



# THE STRUCTURING OF AIR SOURCE HEAT PUMPS' PRICES IN A RETROFITTING RESIDENTIAL BUILDINGS MARKET: WHAT DID I PAY FOR?

D.Osso, S.Nösperger, R.Raynaud,  
M-H.Laurent, C.Grandclément, A.Tricoire

ECEEE Summer Study - June 2017



PROFIL

This work is part of the research programme PROFIL which is supported by the French national energy agency ADEME (grant number 1510C0040).

The sole responsibility for the content of this publication lies with the authors. It does not necessarily reflect the opinion of their affiliations.

# TABLE OF CONTENTS

## **1. INTRODUCTION**

USING THE MARKET TO ENCOURAGE HOME-OWNERS TO RETROFIT  
BUT WHAT DOES THE PRICE MEAN?

## **2. CASE STUDY**

AIR AND WATER AIR SOURCE HEAT PUMP

## **3. METHODOLOGY**

STATISTICAL ANALYSIS

## **4. ASHP RESULTS**

THE EFFECTS OBSERVED

## **5. CONCLUSION**

UNDERSTANDING THE EFFECTS  
THE MISUNDERSTANDING LAST  
THE VALUE CHAIN OF ASHP

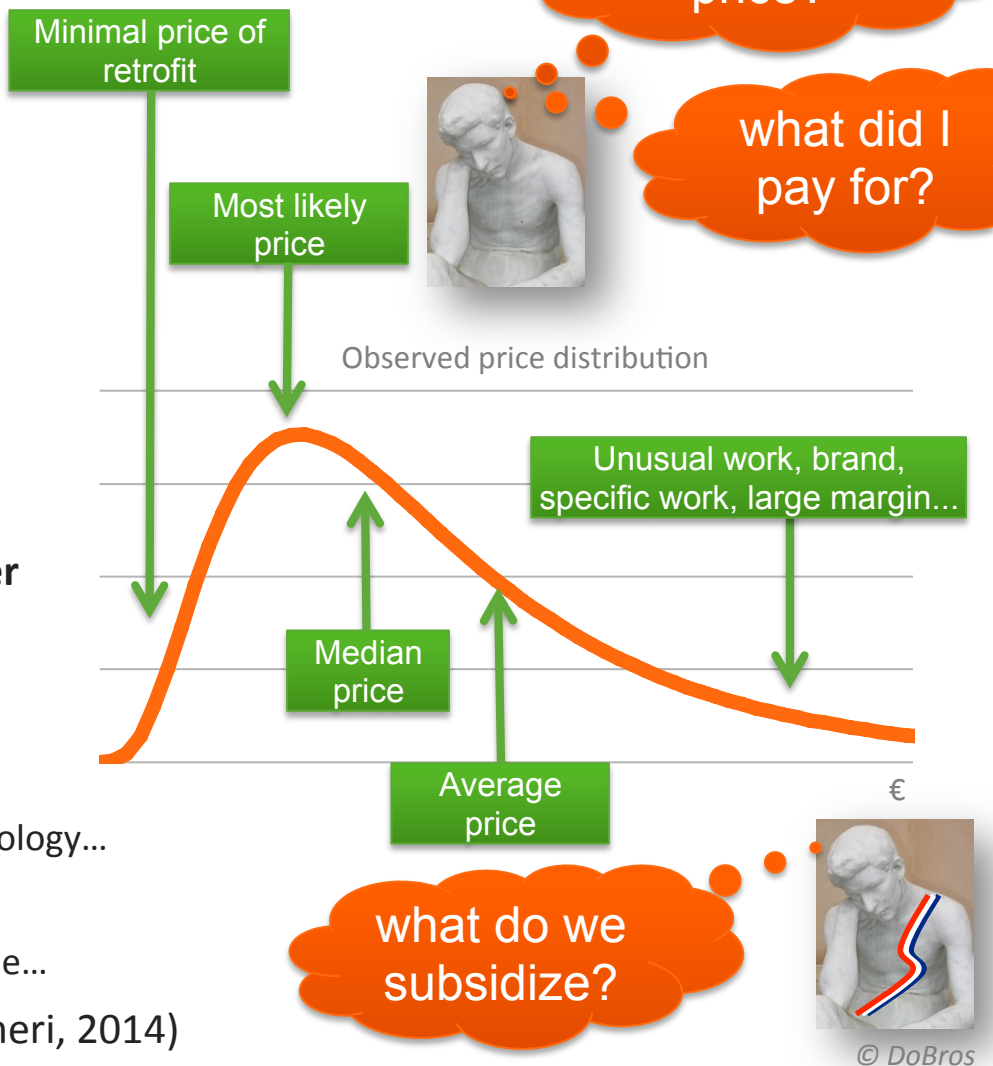
# USING THE MARKET TO ENCOURAGE HOME-OWNERS TO RETROFIT : WHAT DOES THE PRICE MEAN?

