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# **The Value of Patent Portfolios: Numbers vs Average Quality**

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# *Quick agenda*

- A survey-based measure of patent value (PatVal-EU 1 & 2)
- Features, checks and curiosities about the distribution
- Portfolios of technically-related patents
  - Numbers (size of portfolio; individual vs related patents?)
  - Distribution
- Determinants of number vs average value?

# *Value of Patents?*

- Many approaches
  - Renewal fees (Schankerman and Pakes, 1986)
  - Citations (Trajtenberg, 1990)
  - Multiple indicators (Lanjouw & Schankerman, 2004)
  - Impact on market value of firms (Hall et al. 2005)
  - Commercial transfer of patent rights (Serrano, 2010)

# *Our approach – survey measure*

- Following Scherer & Harhoff (2000), we ask
  - *Suppose that on the day at which this patent was granted, the applicant had all the information about the value of the patent that is available today. In case a potential competitor of the applicant was interested in buying the patent, what would be the minimum price (in Euro) the applicant should demand?*
- Menu of intervals: < 30K€; 30-100k€; ...; to > 300M€

# *Patent Portfolio – N, V*

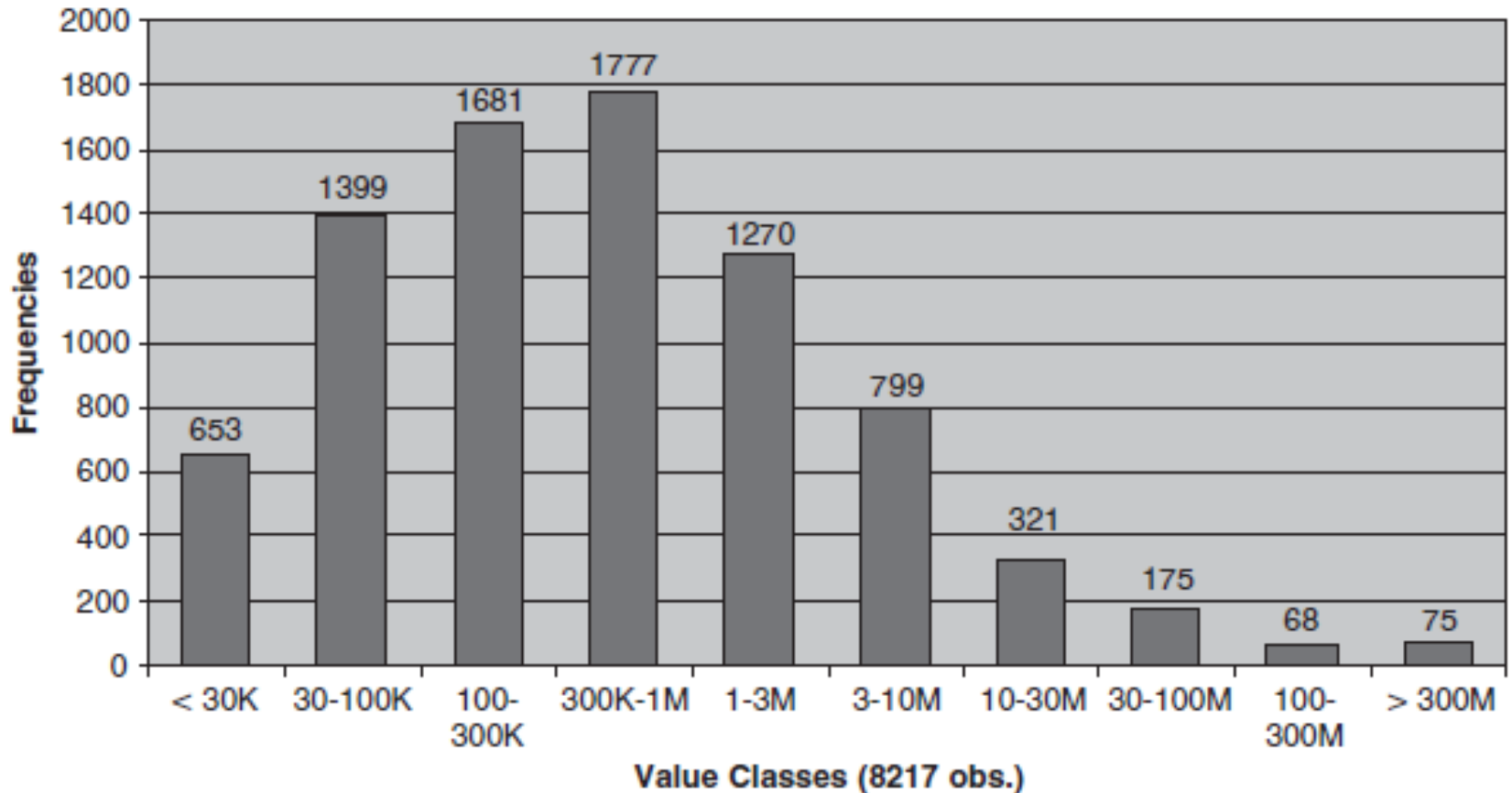
- We also ask
  - *“How many patents in this portfolio”?*
  - Define portfolio: “group of patents related technically or in value”
  - Menu: 1; 2-5; 6-10; 11-20; > 20
- ... and we ask the value question for the portfolio

