Research

**BMJ Global Health** 

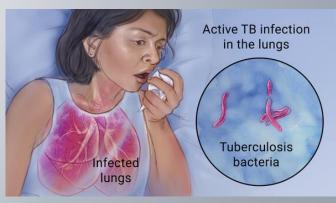
# The impact of a cash transfer programme on tuberculosis treatment success rate: a quasi-experimental study in Brazil

Daniel J Carter,<sup>1,2</sup> Rhian Daniel,<sup>2</sup> Ana W Torrens,<sup>3</sup> Mauro N Sanchez,<sup>4</sup> Ethel Leonor N Maciel,<sup>5</sup> Patricia Bartholomay,<sup>6</sup> Draurio C Barreira,<sup>7</sup> Davide Rasella,<sup>8</sup> Mauricio L Barreto,<sup>9,10</sup> Laura C Rodrigues,<sup>1,10</sup> Delia Boccia<sup>1</sup>

OBSERVATIONAL STUDIES IN ACTION
PQHS 500
2020-04-02
JESUS GUTIERREZ

#### Tuberculosis

- Caused by Mycobacterium tuberculosis (Mtb)
- Top cause of death due to infectious disease globally
- Two million deaths and 9 million new cases per year
- Transmitted through the air
- If untreated, TB disease has a mortality rate of 50%



#### Brazil

- ▶ In 2018,
  - > 95,000 new cases (68% men, 30% women, 2% children) 45 cases/100,000 individuals
  - > 6,700 deaths (including 1,900 among people with HIV)
- TB treatment coverage at 87%
- Treatment success rate at 71%

Source: WHO

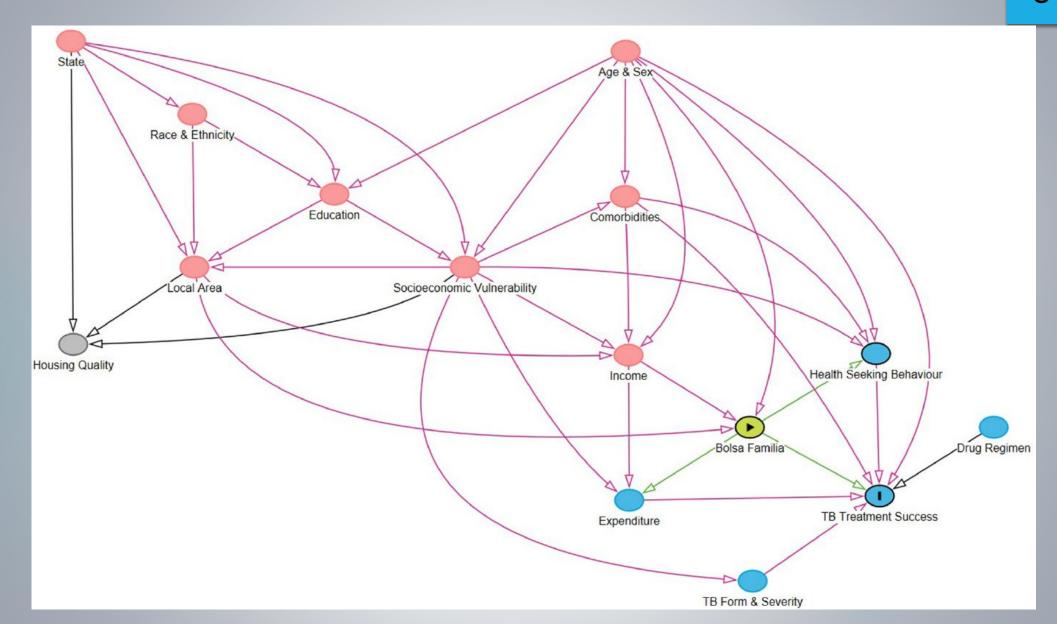
#### Background

- Limited evaluation of social protection intervention for TB prevention, care and control.
- Bolsa Familia Programme (BFP) is one of the largest conditional cash transfer programs in the world.

