



Asian Development Bank - International Initiative for Impact Evaluation

Video Lecture Series

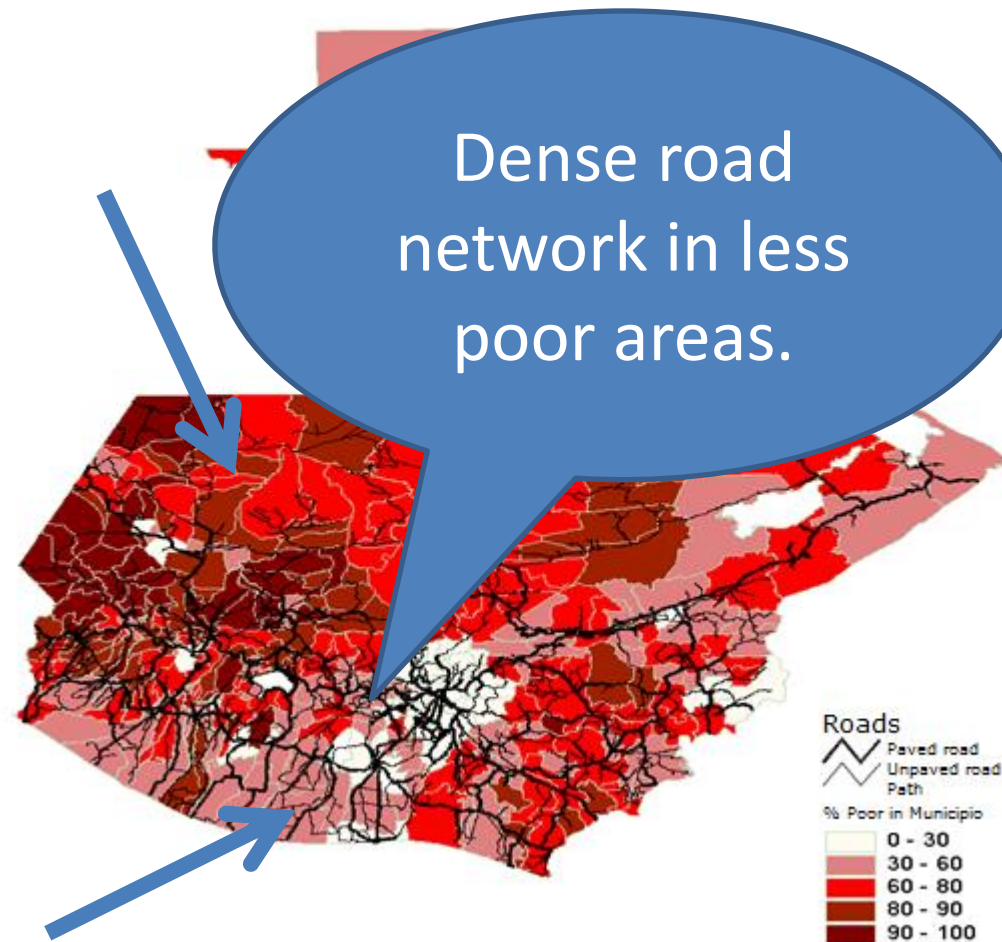
Quasi-experimental methods for impact evaluations

Jyotsna Puri

The Case of Roads in Guatemala

- Roads provide access to markets, health services, schools. So they *MUST* make a difference
- Roads are likely to be placed in fertile and better off areas – risk of over-estimating their effects
- Problem of project placement
- So how *do you quantify the impact?*

Guatemala: Percentage of population poor, by municipio, 2000
Roads



Random assignment



- Needs to occur before the programme
- Helps to deal with two main biases:
 - Self-selection bias
 - Programme placement bias
- Control for *unobserved characteristics* that may affect outcomes