# *PatVal- EU Surveys*

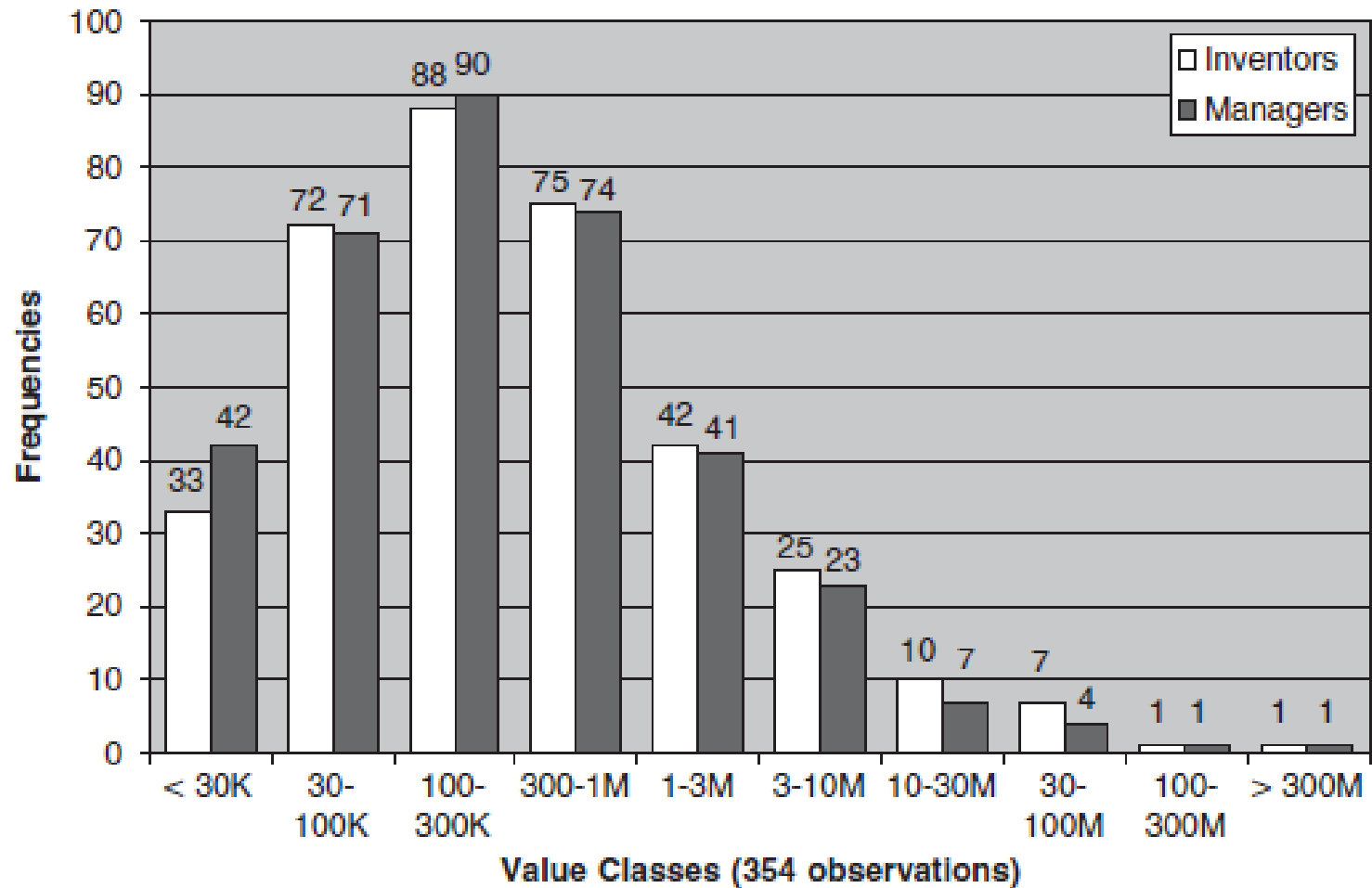
- Population: all EPO patents with priority dates 1993-7 (PatVal1), 2003-5 (PatVal2)
- PatVal1: FR, DE, DK, ES, HU; IT, NL, UK. PatVal2: many more countries (including US, Japan)
- questionnaire sent to first inventor (if not available: any other inventor) ... questions on inventor biography, employer, invention process, invention characteristics
- PatVal1: 27,000 questionnaires mailed, about 9,000 responses. PatVal2: 120,000; 20,000
- For details (about PatVal1): Giuri, Mariani et al. (2007) “Inventors and invention processes in Europe: Results from the PatVal-EU survey”, *Research Policy*, 36 (8), 1107-1127

