

# Payments for Environmental Services: empirical analysis for Costa Rica

OR

*conservation & co-benefits lessons  
from the evolution of the PSA*

Alexander Pfaff & Juan Robalino et al.

*ACES – ‘Payments & Markets for Ecosystem Services’*

*Naples, Florida*

*12/10/08*

## **TAKEAWAY: program design matters !!**

- Costa Rica deserves gratitude as very public pioneer & always expected learning and program evolution
- “lessons learned from Costa Rica” are misleading: *deforestation without payments then none with!!!*
- payments for ecosystem services CAN work well; that does NOT mean ANY payments have impact
- the most relevant Costa Rican lesson, for the world, is that details of payment allocation rules do matter

## **ANALYSIS: non-random location confounds**

- discussion of various forest policies but less of where
- where is a choice that *responds to factors we observe*, factors which, in turn, *affect the outcomes of interest*
- we examine payments (protection, roads) empirically:
  - 1) LOCATIONS NON-RANDOM; WORSE LAND
  - 2) CORRECTED IMPACTS ARE MUCH LOWER
  - 3) **BUT** TARGETING CAN INCREASE IMPACTS

# Land-Use Analysis In Background

- examine deforestation over time (e.g. for C baseline)  
[1963 aerial photos; 1979, 1986, 1997, 2000, 2005 satellites]
- initially used district and sub-district observations;  
still some, but focusing on more recent pixel data
- biophysical proxies yield expected results as do the socioeconomic covariates: rain, temperature, slope, soil, distances to markets and national / local roads  
*all of these observable factors useful for matching*

# Payments for Ecosystem Services

- Costa Rica has been a global leader in this arena
- PSA is widely cited & many suggest imitating it
- since 1997, offered 5-year contracts of three types:
  - forest conservation, i.e. in forest and keep that way
  - reforestation (smaller) (its totals move with funds)
  - forest management (some clearing) (was dropped)
- temporally correlated with lower clearing -- causal ?

## Other Factors in Costa Rican Land Use

- parks (note the Supreme Court case about compensation)
- ecotourism generally has boomed (including private)
- don't forget important private or market incentives
  - coffee exports / prices and beef prices matter
  - as in 'theory' [Figure 1], may not want to clear
- 1997 law put up barriers to additional forest clearing

# Estimating The Payments' Impacts – Data

- using pixels, draw 10,000 locations across Costa Rica
  - examine the locations in forest in 1986, 1997, 2000, 2005
  - missing some observations due to clouds blocking satellites
- dependent variable is deforestation (97 - 00, 00 - 05)
- control for non-policy characteristics of the locations:
  - distances to: cities, roads, rivers, schools, sawmills
  - biophysical characteristics: rain, elevation, slope

# 1997-99 Contracts: no clearing to be avoided !!

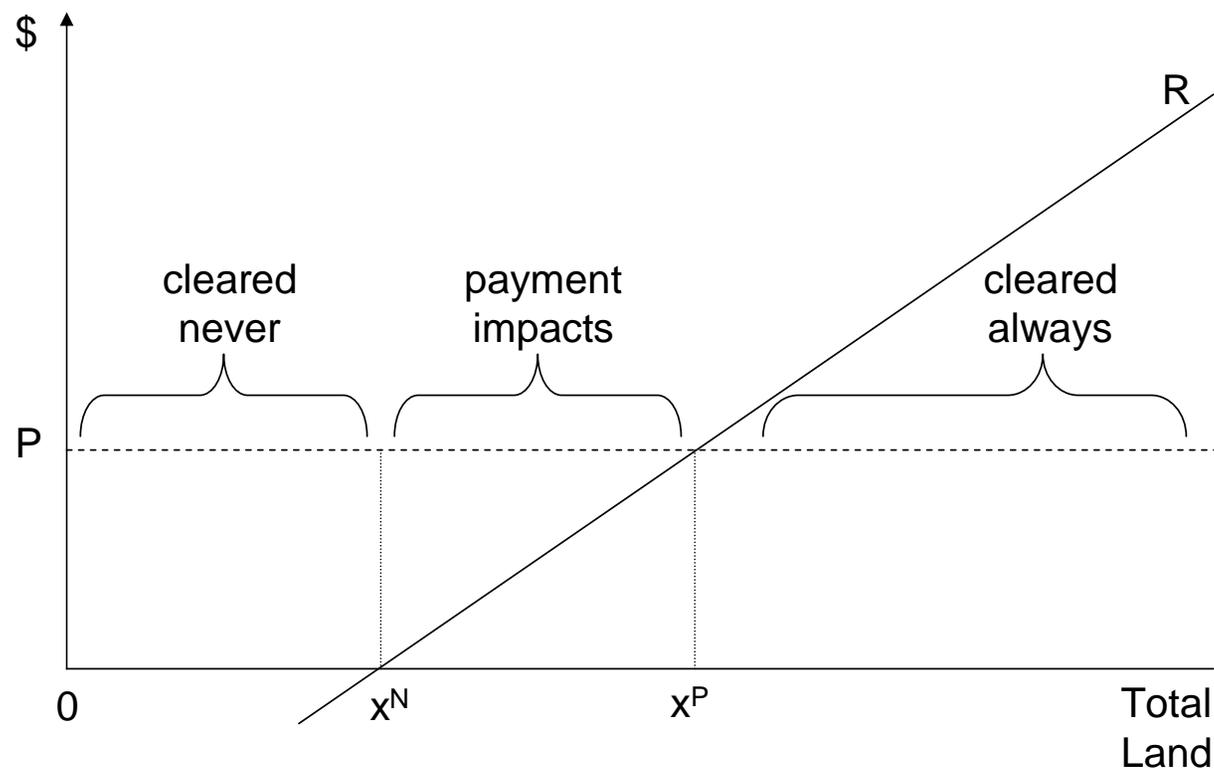
	<u>#cleared</u>	<u>#uncleared</u>	<u>97-99 %</u>	<u>Annual %</u>
PSA points	0	60	0.00 %	<b>0.00 %</b>
NonPSA points	11	1699	0.63 %	<b>0.21 % *</b>