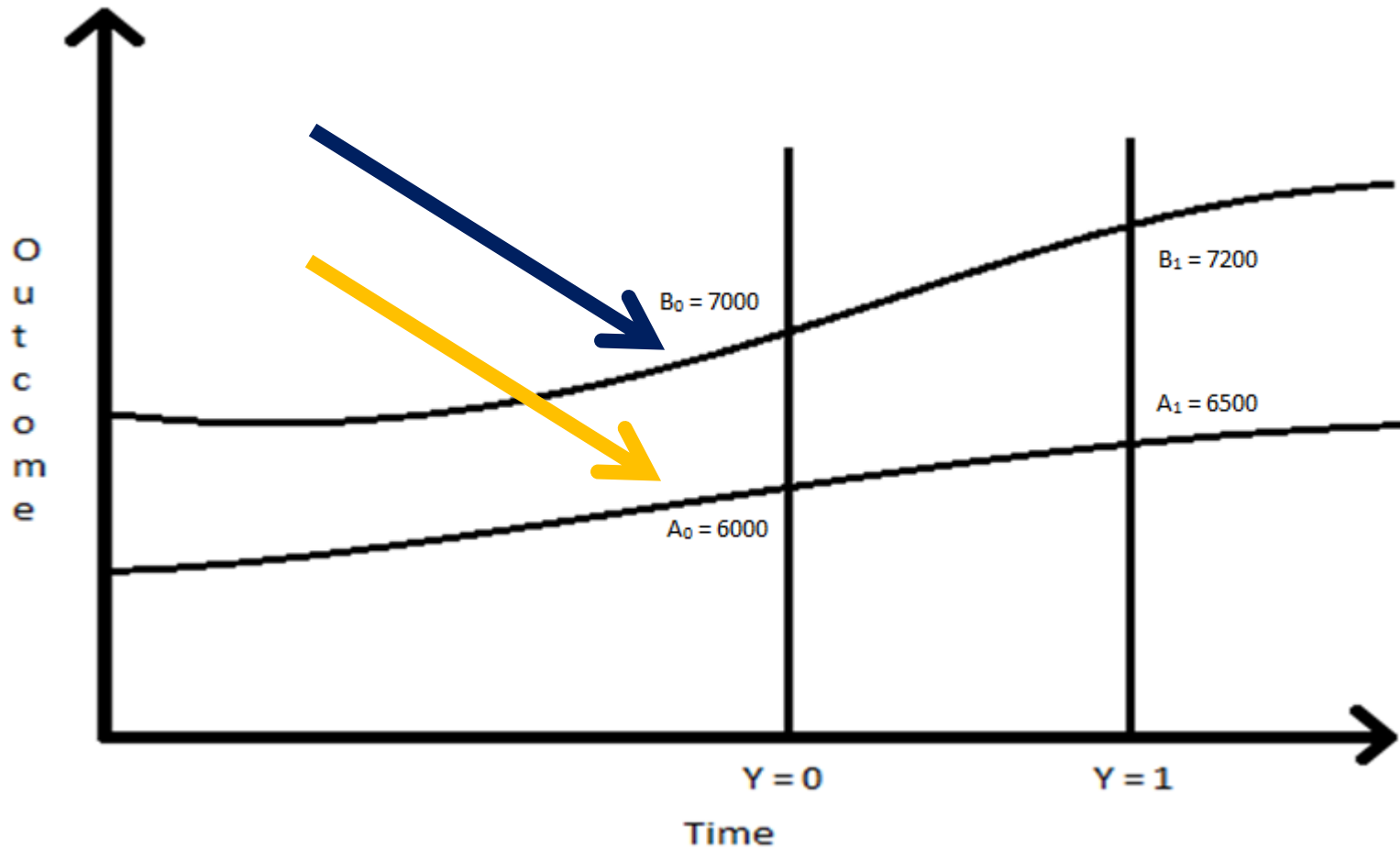


USING QUASI-EXPERIMENTAL DESIGNS WHEN RANDOM ASSIGNMENT IS NOT POSSIBLE

- Regression discontinuity design
- Matching
- Instrumental variables

MATCHING METHODS TRY TO MIMIC RANDOM ASSIGNMENT AND THEN USE DIFFERENCE-IN-DIFFERENCE

Difference in Difference (DID)



Difference in Difference (DID)



Double difference = $(6500 - 6000) - (7200 - 7000) = 300$

By itself DID is not sufficient to get rid of bias.