# *Patent Value Distribution*

## *(Individual Patents, PatVal-EU1)*



# *Inventors vs Managers*





# Correlations with indirect indicators

Table 7 OLS and interval regressions of patent value

	<i>Dependent Variable</i> <i>log(VALUEM)</i> <i>(OLS)</i>	<i>Dependent Variable</i> <i>VALUE</i> <i>(Interval regression)</i>	<i>Dependent Variable</i> <i>log(log(VALUEM))</i> <i>(OLS)</i>
CONST	5.066*** (0.000)	4.834*** (0.000)	1.573*** (0.000)
LOG(1+CITES)	0.343*** (0.000)	0.353*** (0.000)	0.056*** (0.000)
LOG(1+REFS)	0.158** (0.010)	0.163** (0.010)	0.026** (0.013)
LOG(CLAIMS)	0.171*** (0.000)	0.175*** (0.000)	0.030*** (0.000)
LOG(STATES)	0.372*** (0.000)	0.387*** (0.000)	0.062*** (0.000)

- 8217 obs.; time, country, technology class dummies

# Features of the distribution

**Table 8** Estimated moments of the patent value distribution, assuming log-normality (values in 000 2003 euros, corrected by German dummy)

<i>Moment</i>	<i>Theoretical expression for the log-normal distribution<sup>a,b</sup></i>	<i>Estimated moment<sup>b,c</sup></i>
<i>Mean</i>	$exp(\mu + \sigma^2/2)$	<i>Average of <math>exp(\mu_i + \sigma^2/2)</math></i>
PatVal-EU sample (N = 8217)	3138.6	3550.8
All patents (N = 49,941) <sup>d</sup>	3015.6	3422.6
<i>Median</i>	$exp(\mu)$	<i>Median of <math>exp(\mu_i)</math></i>
PatVal-EU sample (N = 8217)	397.4	382.7
All patents (N = 49,941) <sup>d</sup>	381.8	365.3
<i>Mode</i>	$exp(\mu - \sigma^2)$	<i>Average of <math>exp(\mu_i - \sigma^2)</math></i>
PatVal-EU sample (N = 8217)	6.4	7.2
All patents (N = 49,941) <sup>d</sup>	6.1	6.9

