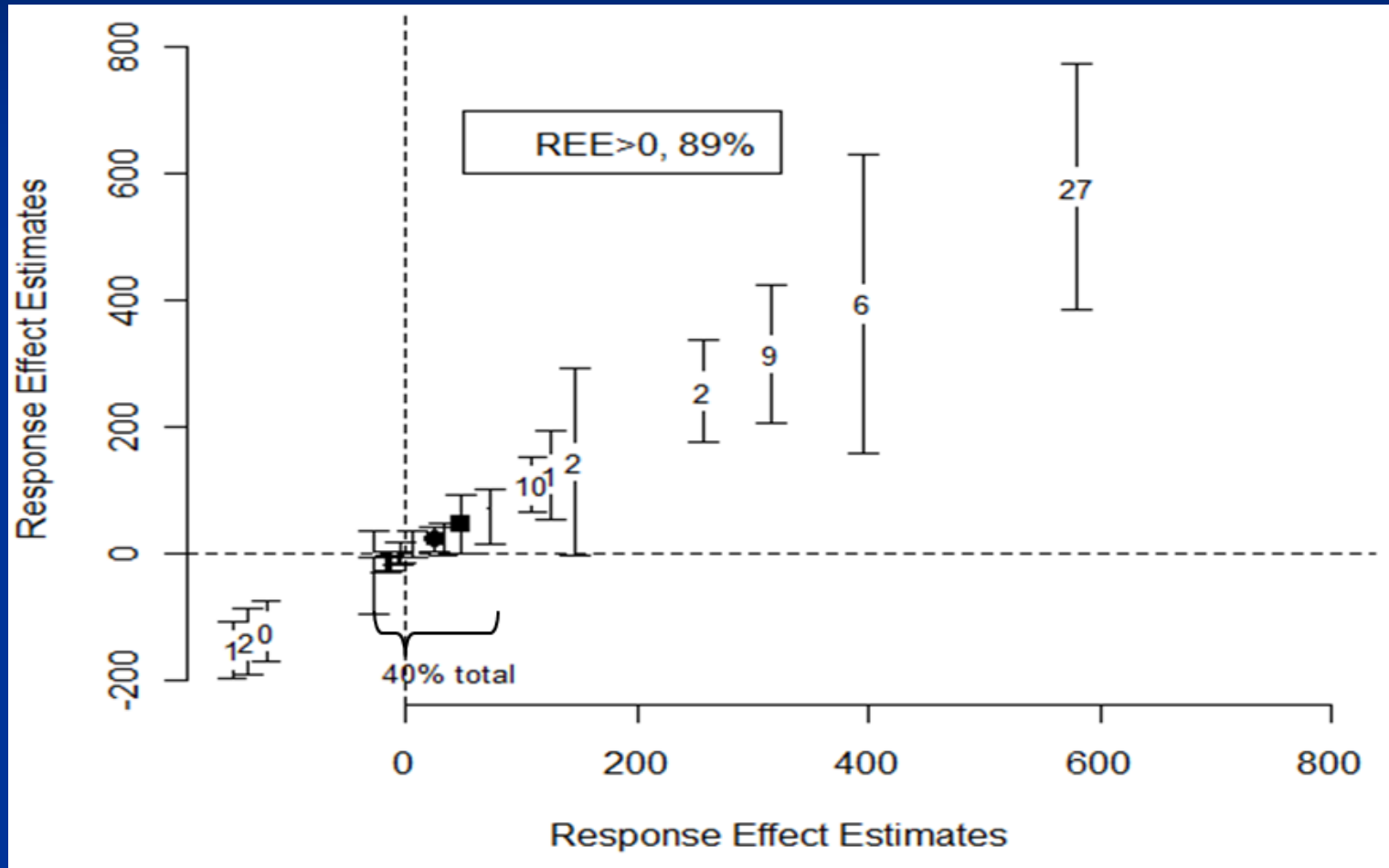
	Band Width w/o Outliers	NP Mean	WLS w/o Outliers
Intercept	NA	NA	74.5
Policy Change (-)	0.11	258.5	-3.19
Quality Change (+)	0.00	233.2	24.50
Use Value (-)	1.00	0.0	9.93
Population (-)	0.96	-0.1	19.80
Study Area (-)	0.05	62.1	-11.45
RUM (?)	1.00	0.0	-56.05
TC (?)	0.00	13.5	-74.05
CV (?)	0.95	-0.4	-66.97
CM (?)	0.04	220.5	-26.35
Value Transfer (+)	0.34	115.3	11.21
Multiple Study (-)	0.01	-0.7	-13.28
Mean Value (0)	0.02	0.9	-10.61