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- Requires proof of similarity at the beginning (balance in level variables)

- Requires proof of balance in the way groups are changing in time (balance in trends)

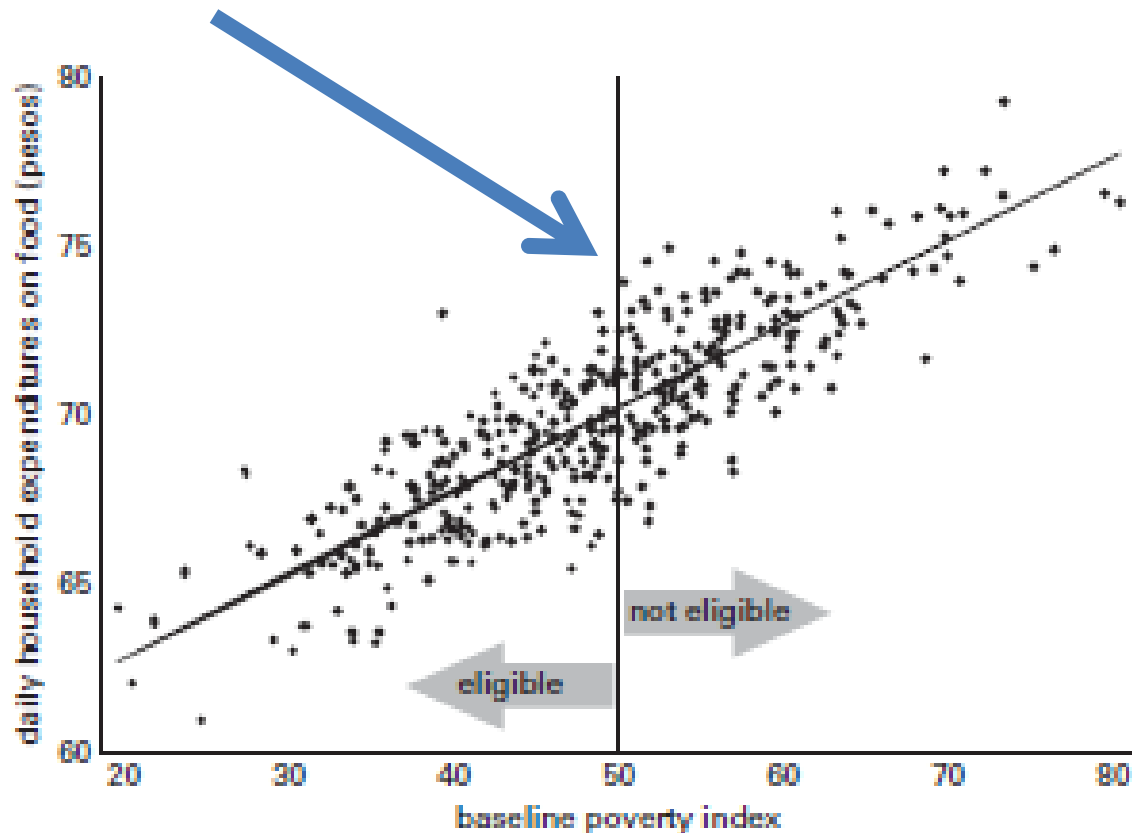
Takes advantage of programme-imposed cutoffs that determines who receives the programme

Around this cut-off there is little reason to think there are differences in unobservable characteristics between the two groups.