*\* for 1770 pixel sample but essentially equals national rate*

This measure suggests little clearing to be prevented;  
**so randomly distributed payments can't do much.**

# Land-Use Model & where do payments go ?

- the level of the payments (P) affects the level of the impact
- the distribution of land affects who might be affected by P
- we can see that some land will never be volunteered (at P);  
critical question: does Never Cleared dominate enrollment?



## NOT Targeting Deforestation (predicted from 1986-1997)

<u>Annual Rate</u>	<u>0.00 -</u>	<u>0.15 -</u>	<u>0.40 -</u>	<u>0.45 -</u>	<u>0.60 -</u>
<u>of Deforestation</u>	<u>0.15%</u>	<u>0.30%</u>	<u>0.45%</u>	<u>0.60%</u>	<u>0.75%</u>
# observations	1163	348	100	23	3
average % rate	0.05%	0.21%	0.36%	0.51%	0.61%
<i><b>fraction in PSA*</b></i>	<b>4 %</b>	<b>3 %</b>	<b>1 %</b>	<b>0 %</b>	<b>0 %</b>

\* 1770 pixel sample but certainly can add additional points

This calculation suggests a net 97-99 bias to low threat; thus, the average-non-PSA value *overestimates* impact.

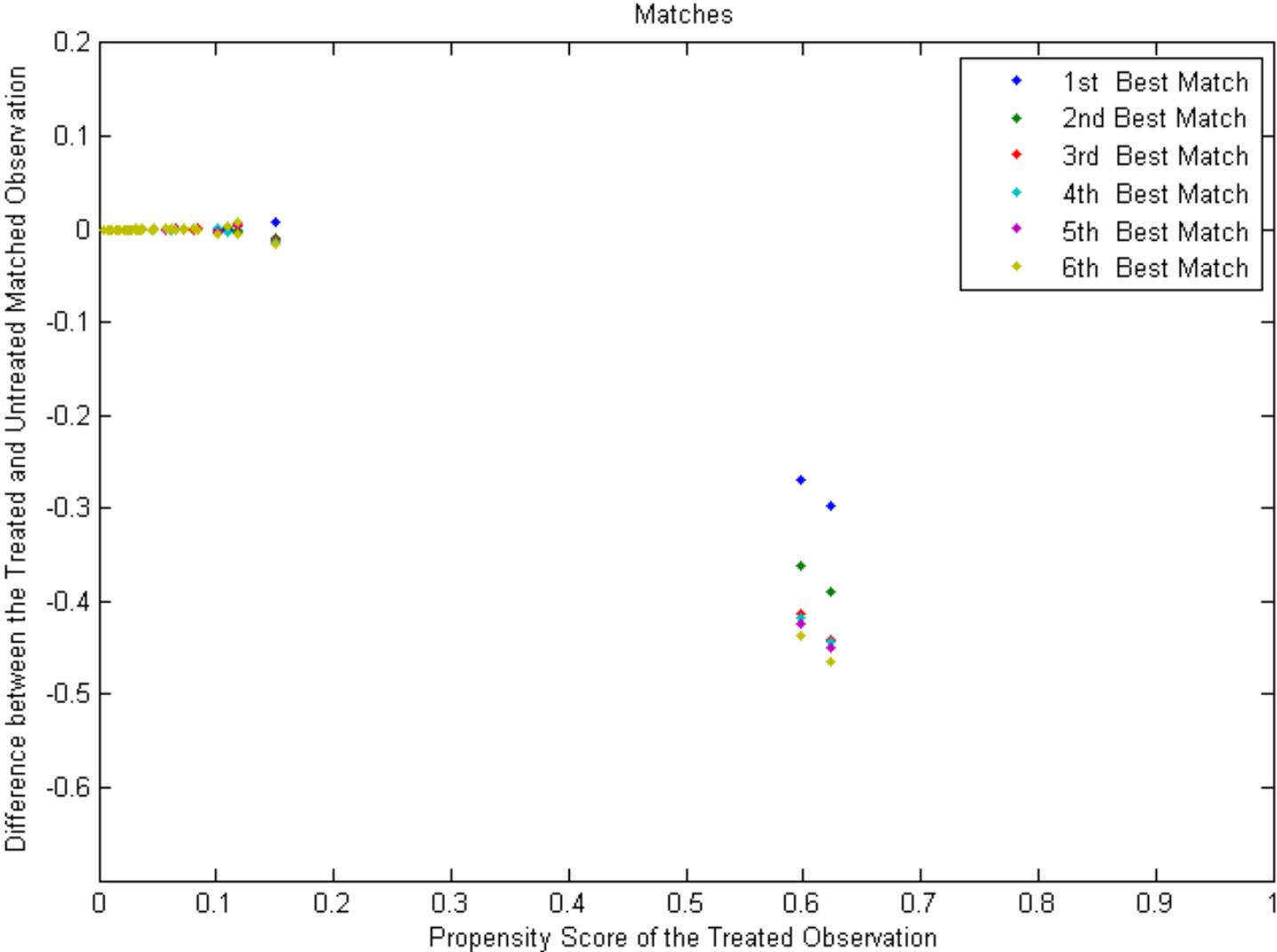
## “Matching” (to address non-randomness)

- compare treated to *similar* subset of the untreated
- definition of similarity using plot characteristics:
  - propensity score matching (PSM) compares points in terms of their probabilities of being treated, as seen from a prior regression: Rosenbaum & Rubin 1983
  - covariate matching (CM) does not use such a prior regression for likelihood of treatment, using instead ‘the distance in X space’: Abadie & Imbens 2006

## Covariate Balance (PSM, n=6)

	<u>Treated</u>	<u>Untreated</u>	<u>P<sub>untreated</sub></u>	<u>Matched</u>	<u>P<sub>matched</sub></u>
<u>R1</u>	0.2439	0.0943	0.0021	0.2033	0.5550
<u>R3</u>	0.0000	0.1533	0.0073	0.0000	-----