<sup>a</sup>The parameter  $\mu$  is the average of the fitted values of the first equation in Table 7, viz.  $E(\log(\text{VALUEM}))$ , using the German constant for all the observations. For the PatVal-EU sample the average is computed across the 8217 PatVal-EU observations, and it is  $\mu = 5.985$ . For the full set of patents is predicted from the available regressors for all the 1993–1997 EPO patents, and it is  $\mu = 5.945$ .

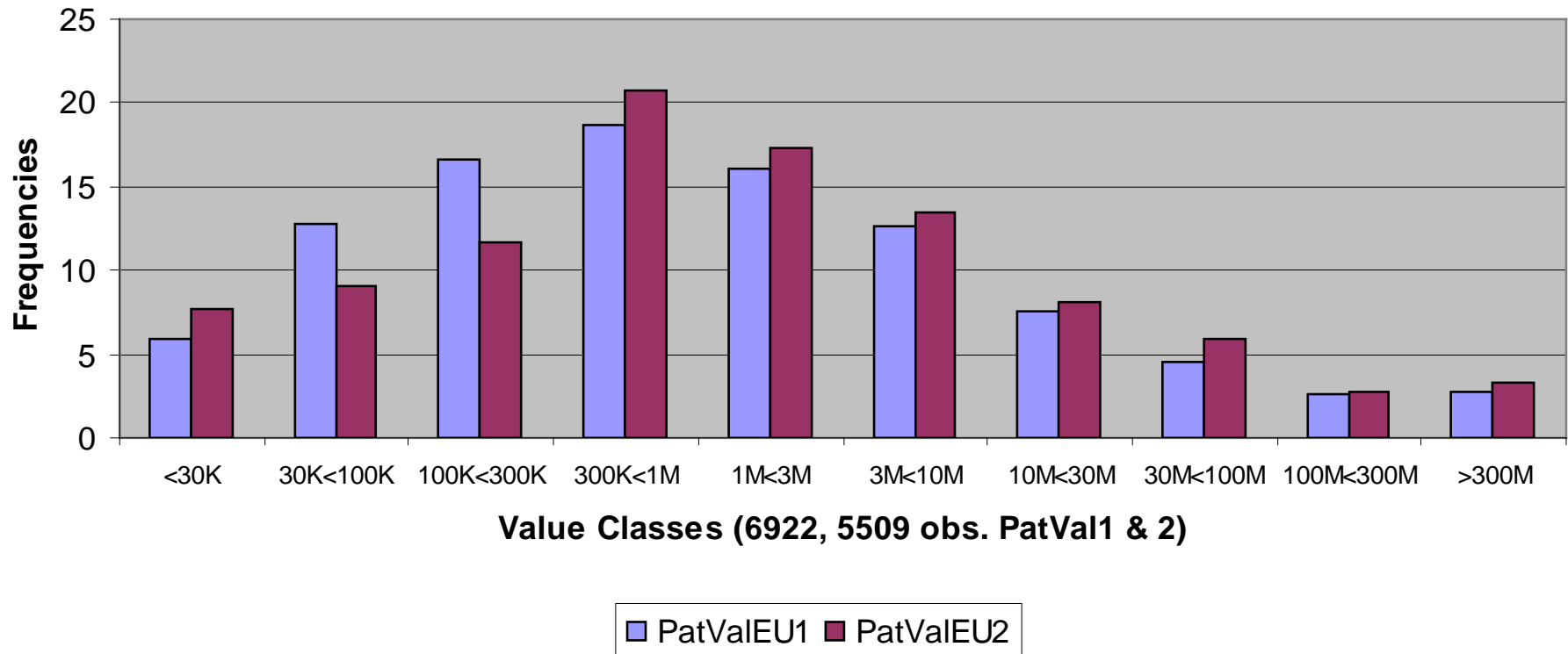
<sup>b</sup>The estimated  $\sigma = 2.033$  is the standard error of the first regression in Table 7.