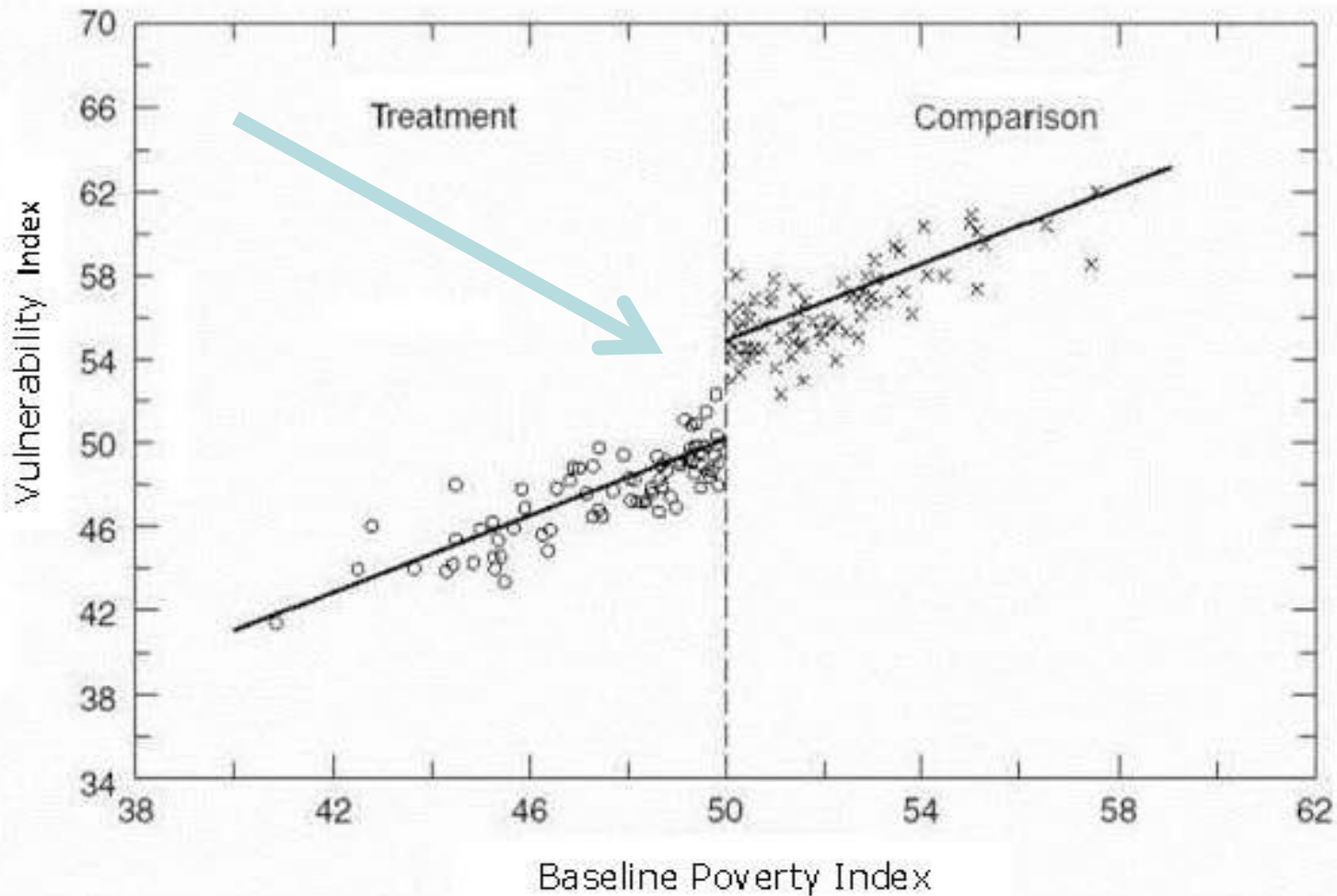
Regression Discontinuity Design



Discontinuity in eligibility for Poverty Reduction Programme



Measurement of Impact



Matching essentially constructs an artificial comparison group that has the most similar characteristics possible as the treatment group.