## Price incentives to home-owners

- Incentive based on up-front cost -  $f(\text{€})$ 
  - Tax credit (*CITE in France*)
  - Soft-loan (*Eco-PTZ in France*)
- Incentive based on energy savings -  $f(\text{kWh})$ 
  - Energy Efficiency Obligation (EEO) (*CEE in France*)

## What does the price mean to the decision-maker

- Higher price equal higher energy efficiency?
- Higher price equal higher quality?
- Technical reasons for deviation
  - Complexity of work, risk linked to innovative technology...
- Economic reasons for deviation
  - difference in labour cost, company size, brand name...
- « Unexplained cost » in previous study (In Numeri, 2014)



# AIR-SOURCE HEAT PUMP (ASHP)

- Air-to-water heat pump (w-ASHP)
- Air-to-air heat pump (a-ASHP)

## ■ Invoice analysis: two complementary approaches

- Detailed analysis w/ a limited sample [technical perspective]
  - Energy performance, installed power...
- Limited analysis w/ a large sample [economic perspective]
  - Company's structure and activity...
- Complementary databases [regional data]
  - Median income, regional added value...



ASHP type	Sample type	Sample size	Median price of work (in € ex. VAT)	absolute maximum difference (AMD*)	relative interquartile coefficient (RIC**)
a-ASHP	economic	7,181	3,733	10.9%	1.11
	technical	192	4,141		1.12
w-ASHP	economic	1,720	13,211	0.3 %	0.49
	technical	167	13,165		0.49

\*AMD= |(P\_main-P\_subsample)|/Min(P\_main,P\_subsample). The calculation of the maximum absolute difference maximises the error between the two estimates.

\*\*RIC=  $(X_{\downarrow q3} - X_{\downarrow q1}) / \text{median } X$

# ANALYSIS OF COVARIANCE (ANCOVA)

statistical  
ancova  
sample  
effect  
data  
trend  
mean  
distribution  
interpretation  
median

- Data cleaning
  - Outliers removed, explained variable log-transformed
- General linear model which blends ANOVA and regression
  - “all other things being equal” approach

Price (€ or €/m<sup>2</sup>)

m<sup>2</sup>, kW, unit...

$$\log(\text{explained variable}) = A + \sum_{j=1}^N a_j * (\text{quantitative variable})_j + \sum_{k=1}^N \sum_{l=1}^m b_{kl} * (\text{qualitative variable})_k \text{ modality } l + \varepsilon$$

error

climate zone, NACE activity, workforce, brand...

Qualitative data reference: zero sum of the coefficients  $b_{kl}$  of the different modalities (ie  $\sum(b_{kl})=0$  with  $l=1,...,m_l$ )