<sup>c</sup>The parameter  $\mu_i$  denotes the fitted values of  $\log(\text{VALUEM})$  for the generic  $i$ th observation.

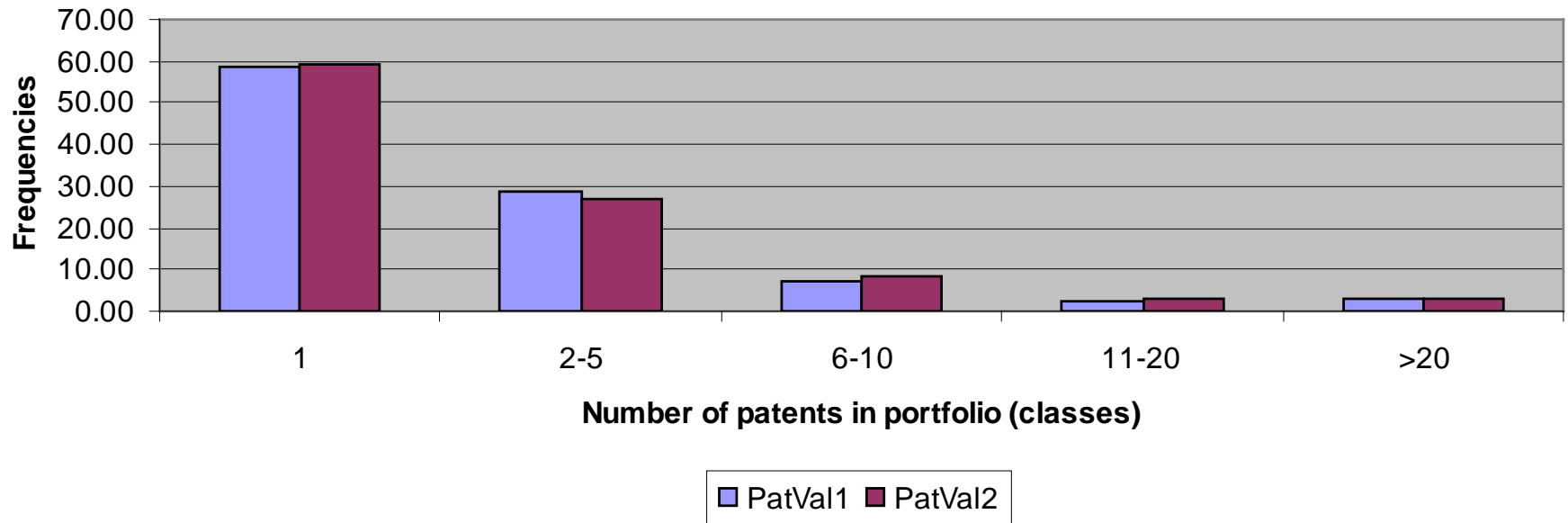
<sup>d</sup>All EPO patents with priority year 1993–1997 granted by 2003.

Gambardella, A. , Harhoff, D. and B. Verspagen (2008) “The Value of European Patents,” *European Management Review* 5: 69-84

# Patent Value Distribution (Portfolios, PatVal-EU1 & 2)



# *Distribution of numbers (PatVal-EU1 & 2)*



# *What determines the economic value of patent portfolios?*

- Question is important
  - *Markets for technology*
  - *Firms want to understand value created by their labs*

