

# Physician performance pay: Experimental evidence

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## Why do we care?

- Mounting health care costs in many Western countries (e.g., Baicker and Goldman, 2011 JEP; Chandra and Skinner, 2012, JEL)
- Understanding how physicians respond to incentives is a important for policy-makers and researchers alike
- Traditional payment system: fee-for-service incentivizes “too many” services (e.g., Ellis and McGuire 1986, JHE)
- A prominent attempt to control costs: lump-sum capitation (CAP) payments (e.g., in managed care); CAP incentivizes underprovision of medical services (e.g., Cutler 1995, ECMA)
- P4P-programs are frequently suggested to improve the quality of health care (e.g., UK, USA)

## Empirical literature on P4P

- Inconclusive evidence on the effect of performance pay on physicians' behavior (e.g., Sutton, 2012, NEJM, Witter et al. 2012, Cochrane Rev., Eijkenaar et al. 2013, EJHE)
  - (If at all) rather moderate effects of P4P (e.g., Mullen et al., 2010, RAND, Li et al., 2014, HE)
  - Health outcomes might be biased due to measurement errors (e.g., Campbell et al., 2009, NEJM, Gravelle et al. 2010 EJ)
  - Often performance pay is introduced with other interventions (e.g., public reporting of performance)
- ▷ Causal effect of performance pay on physicians' behavior and the quality of health care is difficult to infer using field data

## Other-regarding motivations in public services

- Other-regarding motivations are a fundamental determinant of public service provision (e.g., Besley and Ghatak 2005, AER; Delfgauuw and Dur 2010, JPubE; Prendergast 2007, AER)
  - Financial incentives might lead to crowding-out other regarding motivations (e.g., Deci 1971; Frey et al. 1996, JPE; Frey 1997, EJ)
  - Some experimental evidence for motivation crowding-out in work effort (e.g., Gneezy and Rustichini 2000, QJE; Huffman and Bognanno, 2017, MS)
  - Level of incentive may be an important driver of a behavioral change (Ariely et al. 2009, REStud)
- ▷ No empirical evidence on whether P4P crowds-out physicians' altruistic (patient-regarding) motivation

## This paper

- Artefactual field experiments (in the sense of Harrison and List, 2004, JEL) with **physicians from a representative sample of resident physicians** in Germany
- 'Clean' performance measure tied to quality of medical care
- Within-subjects: Exogenous variation of the payment system from CAP to CAP + performance pay
- Between-subjects comparison of different bonus levels
- **First field experiment studying the causal effect of introducing performance pay on physicians' behavior**
- **Link of behavioral data to physicians' individual characteristics**

# Outline

Related literature

Experimental design

Results

Conclusion

## Related behavioral experiments in health

- Health care markets: Kessler and Roth (2014 AER, 2014 JPubE)
- Non-monetary incentives: Kesternich et al. (2015, JPubE), Godager et al. (2016 JEBO)
- Fee-for-service and capitation: Hennig-Schmidt et al. (2011, JHE), Hennig-Schmidt and Wiesen (2014, SSM), Lagarde and Blauuw (2017, SSM), Brosig-Koch et al. (2016, JEBO)
- Mixed payment systems: Brosig-Koch et al. (2017, HE)
- P4P: Lagarde and Blauuw (2016, WP), Cox et al. (2016, JEBO)

## Research questions

1. How does performance pay affect physicians' behavior?
2. Does the bonus level affect physicians' behavior (Low: 5 percent vs. high: 20 percent on top of the CAP payment)?
3. Does performance pay crowd-out physicians' altruistic motivation?
4. How do physicians' characteristics relate to crowding-out of motivation?