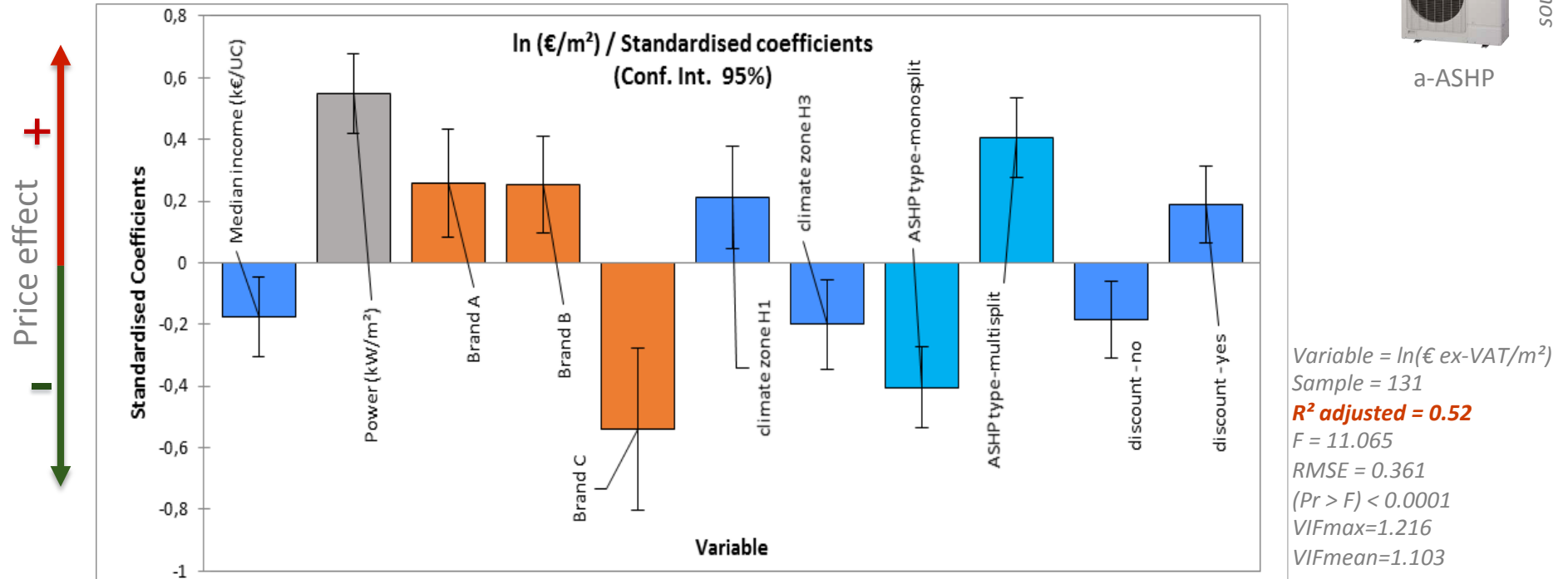
$$\text{explained variable} = e^A * \text{quantitative variable}^a * e^{\text{qualitative variable}^b}$$



# A-ASHP – TECHNICAL SUBSAMPLE

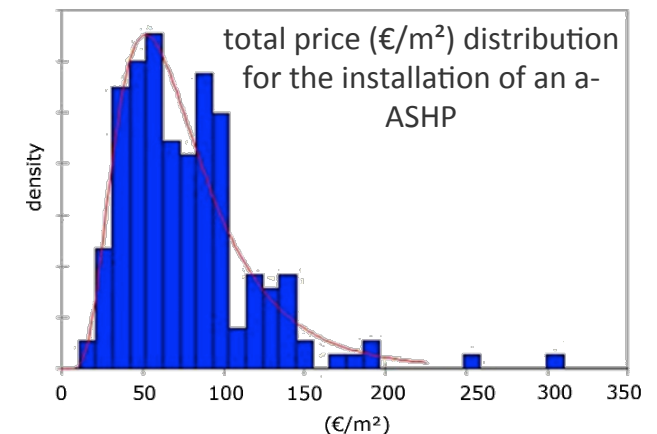


Standardised coefficients of the ANCOVA model of the price (in € ex-VAT/m<sup>2</sup>)