# *N vs Average Value*

$$V = N \cdot \bar{V} (N)$$

*Value of patent portfolio  $V$  increases because of  $N$  or  $\bar{V}$  ?*

*Determinants of  $N$  vs.  $\bar{V}$  ?*

- *We focus on*
  - *Resources invested in invention (R&D, man-months)*
  - *Inventor characteristics (past citations, education)*

Extensive mg

$$V = N \cdot \bar{V}(N, M, Z)$$

R&D (man-months)  
on average value  
(intensive margin)

$$N = N(M, Z)$$

complementarity (+)

R&D (man-months) on N

- “Theory”
  - There are diminishing returns to creating value from a single invention (limits to intensive margin)
  - Value is created via “adds-on” ... additional “features”/inventions: values grows by breadth
  - N feeds back on average value b/c inventions are complementary
  - And resources (M) affect N

$$V = N \cdot \bar{V}(N, M, Z)$$

$$N = N(M, Z)$$

Net effect on on V?

Science, positive on N  
via M

Science, negative on N

- In addition
  - **Science** → N : focus (lower N)
  - **Science** → M : more ideas (higher N)
  - **Science** → V : net effect
  - **Originality** → opposite effects
- **Two models** (which one dominates?)
  - scientific (low N, high M)
  - empiricist (high N, low M)



# GMM results

<i>Covariates</i>	<i>Dependent Variables</i>		
	<i>V</i>	<i>N</i>	<i>M</i>
N	1.503 <sup>***</sup> 0.000		
M	0.347 <sup>***</sup> 0.000	0.495 <sup>***</sup> 0.000	
SCIENCE	0.056 0.463	-0.074 <sup>***</sup> 0.006	0.173 <sup>***</sup> 0.000
ORIGINALITY	-0.058 0.410	0.036 <sup>*</sup> 0.062	-0.022 0.537

Many controls (including strategic patenting for N),  
4638 obs., N, M endogenous

<i>Elasticity wrt</i>	<i>Elasticity of N (1)</i>	<i>Elasticity of Average Value (2)</i>	<i>Total Elasticity</i>	<i>Total Elasticity of V wrt N</i>
	$n_m$	$v_m + (v_n - 1) n_m$	$(1) + (2)$	$v_n n_m$
<i>M</i>	0.495 <sup>***</sup> 0.000	0.596 <sup>***</sup> 0.000	1.091 <sup>***</sup> 0.000	0.744 <sup>***</sup> 0.000
	$n_x + n_m \cdot m_x$	$v_x + v_m \cdot m_x + (v_n - 1) \cdot (n_x + n_m \cdot m_x)$	$(1) + (2)$	$v_n \cdot (n_x + n_m \cdot m_x)$
<i>INVENTOR_CITES</i>	0.212 <sup>***</sup> 0.000	0.298 <sup>***</sup> 0.001	0.510 <sup>***</sup> 0.000	0.319 <sup>***</sup> 0.000
<i>PhD vs. High-School</i>	0.192 <sup>***</sup> 0.000	0.220 0.112	0.412 <sup>***</sup> 0.005	0.288 <sup>***</sup> 0.001
<i>BA/Master vs. High-School</i>	0.049 0.131	0.152 0.139	0.201 <sup>*</sup> 0.070	0.073 0.146
<i>SCIENCE</i>	0.012 0.673	0.122 0.101	0.133 0.102	0.018 0.674

Extensive mg  $V = N \cdot \bar{V}(N, M, Z)$  R&D (man-months) on average value (intensive margin)

$N = N(M, Z)$  complementarity (+)

R&D (man-months) on N

The diagram features four colored arrows: a blue arrow from 'Extensive mg' to the 'N' in the first equation; a red arrow from 'R&D (man-months) on average value (intensive margin)' to the  $\bar{V}$  term; a green arrow from 'complementarity (+)' to the  $N$  in the second equation; and a pink arrow from 'R&D (man-months) on N' to the  $N$  in the second equation.

