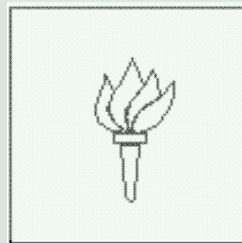# JUST A FEW THOUGHTS ABOUT ALL THIS STUFF

February, 2013

New York University
Robert F. Wagner Graduate School of Public Service

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CASE FINDING ALGORITHM
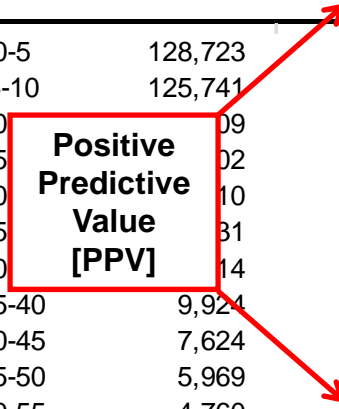## RESULTS FROM *A MULTI-HOSPITAL SYSTEM* USING ITS OWN DATA

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5-10	125,741	17.0%	99.7%	$8,078	$808	$1,212	$1,616
10-15	85,509	22.1%	88.3%	$10,281	$1,028	$1,542	$2,056
15-20	47,402	30.4%	67.3%	$14,197	$1,420	$2,130	$2,839
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45-50	5,969	58.2%	16.2%	$34,068	$3,407	$5,110	$6,814
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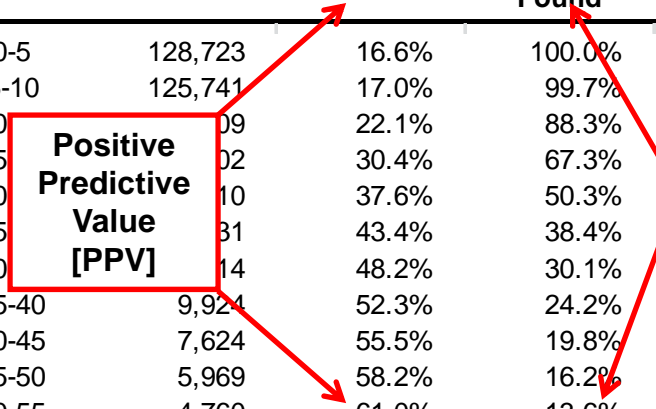| Risk Score	Number of Patients	Cummulative At Cut-Off Level					
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Positive Predictive Value [PPV]

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  - Implement in a quasi-experimental way if you can
  - Be pretty rigorous in your inclusion criteria