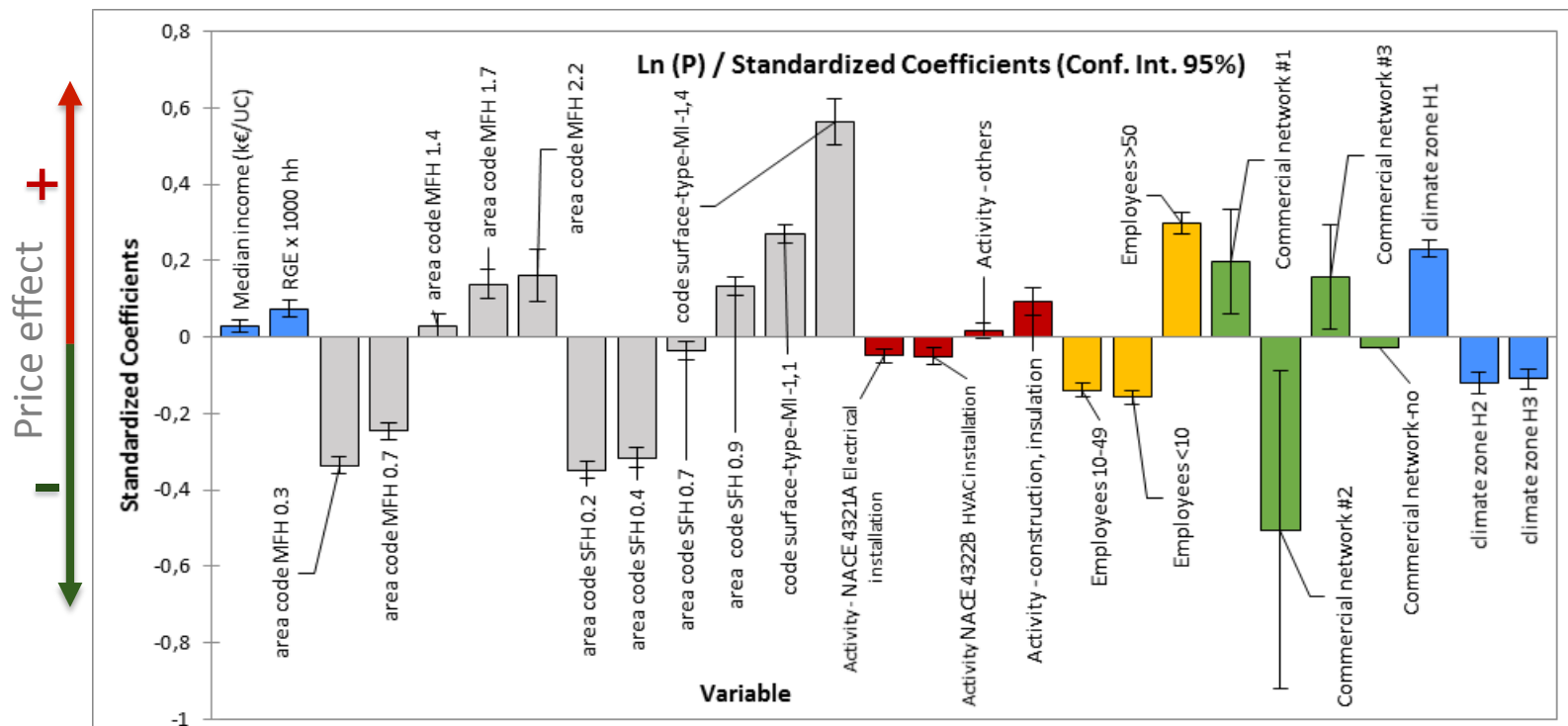
Observed effect:

- ✓ Installed power (kW/m<sup>2</sup>)
- ✓ a-ASHP type (mono- vs. multi-split)
- ✓ Geoclimatic zone (cold, mild, warm)
- ✓ Median income in the municipality
- ✓ Brand
- ✓ Discount



# A-ASHP – MAIN SAMPLE

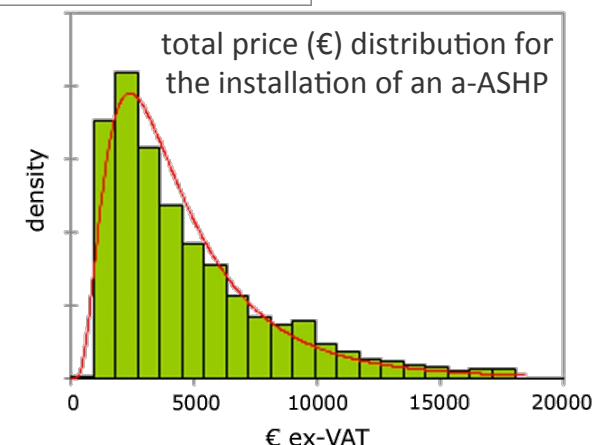
Standardised coefficients of the ANCOVA model of the price (in € ex-VAT)