# Conclusions

- Considerable impact of N on V
  - Direct & via average value (complementarity)
- True of
  - Resources
  - Inventor's experience (past successes, education)
- Empiricist vs scientific approach



**Thank You!**  
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## APPENDIX 1: Correlation b/w average value of the patent portfolio and indirect indicators, OLS

Variable	Estimates	Variable	Estimates	Variable	Estimates
CITES	0.315 <sup>***</sup> 0.000	OP	0.240 <sup>**</sup> 0.011	CONSTANT	5.266 <sup>***</sup> 0.000
CLAIMS	0.143 <sup>***</sup> 0.006	ACCEX	0.145 0.202	<i>Statistics</i>	
STATES	0.165 <sup>**</sup> 0.011	PCT	0.229 <sup>***</sup> 0.003	# obs.	6160
EQUIVALENTS	0.263 <sup>***</sup> 0.000	OBS3PARTY	0.830 <sup>**</sup> 0.033	Adjusted R <sup>2</sup>	0.103

Dependent variable:  $V/N$ . All variables, but dummies, in logs;  $\log(1+\text{variable})$  if variable can take value 0; robust  $p$ -values below estimates; <sup>\*\*\*</sup>  $p < 0.001$ , <sup>\*\*</sup>  $p < 0.05$ , <sup>\*</sup>  $p < 0.10$ ; equation includes country dummies, 30 dummies for technological sectors, dummies for patent priority years, and weights to adjust the oversampling of important patents in PatVal-EU. (Weights, SEE TABLE 2.) All observations clustered around the ultimate parent of the applicant. CITES = # forward citations up to 5 years after the priority date; CLAIMS = # of claims at grant; STATES = # of EPO countries in which the patent has been applied for; EQUIVALENTS = # of equivalent patents; OP, ACCEX, PCT, OBS3PARTY = dummies = 1 if the patent was opposed, the applicant requested an accelerated examination procedure, the patent is a PCT, the patent was subject to observations by 3<sup>rd</sup> parties before the grant (according to art.115 of the EPC). All these indicators refer to the focal PatVal-EU patent. Regression employs all the available observations (6160).

# Robustness check 1

## APPENDIX 2: GMM estimation using indirect indicators of $V$

<i>Variables</i>	<i>Dependent Variable of the V-equation</i>		
	CITES	STATES	EQUIVALENTS
$N$	0.225** 0.024	-0.038 0.619	-0.085 0.379
$M$	0.019 0.197	0.046*** 0.000	0.035** 0.030
# obs.	4639	4639	4639

Same log-log GMM system as in Table 2 with CITES (= # forward citations up to 5 years since the patent's grant), STATES (# of countries in which the patent is applied for), and EQUIVALENTS (# of patent offices in which the invention has been patented), as dependent variables; \*\*\*  $p < 0.001$ , \*\*  $p < 0.05$ , \*  $p < 0.10$ .

# Robustness check 2

APPENDIX 3: Probit estimation, dependent variable = 1 for the 4639 observations in the sample

Variable	Estimates	Variable	Estimates	Variable	Estimates
CITES	-0.016 0.536	OP	0.028 0.624	CONSTANT	0.498*** 0.000
CLAIMS	-0.043 0.149	ACCEX	0.008 0.925	# obs.	8515
STATES	-0.045 0.173	PCT	-0.015 0.697	H0: 8 coeff. = 0	
EQUIVALENTS	0.018 0.438	OBS3PARTY	-0.011 0.961	Wald test statistics	5.11
				p-value, $\chi^2$ (8, d.f.)	0.746

All variables, but dummies, in logs;  $\log(1+\text{variable})$  if variable can take value 0; robust  $p$ -values below estimates; \*\*\*  $p < 0.001$ , \*\*  $p < 0.05$ , \*  $p < 0.10$ ; equation includes country dummies, 30 dummies for technological sectors, dummies for patent priority years, and weights to adjust the oversampling of important patents in PatVal-EU. (Weights, see Table 2. Definition of covariates, see Appendix 1.) All observations clustered around the ultimate parent of the applicant.