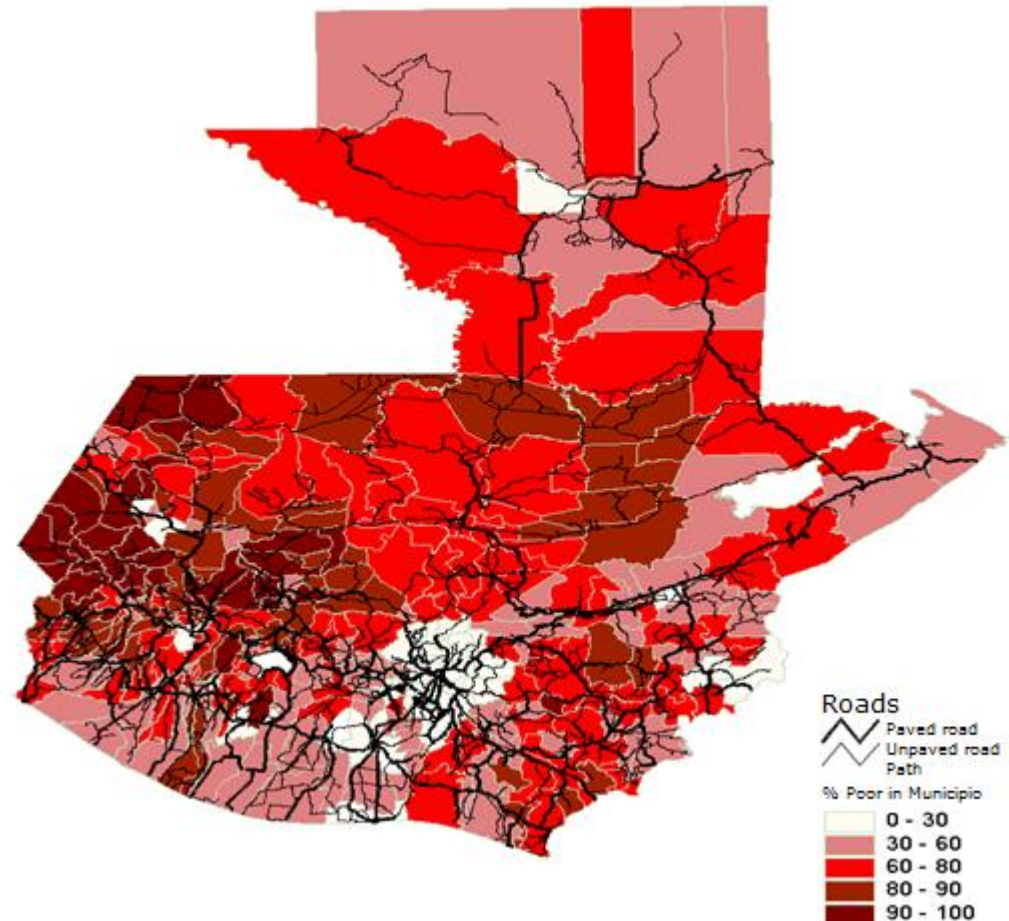
Matching Design



Treated Units			
Age	Gender	Months Unemployed	Secondary Diploma
19	1	3	0
35	1	17	1
41	0	17	1
23	1	6	0
55	0	21	1
27	0	4	1
24	1	8	1
46	0	3	0
33	0	12	1
40	1	2	0