<u>R7</u>	0.0488	0.0873	0.3944	0.0407	0.8105
<u>DSJ</u>	92.58	100.68	0.3243	94.16	0.8707
<u>DLR</u>	2.850	2.451	0.2482	2.964	0.7406
<u>DNP</u>	14.03	17.45	0.0931	14.97	0.5831
<u>PTC</u>	0.3662	0.2035	0.0002	0.3287	0.5524
<u>REL</u>	0.5175	0.4113	0.1744	0.4805	0.6112
<u>RAI</u>	3.707	3.433	0.0774	3.6492	0.7753

# Yet Poor Matches for High Scores



# Examine 2000-2005 Contracts In Same Way

	Treated	Matched Controls	Significance P-value	All Controls
Good L. Zones for Ag.	22%	23%	0.34	32%
Bad L. Zones for Ag.	61%	58%	0.21	43%

# Impacts Summary & Policy Implications

- in 00-05 only 2% of enrolled land would have been deforested; thus payments are 50 times as high as with ‘perfect targeting’
- yet this (low) impact is over twice as high as the 0.8% in 97-00
  - despite net reforestation there was actually more gross deforestation
  - unintentionally, it seems, additional top-down ‘targeting of benefits’ removed the bias against targeting threats/impact due to volunteers
- if unintentional shifts can improve forest impacts of payments, surely intentional focus on indicators of threat could do more
- however, targeting higher threat, perhaps with higher payment, could lead the distribution of payments away from the poorest
- ‘bundled policy package’ story implies impact without targets

# **IF TIME (ELSE SEE POSTER):**

**lessons from observable factors' effects  
on forest impacts of protected areas  
within Costa Rica, 1986 - 1997**

## **AGAIN:**

- 1) LOCATIONS NON-RANDOM; WORSE LAND
- 2) CORRECTED IMPACTS ARE MUCH LOWER
- 3) **BUT** TARGETING CAN INCREASE IMPACTS

# Park Impacts within boundaries: PSM & CM

Park Effects on 86-97 % Deforestation, n = 4 in each method

*(Andam et al. (PNAS) examines 1963 forward; as per trends, estimated impact is higher but matching reduces similarly)*