## Some background

- Overall, 104 primary care physicians (PCPs) participated in our artefactual field experiment
- Sub-sample ( $\sim 10\%$ ) of PCPs enrolled in the Zi-Praxis-Panel (ZiPP) of the *Zentralinstitut der Kassenärztlichen Bundesvereinigung* which is a representative sample of resident physicians in Germany
- ZiPP is run annually with about 5,000 resident physicians
- In Germany, around 33,000 resident PCPs contract with the statutory health insurance (GKV), about 1,000 PCPs participate in the ZiPP
- About 72 million people ( $\sim 88\%$  of German population) are enrolled in a statutory health insurance scheme

## PCPs: Some sample characteristics

- Average age: 54 years (ZiPP: 54, German PCPs:  $\sim 53$  years)
- Share of female PCPs: 35% (ZiPP: 39% German PCPs:  $\sim 44\%$ )
- Distribution of locations similar to ZiPP
  - City: Our sample:  $\sim 37\%$ ; ZiPP:  $\sim 34\%$
  - Outer conurbation: Our sample:  $\sim 44\%$ ; ZiPP:  $\sim 37\%$
  - Rural: Our sample:  $\sim 19\%$ ; ZiPP:  $\sim 29\%$

## General experimental design

- **Within-subject design**: introduction of performance pay at two different levels

Treatment	Payment system, part I	Performance-pay systems, part II	# Sub. (# pat.)
20% bonus	CAP	CAP+P4P-20%	51 (918)
5% bonus	CAP	CAP+P4P-5%	53 (954)

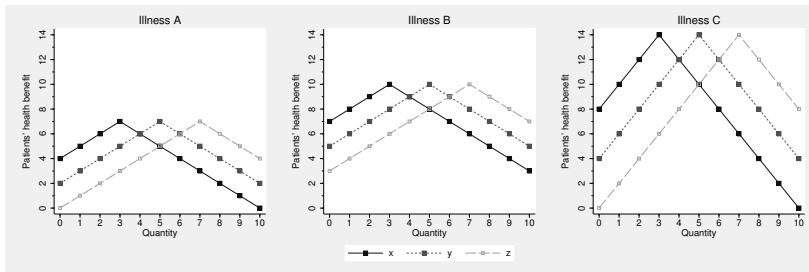
- **Between-subject comparison** for performance-pay systems

## Decision situation

- Framed physician decision-making experiment
- Subjects decide (in the role of physicians) on the **quantity** of medical services  $q$
- Individual decisions on  $q \in \{0, 1, \dots, 10\}$  for **9** abstract patients
- Subjects simultaneously determine **profit** and the **patient's health benefit** (measured in monetary terms)
- Framing and setting are the same for all payment systems

## Patients' health benefit

- Systematic variation of patients' health benefit; constant for all payment systems
- Illnesses *A*, *B*, *C* with three severities *x*, *y*, *z* (i.e., low, intermediate, high)



- Salient incentive: Patients' health benefit measured in monetary terms, benefits real patients' health outside the lab

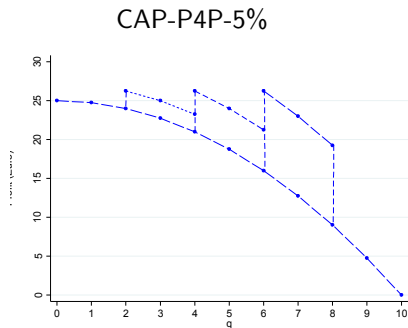
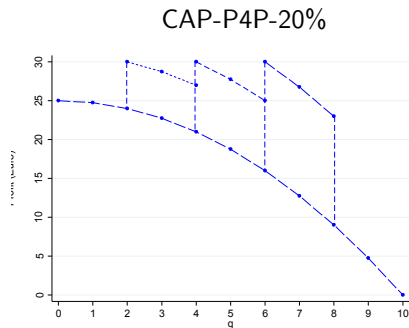
## Payment systems

- Performance pay linked to patients' benefit (health outcome) and adjusted for severities of illness
- Bonus is granted if quality threshold is reached  $|q - q^*| \leq 1$
- Different rates for patients' severity of illness can be interpreted as of risk adjustment (e.g., Glazer and McGuire, 2000, AER)
- CAP: lump-sum payment of 25 EUR for physicians
- Reflects asymmetric information between payer and provider

Severity	CAP+P4P-20%	CAP+P4P-5%
$x(q^* = 3)$	6	2.25
$y(q^* = 5)$	9	5.25
$z(q^* = 7)$	14	10.25