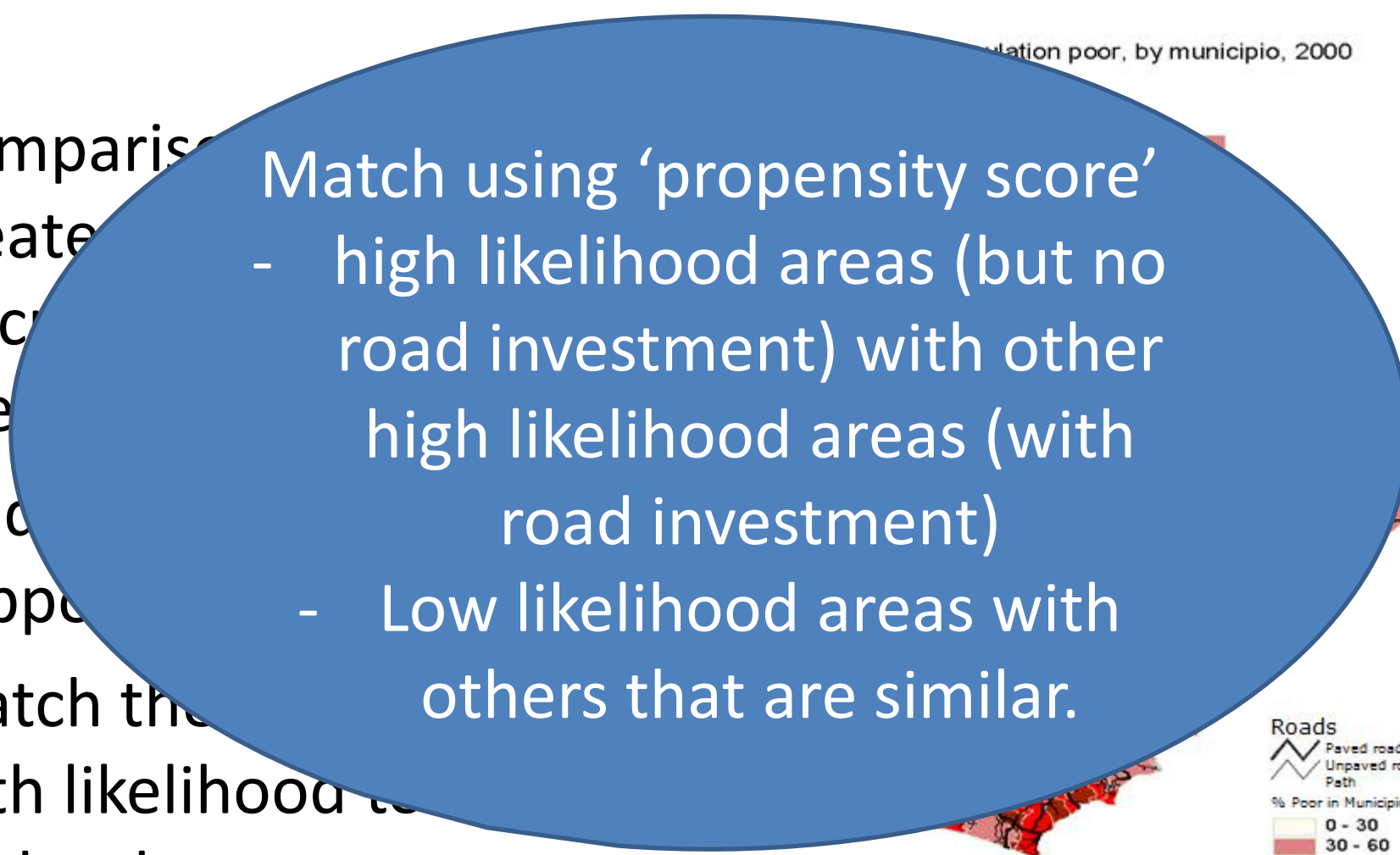
Untreated Units			
Age	Gender	Months Unemployed	Secondary Diploma
24	1	8	1
38	0	2	0
58	1	7	1
21	0	2	1
34	1	20	0
41	0	17	1
46	0	9	0
41	0	11	1
19	1	3	0
27	0	4	0

Guatemala: Percentage of population poor, by municipio, 2000
Roads



- Comparison groups created by calculating a likelihood
- Find ‘common support’
- Match the ones with likelihood to each other.

- Comparison
create
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- Find
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- Match the
with likelihood to
each other.