# Response Effect Estimates Value Transfer

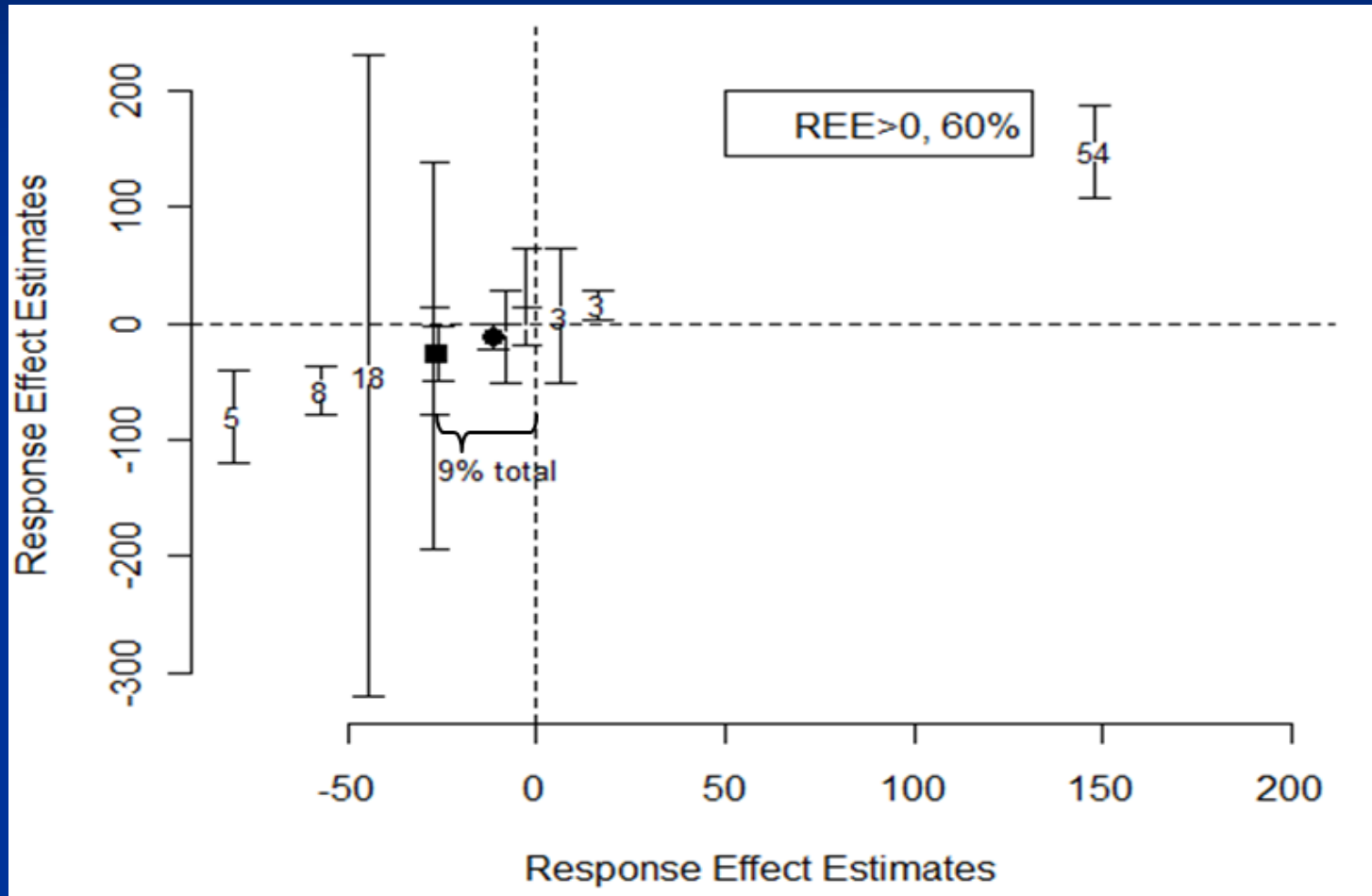


- WLS w Outliers
- WLS w/o Outliers

# Quality $\Delta$

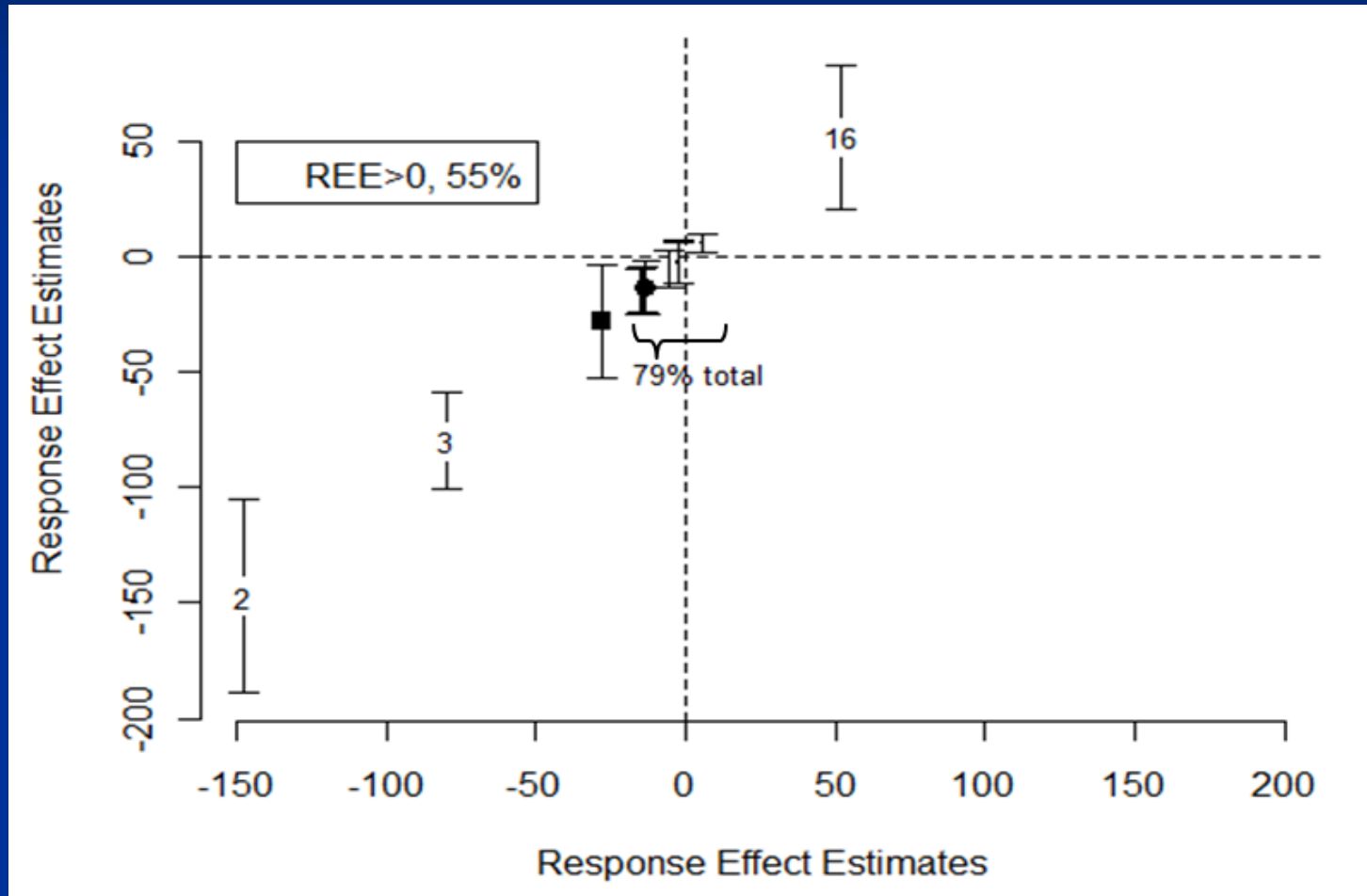


# Study Area





# Multiple Study



# Conclusions

- *Existing stylized facts:*
  - Function transfers outperform value transfers
  - Geographical similarity improves accuracy of value transfers
- *New stylized facts:*
  - Quality changes less accurate than quantity changes
  - Data from multiple studies improves function transfers
- *Novel approach to Meta-analysis*
  - parametric point estimates desirable but investigate robustness using NP methodology

# Comparisons

## ■ *Comparisons to stated-preference errors:*

	Stated Preferences (Murphy et al., 2005)	Benefit Transfer	Benefit Transfers w/out outliers