#### Study aims:

- Use propensity score matching to create a control group balanced for propensity to receive BFP
- Provide an estimate of the average treatment effect of BFP on TB treatment success rate among recipients
- Reflect on the utility of the resulting estimate for changing TB policy

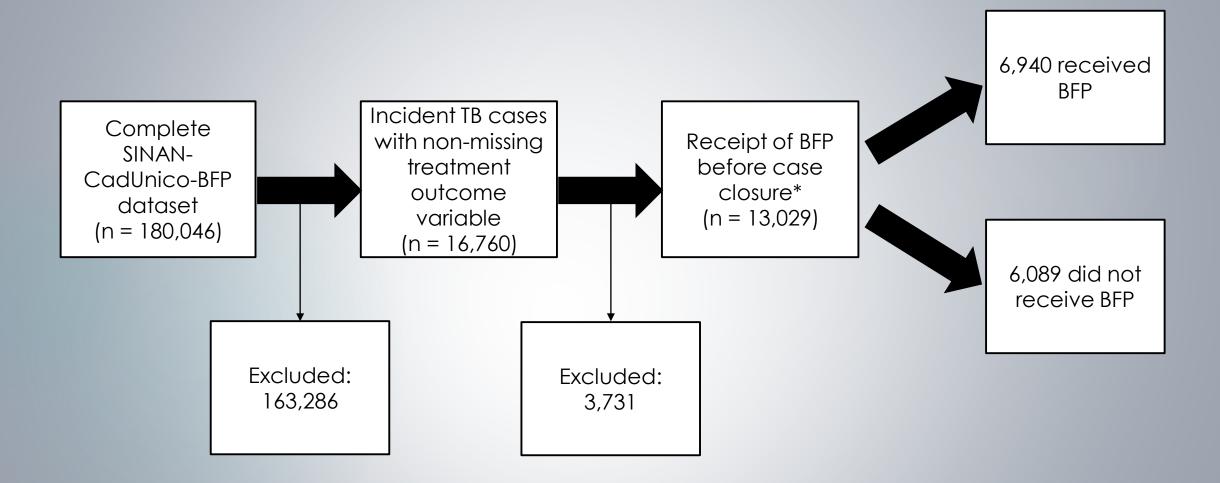
#### Conceptual Framework



#### Methods

- Linkage of two datasets
  - 2010 TB dataset from SINAN (Notifiable Disease Surveillance System)
  - 2011 CadUnico dataset registry of all low-income Brazilian families
    - Contains BFP payroll information
- Exposure: Variable monthly stipend received from BFP
- Outcome: Completion of TB treatment