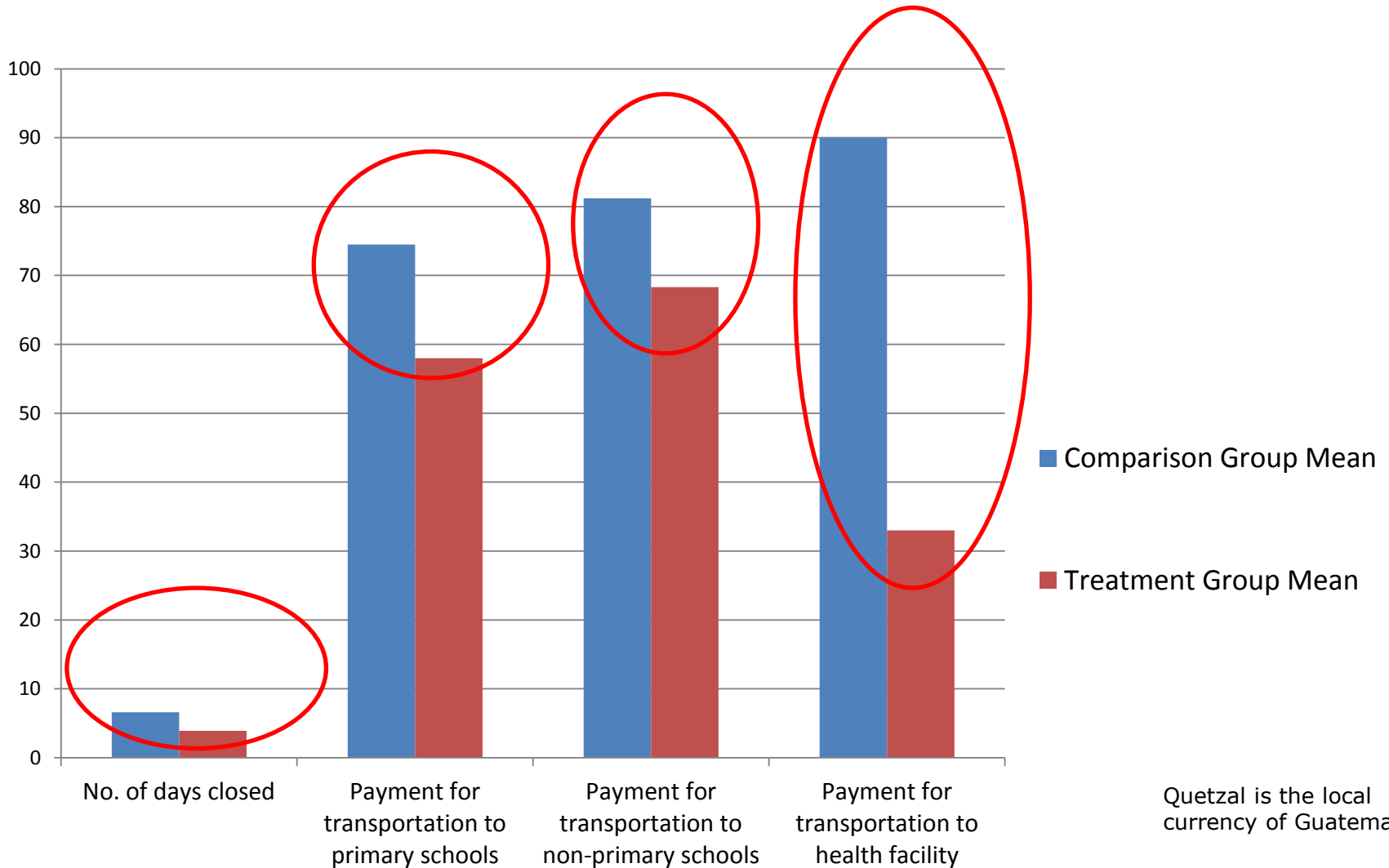


Match using 'propensity score'

- high likelihood areas (but no road investment) with other high likelihood areas (with road investment)
- Low likelihood areas with others that are similar.



Findings: Impact of road related work on poverty related indicators



Summary



- Quasi-experimental methods may be used for impact evaluations when random assignment is not possible.
- Quasi-experimental is only as robust as the data that are used for matching.
- The burden of proving that unobservable differences have been accounted for, to make 'treated' and comparison groups similar usually depends on the study authors.