Median	35%	39%	33%
Mean	160%	172%	42%
Maximum	240%	7496%	172%

## ■ *Comparison to market data errors:*

- Single price change, Marshallian elasticities - error is 3% for compensating variation and 32 % for deadweight loss (Hausman, 1981).
- Average commercial real estate appraisal error is 11% (90% → 0-25%) (Fisher, Miles and Webb, 1999).

**Benefit transfers are not as challenging as trying to make a silk purse from a sow's ear, but there is still room for much improvement in methodological procedures and documentation to support benefit-cost calculations.**



# Future BT Validity Studies

- Credibility of future BTs – Data Validation!!
- Documentation protocol
  - Transfer procedures
  - Criteria for selecting policy and study cases
  - Uniform standard for reporting errors
- Beyond reporting errors – investigate why some errors are so large?



# Transfers of Economic Information are Common Practice

- Hines (1999) notes that “... to quantify the economic costs of (taxes, regulations, externalities, monopolistic practices, etc.) ... it is standard practice – and has been since the 1960s – to use a small number of assumptions and selected elasticities to estimate areas of the relevant ‘Harberger triangles’ ” (p. 167).
- The Economic Report of the President (2009) includes net benefits of federal policies to improve air quality based on benefit-transfer estimates (e.g., U.S. EPA, 2005, p. 4-48, Table 4-11).