Variable =  $\ln(\text{€ ex-VAT})$   
 Sample = 7,181  
 **$R^2$  adjusted = 0.53**  
 $F = 293.469$   
 $RMSE = 0.462$   
 $(Pr > F) < 0.0001$   
 $VIF_{max} = 2.172$   
 $VIF_{mean} = 1.145$

Observed effect:

- ✓ Geoclimatic zone (cold, mild, warm)
- ✓ Median income in the municipality
- ✓ Regional labelled companies
- ✓ Activity (NACE)
- ✓ Number of employees
- ✓ Commercial network
- ✓ Type and area of dwelling

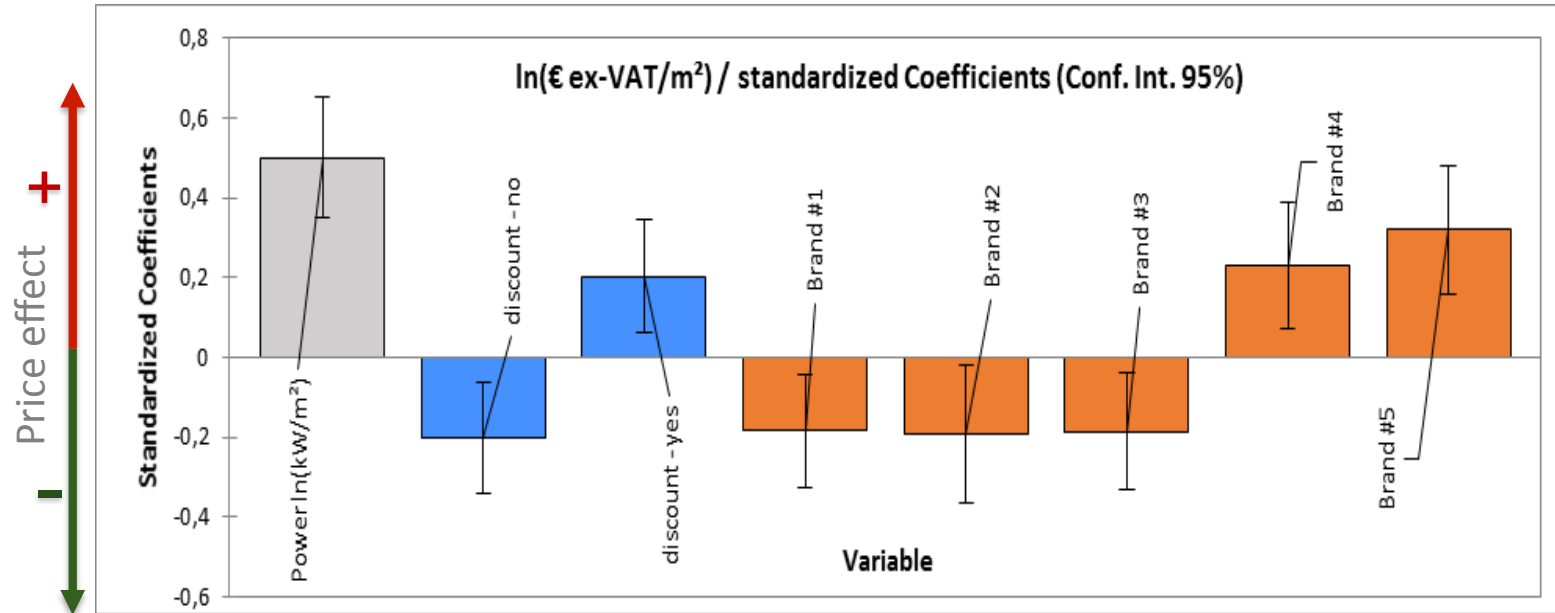


a-ASHP

source: Atlantic

# W-ASHP – TECHNICAL SUBSAMPLE

Standardised coefficients of the ANCOVA model of the price (in € ex-VAT/m<sup>2</sup>)