#### Study Flow Diagram

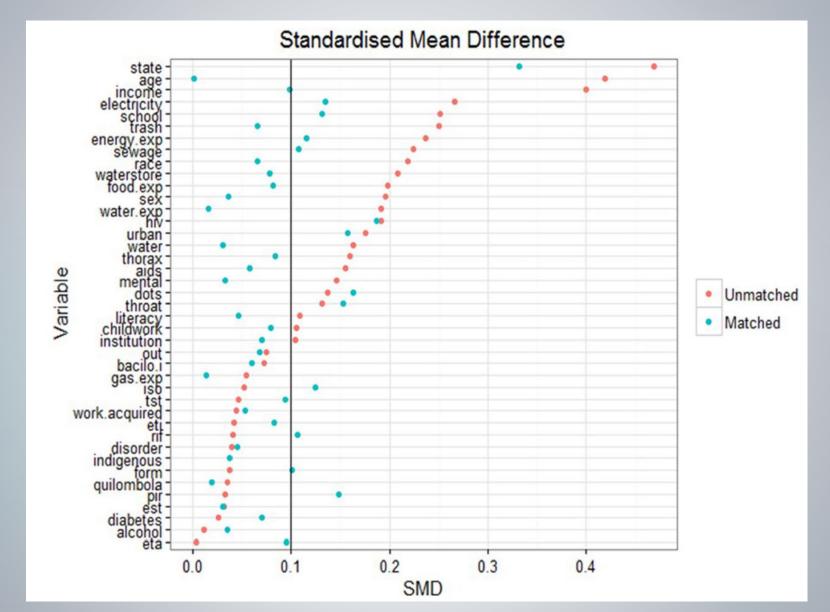


\*Case closure: date on which an outcome is recorded

#### Propensity Score Matching

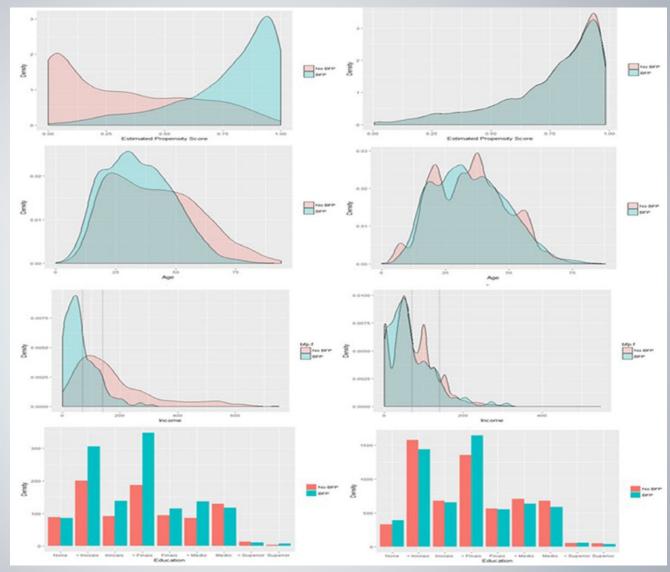
- Used 45 covariates
- Done with replacement and multiple matches to minimize bias and variance
- Used a caliper of 0.1 SD from the mean propensity score
- Multiple matches were weighted to form one matched control for each patient
- Used complete cases: 2,167 individuals at 50% missing data threshold and 3,048 individuals at 25% threshold.

#### Standardized Mean Difference



Similarities between Groups after

Matching



#### Estimating Effect of BFP

Using average effect of treatment on the treated (ATT)

Table 2 Results of propensity score matching estimates of the ATT for four models							
Models* n controls=898 n exposed=126		т	95% CI	Controls matched (unweighted), n	Exposed dropped, n	Pairs matched (weighted), n	Unique controls, n
Model A†	10.	.58	(4.39 to 16.77)	6021	109	1160	545
Model B‡	7.2	21	(1.33 to 13.09)	6468	21	1248	656 (D2)
Models* n controls=1319 n exposed=1729	ATT	95%	CI	Controls matched (unweighted), n	Exposed dropped, n	Pairs matched (weighted), n	Unique controls, n
Model C*	6.31	(1.46	to 11.16)	8895	70	1659	955
Model D*‡	7.06	(2.57	to 11.56)	9272	17	1712	1001

#### Discussion

- Among those who received BFP, all models showed substantial absolute increase in TB treatment success rate (6.3% to 10.6%)
- Impact may be higher in settings with lower baseline treatment success rates
- Profiles of TB patients who received BFP was not dissimilar to those who did not receive BFP
  - Shared vulnerability not captured by current BFP targeting and enrollment process

#### Limitations

- Did not consider dose-response relationship and assumed that receipt of any amount of financial assistance for any amount of time was enough
- Assumed that exposure received by one individual did not affect the outcome of others (although they could be living in same household, be relatives or members of the same community).
- Used a dichotomous outcome variable which did not capture full extent of potential results
- Did not consider loss to follow-up and transferred cases.

Questions?