- Cost are convex  $c(q) = q^2/4$

# Parameters: Profits in CAP+P4P-20 and CAP+P4P-5



# Sample decision screen


**SoPHIE**

Runde 1: Patient 1

[Link zu Instruktionen](#)

Anzahl medizinischer Leistungen	Ihre pauschale Vergütung (in Euro)	Ihre Bonusvergütung (in Euro)	Ihre Kosten (in Euro)	Ihr Verdienst = Vergütung + Bonus - Kosten (in Euro)	Nutzen des Patienten mit Erkrankung B Schweregrad x (in Euro)
0	25.00	0.00	0.00	25.00	17.50
1	25.00	0.00	0.25	24.75	20.00
2	25.00	6.00	1.00	30.00	22.50
3	25.00	6.00	2.25	28.75	25.00
4	25.00	6.00	4.00	27.00	22.50
5	25.00	0.00	6.25	18.75	20.00
6	25.00	0.00	9.00	16.00	17.50
7	25.00	0.00	12.25	12.75	15.00
8	25.00	0.00	16.00	9.00	12.50
9	25.00	0.00	20.25	4.75	10.00
10	25.00	0.00	25.00	0.00	7.50

Welche Anzahl medizinischer Leistungen möchten Sie erbringen?

Absenden ...

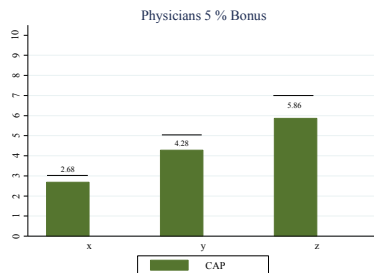
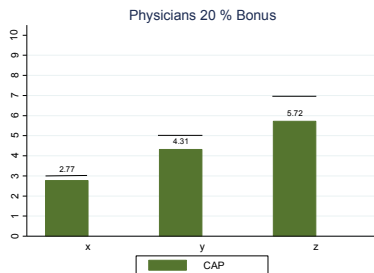


## Experimental protocol

- Field experiments were run in March 2016; average duration of about 25 minutes
- Double-blind procedure: experiment facilitated by trust office (usually running the ZiPP) ensured anonymity of subjects, payment procedure via notary office
- Random payment technique: One decision is randomly selected for payment from each part
- Average payment per subject: 45.93 EUR (total: 4,823 EUR)
- Average patient benefit: 47.64 EUR (total: 5,002.50 EUR)

# Physicians' medical service provision in CAP

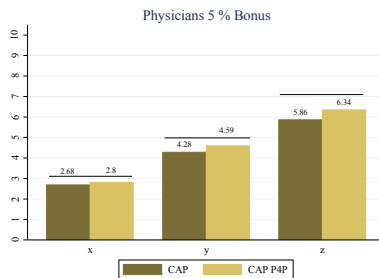
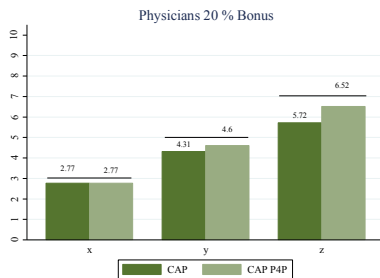
## Average quantities by severity of illness



- Physicians significantly underprovide medical services in CAP ( $p \leq 0.007$ , Wilcoxon signed-rank test)
- **Severity of illness** significantly affects quantity choices
- Consistent with findings in the empirical and experimental literature (e.g., Cutler, 1995, ECMA Hennig-Schmidt et al. 2011, JHE)