# *U.S. EPA Guidelines for Preparing Economic Analyses (2010)*

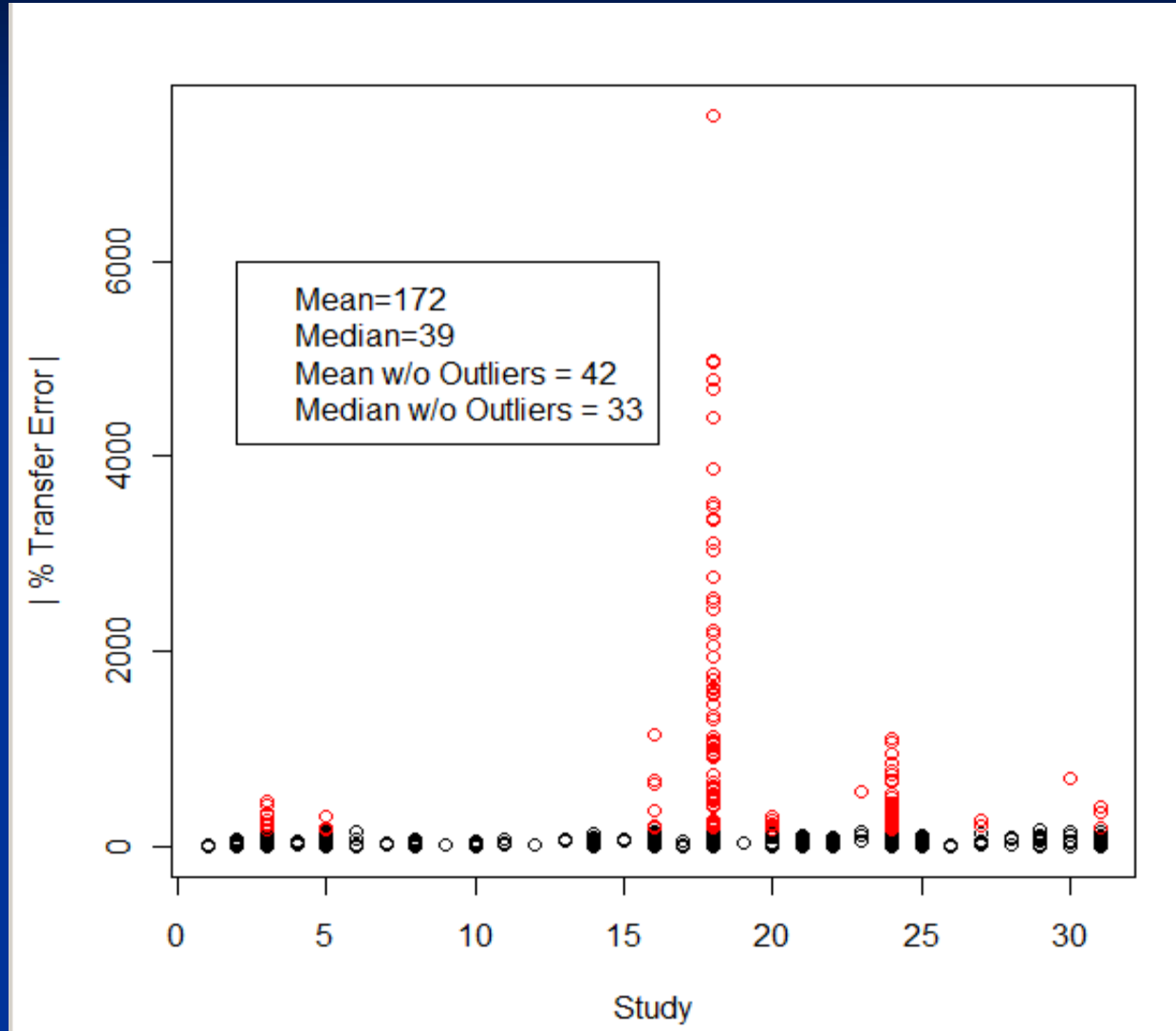
- Study case(s) → Policy Case
- Steps:
  - Describe the policy case,
  - Select study cases,
  - Transfer values, and
  - Report the results.
- Implementation:
  - Direct value transfer, or
  - Function transfer.



# How Accurate are Benefit Transfers? ... but more, what can we learn?



# Outliers



146 outliers detected using IQR criterion.

# Nonparametric Results

	Band Width	NP Mean
Intercept	NA	NA
Policy Change (-)	0.11	258.5
Quality Change (+)	0.00	233.2
Use Value (-)	1.00	0.0
Population (-)	0.96	-0.1
Study Area (-)	0.05	62.1
RUM (?)	1.00	0.0
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CM (?)	0.04	220.5
Value Transfer (+)	0.34	115.3
Multiple Study (-)	0.01	-0.7
Mean Value (0)	0.02	0.9