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<b>Strategy</b>	<b>Difference in Means</b>	<b>Adj. Diff. in Means</b>
Using All of the Untreated (Naive)	-9.38**	-1.99*
Propensity Score Matching (PSM)	-0.05	-1.37**
Covariate Matching (CM)	-2.19**	-0.85

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## **PSM vs. CM**

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Treated Observations with the same match:	3.5%
Similarity between Control Groups	33.4%

# Park Impacts within boundaries -- comparisons

Park Effects on 86-97 % Deforestation, N = 4 in each method

*FAR FROM SAN JOSE*

*i.e. over 85km*

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<u>Strategy</u>	<u>Difference in Means</u>	<u>Adj. Diff. in Means</u>
<i>Using All of the Untreated (Naive)</i>	-9.38**	-1.99*
Propensity Score Matching (PSM)	-0.03	-0.60
Covariate Matching (CM)	-0.88**	-0.61*

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*Protecting places that are not under significant threat may not increase forest much relative to the baseline.*

# Park Impacts within boundaries -- comparisons

Park Effects on 86-97 % Deforestation, N = 4 in each method

*CLOSE TO SAN JOSE*

*i.e. under 85km*

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<u>Strategy</u>	<u>Difference in Means</u>	<u>Adj. Diff. in Means</u>
<i>Using All of the Untreated (Naive)</i>	-9.38**	-1.99*
Propensity Score Matching (PSM)	-0.72	-5.14**
Covariate Matching (CM)	-3.97**	-2.75**

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*Targeting places under greater threat, if it is feasible, raises the impact (& the cost?) of keeping it in forest.*

# Park Impacts within boundaries -- comparisons

Park Effects on 86-97 % Deforestation, N = 4 in each method

## *FAR FROM NATIONAL ROADS*

*i.e. over 7.53 km*

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<u>Strategy</u>	<u>Difference in Means</u>	<u>Adj. Diff. in Means</u>
<i>Using All of the Untreated (Naive)</i>	-9.38**	-1.99*
Propensity Score Matching (PSM)		
Covariate Matching (CM)		-0.2

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*Protecting places that are not under significant threat may not increase forest much relative to the baseline.*

# Park Impacts within boundaries -- comparisons

Park Effects on 86-97 % Deforestation, N = 4 in each method

## *CLOSE TO NATIONAL ROADS*

*i.e. under 7.53 km*

<u>Strategy</u>	<u>Difference in Means</u>	<u>Adj. Diff. in Means</u>
<i>Using All of the Untreated (Naive)</i>	-9.38**	-1.99*
Propensity Score Matching (PSM)		
Covariate Matching (CM)		-5.0**

*Targeting places under greater threat, if it is feasible, raises the impact (& the cost?) of keeping it in forest.*

# Park Impacts within boundaries -- comparisons

Park Effects on 86-97 % Deforestation, N = 4 in each method

***ON HIGHER SLOPES***

*i.e. over 7.12 degrees*

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<u>Strategy</u>	<u>Difference in Means</u>	<u>Adj. Diff. in Means</u>
<i>Using All of the Untreated (Naive)</i>	-9.38**	-1.99*
Propensity Score Matching (PSM)		
Covariate Matching (CM)		-1.1

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*Protecting places that are not under significant threat may not increase forest much relative to the baseline.*

# Park Impacts within boundaries -- comparisons

Park Effects on 86-97 % Deforestation, N = 4 in each method

***ON LOWER SLOPES***

*i.e. under 7.12 degrees*

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<u>Strategy</u>	<u>Difference in Means</u>	<u>Adj. Diff. in Means</u>
<i>Using All of the Untreated (Naive)</i>	-9.38**	-1.99*
Propensity Score Matching (PSM)		
Covariate Matching (CM)		-14.2**

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*Targeting places under greater threat, if it is feasible, raises the impact (& the cost?) of keeping it in forest.*

## SPILLOVERS (%) in 0-2km Rings

	Naive	OLS	PS Match	NN Match	
ALL	-5.19***	-2.02	-2.2	-4.56**	<i>blocking?</i>
Large			-1.1	-4.9**	<i>blocking?</i>
Small			-7.1**	-9.1***	<i>blocking</i>
Steep			-0.5	3.4	<i>nothing</i>
Flat			-8.8**	-12.0***	<i>blocking</i>

\*\*\* p<0.01

\*\* p<0.05

\* p<0.1

*next: see 6-8k rings  
for the subsets too*

*leaking?*