# How performance pay affects physicians' behavior

## Average medical services by payment system and severity

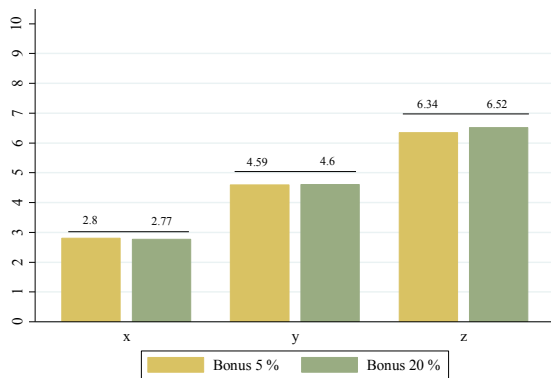


## Within-subject comparisons

- Underprovision is significantly reduced for intermediately ( $y$ ) and severely ill ( $z$ ) patients in CAP+P4P-20% and CAP+P4P-5% ( $p \leq 0.0014$ , Wilcoxon signed-rank test)
  - For low severity patients ( $x$ ), the reduction in underprovision is weakly significant in CAP+P4P-20% ( $p \leq 0.0823$ )
  - For CAP+P4P-5%, the reduction for low severity patients ( $x$ ) is not significant ( $p \geq 0.6284$ )
- ▷ Performance pay reduces underprovision of medical services inherent in CAP for intermediately and severely ill patients under both P4P schemes.

# Physicians' behavior under high and low performance pay

Average medical services by payment system and severity



- Between-subjects: No significant effect of bonus level

▷ A reduction in the bonus level does not significantly affect behavior.

## Crowding-out of altruistic motivation

- Analysis is based on how (104x9) individual patients are treated in both parts
- Treatment types:
  - Profit maximization (PM)
  - Benefit maximization (BM)
  - Trade-off (TO)
- Treatment types by part of the experiment:
  - Part I (CAP): PM: 1.5%; BM: 54%; TO: 41%; Other: 2.5%
  - Part II (CAP+P4P): PM: 30%; BM: 64%; TO: 0%; Other: 4%
- Transitions:
  - Crowding out: BM  $\rightarrow$  PM: 7% ( $\sim$  14% of BM); TO  $\rightarrow$  PM: 24%
  - Crowding in: PM  $\rightarrow$  BM: 1%; TO  $\rightarrow$  BM: 17%

# Crowding out and physicians' characteristics

## Logit regression on crowding out of altruistic behavior

	(1)	(2)
Condition: 20%-Bonus	0.0089 (0.0094)	0.0105 (0.0092)
Low severity (= 1 if $l = x$ )	0.0376 (0.0274)	0.0364 (0.0264)
Interm. severity (= 1 if $l = y$ )	0.0203 (0.0207)	0.0195 (0.0200)
Marginal health benefit	-0.0300** (0.016)	-0.0289** (0.0142)
Age	-0.0005 (0.0012)	-0.0034 (0.0023)
Gender (= 1 if male)	-0.0392* (0.0220)	-0.0430** (0.0202)
City	-0.0447*** (0.1738)	-0.4581*** (0.0162)
Outer conurbation	-0.0416** (0.1915)	-0.0432** (0.1846)
Years in practice controls	No	Yes
Other characteristics	Yes	Yes
Observations	936	936
Subjects	104	104

Dependent variable: Crowding-out (1 if  $q_i^* \rightarrow \hat{q}_{ij}$ ; 0 otherwise)

Logit reg.; marginal effects; ref. category: 'high severity z' and 'rural'  
clustered for subjects; robust SE; \*\*\* $p < .01$ , \*\* $p < .05$ , \* $p < .1$

## Crowding out of altruistic behavior

- Some evidence for crowding out of physicians' patient-regarding/altruistic behavior
- Likelihood for crowding out decreases in the patients' marginal health benefit and is not significantly affected by the severity
- Likelihood for crowding out is significantly higher for physicians in rural areas than for physicians in cities and towns
- Likelihood for crowding-out is lower for male physicians



## Concluding remarks

- First controlled (artefactual) field experiment to analyze effect of performance pay on physicians' provision behavior
- Underprovision in CAP is significantly reduced in P4P-systems
- Severity of illness significantly affect physicians' behavior
- Level of bonus does *not* significantly affect physicians' behavior
- Non-negligible evidence for crowding-out of patient-regarding/ altruistic behaviors
- Physicians' gender and location significantly relate to crowding out of altruistic behavior