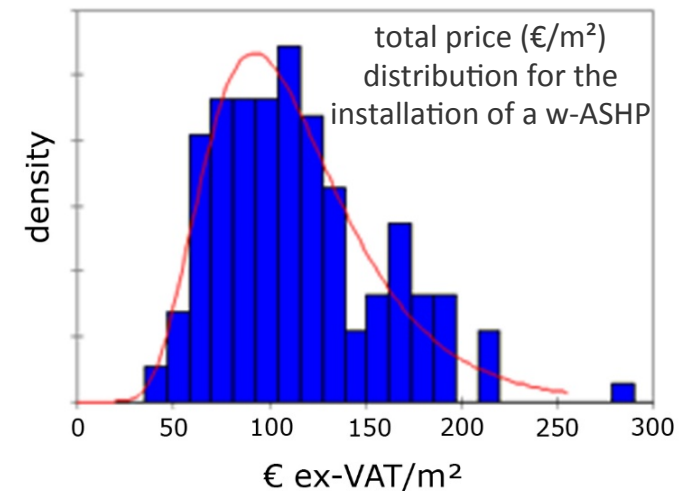
Variable = ln(€ ex-VAT/m<sup>2</sup>)  
Sample = 134  
**R<sup>2</sup> adjusted = 0.45**  
F = 7.396  
RMSE = 0.263  
(Pr > F) < 0.0001  
VIFmax=1.438  
VIFmean=1.076

Observed effect:

- ✓ Installed power (kW/m<sup>2</sup>)
- ✓ Brand
- ✓ Discount

Sample limit:

- ✓ W\_ASHP only in SFH
- ✓ Only in cold climate zone

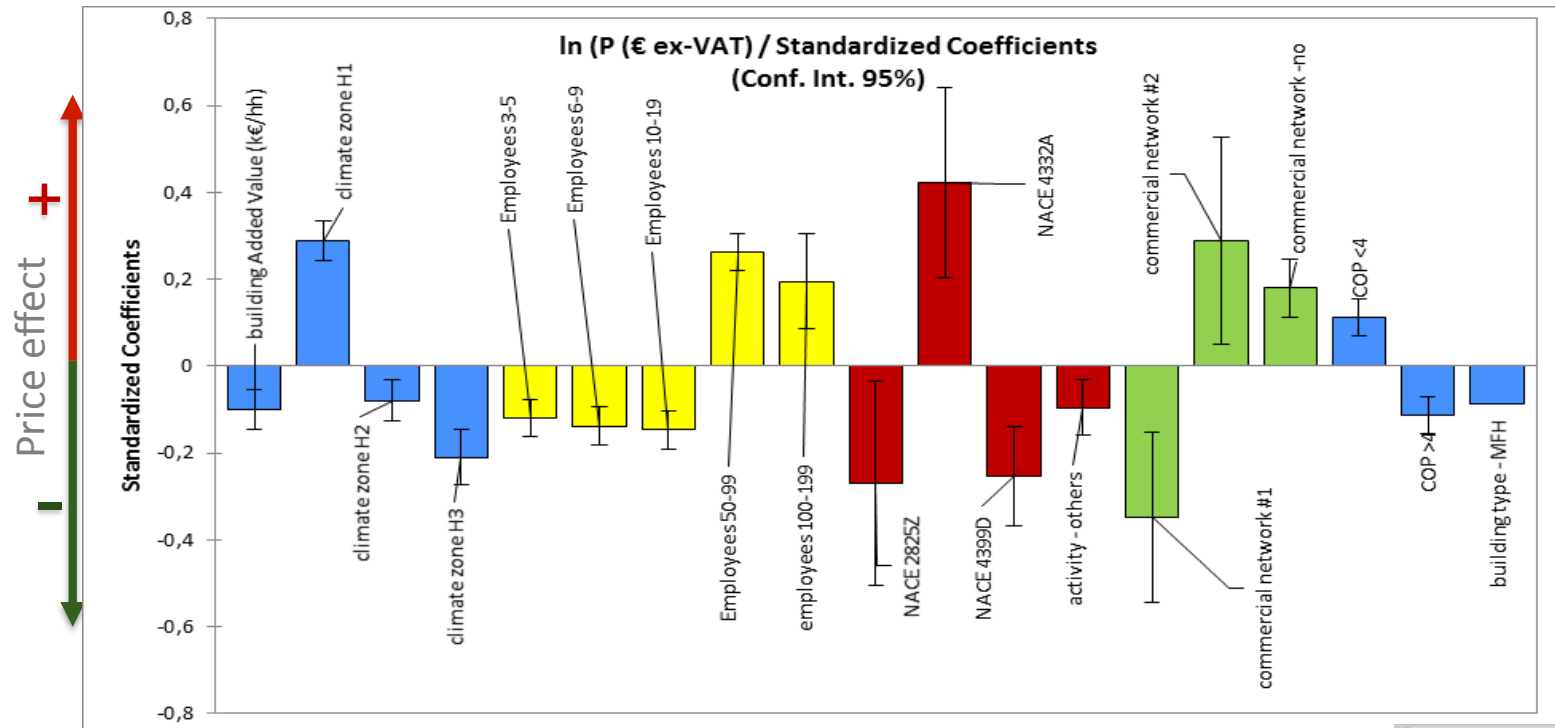




# W-ASHP – MAIN SAMPLE



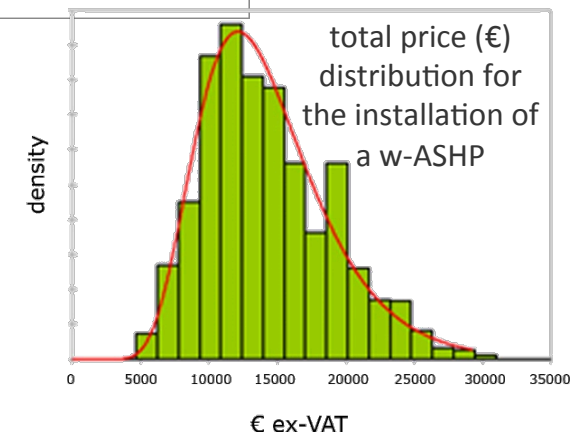
Standardised coefficients of the ANCOVA model of the price (in € ex-VAT)



Variable =  $\ln(\text{€ ex-VAT})$   
 Sample = 1,720  
 **$R^2$  adjusted = 0.35**  
 $F = 29.707$   
 $RMSE = 0.266$   
 $(Pr > F) < 0.0001$   
 $VIF_{max} = 2.165$   
 $VIF_{mean} = 1.274$

Observed effect:

- ✓ Geoclimatic zone (cold, mild, warm)
- ✓ Number of employees
- ✓ Activity (NACE)
- ✓ Commercial network
- ✓ Efficiency
- ✓ Regional added value of the building sector



# CONCLUSION – UNDERSTANDING THE EFFECTS

## ■ Technical variable

- Installed output of thermal equipment (kW/m<sup>2</sup>): upward effect - energy demand
- Living area (m<sup>2</sup>): downward effect due to fixed cost – scale effect

## ■ Socio-economic variables

- Geoclimatic zones (cold, mild, warm): willingness to pay to decrease one's energy bill is more valued in the cold zone than in the warm zone (upward effect in cold zone)
- Regional economic data: small upward or downward effects - difficult to interpret

## ■ micro-economic variables

- Brand effect: public bodies subsidizing marketing position of companies -> conditional subsidy scheme (Laurent et al., ECEEE 2011)
- Commercial network: upward or downward effect - difficult to interpret
- Company workforce: upward effect – overhead cost
- Sector of activity: upward effect of companies practicing an activity other than the ones linked to the retrofit - risk covering

# WHAT DOES THE PRICE OF RETROFIT WORKS MEAN? SOME LASTING UNKNOWNNS

The explained price variation is limited ( $R^2 < 0.5$ )

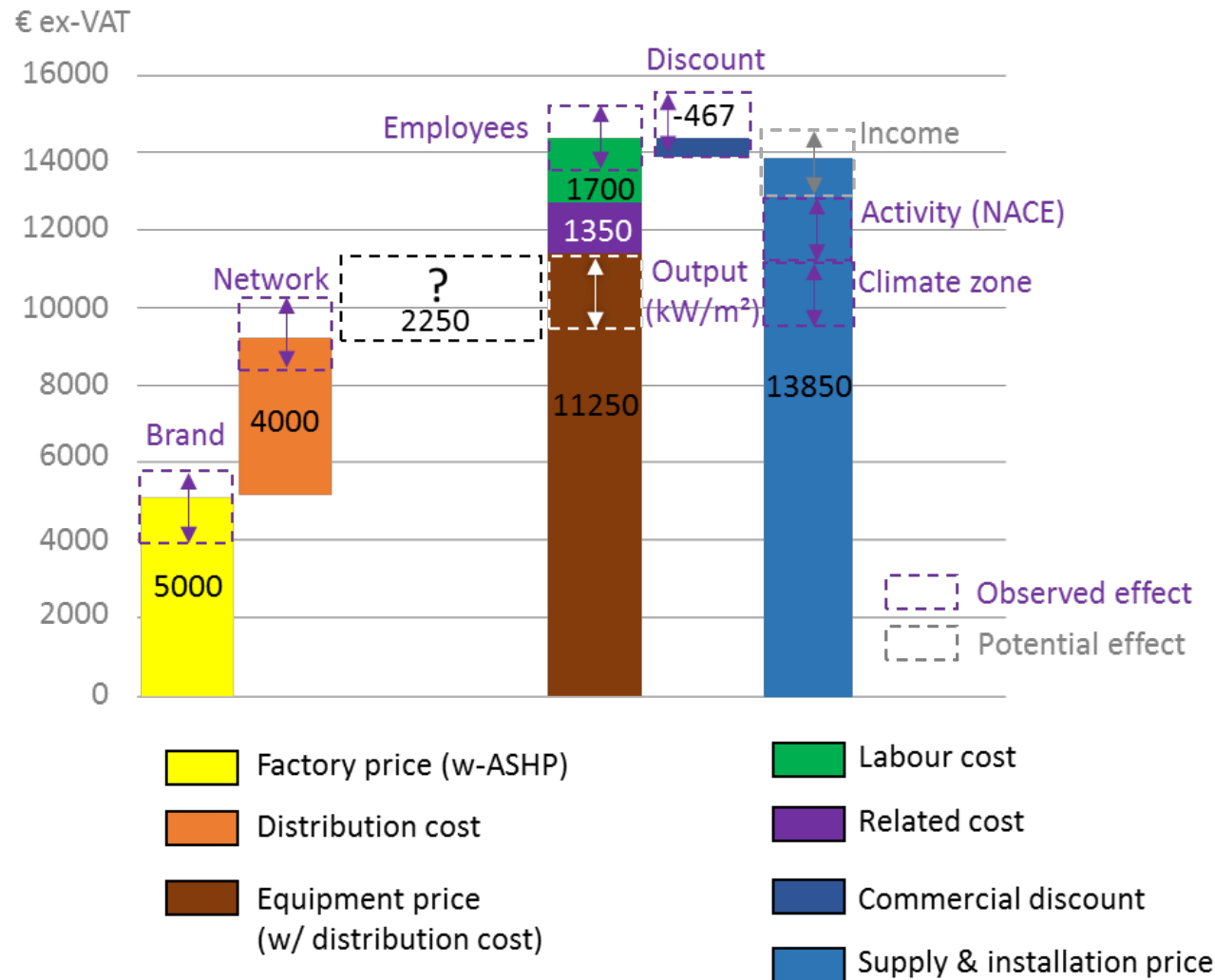
The extremes of the price distribution should be explained in order to better understand the reasons of them:

- **low prices**: low quality, investment costs adapted to low income households, efficient structure of company or business model?
- **high prices**: overcharging and marketing position, complex retrofit or inadequate business model?

As numerous observed effects are not totally explained, especially the type of **commercial network** associated with the lower prices, further study in order to explain the observed downward effects should be realised

# FINAL CONCLUSION – W-ASHP VALUE CHAIN

Distribution of the total market value between distribution and installation\*



\*Adapted from (In numeri, 2014) "Markets and jobs related to energy efficiency and renewable energies: situation 2012 2013 and short-term prospects"



# Thanks



**Dominique OSSO**

EDF – EDF Lab

TREE – Technology & Research for Energy Efficiency

Route des Renardières

F-77818 Moret Loing et Orvanne

[dominique.osso@edf.fr](mailto:dominique.osso@edf.fr)