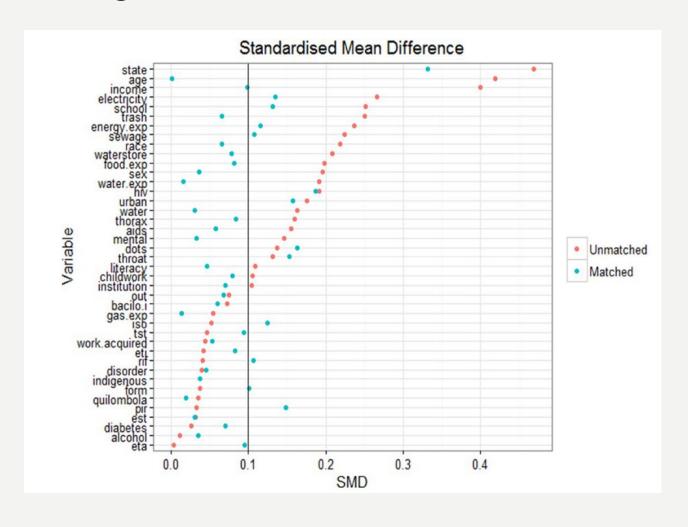
# THE IMPACT OF A CASH TRANSFER PROGRAMME ON TUBERCULOSIS TREATMENT SUCCESS RATE: A QUASI-EXPERIMENTAL STUDY IN BRAZIL

AMIN SAAD, MD
OSIA – SECOND READER
PQHS 500

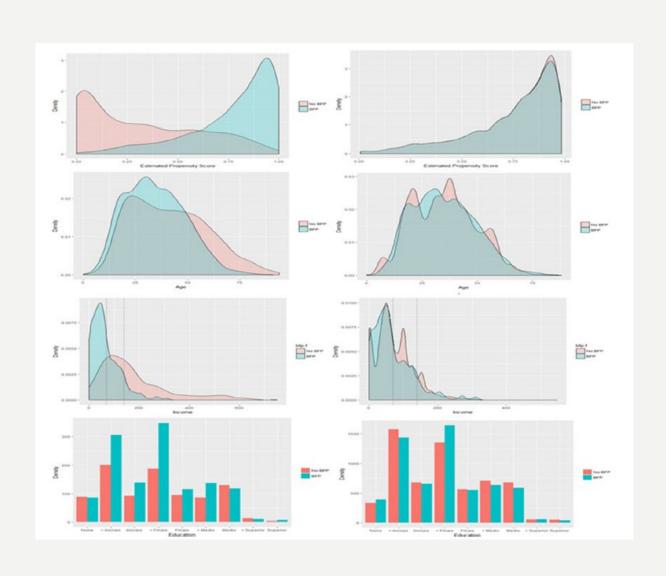
#### SUMMARY

- Background: Social protection policies such as Brazil's Bolsa Familia Programme (BFP) may play a role in tuberculosis (TB) elimination
- Aim: evaluate the effect of BFP on TB treatment success rate
- Method:
  - Data from Brazil's TB notification system (SINAN) was linked to the national poverty registry (CadUnico)
  - Propensity score weighted matching with replacement using R match and the MatchIt package
  - Exposure patients receiving BFP, outcome case closure (treated, successful completion of Rx, death)
- Main finding:
  - Patients with TB enrolled in BFP are more likely to complete their treatments successfully [range based on method from 7 to 10% difference)

# HOW GOOD IS THE BALANCE AFTER MATCHING?



# OVERLAP PLOTS SHOW 3 RANDOM VARIABLES TO SUGGEST BALANCE, WHAT ABOUT THE REST?



#### ESTIMATE OF THE BFP ON TB TREATMENT

- 50% missing vs 25% missing variable threshold
- Multiple imputation (ATT 7.22 appendix 2)
- NNT I for every 9 patients

Models*						
n controls=898 n exposed=1269	) ATT	95% CI	Controls matched (unweighted), n	Exposed dropped, n	Pairs matched (weighted), n	Unique controls, n
Model A†	10.58	(4.39 to 16.77)	6021	109	1160	545
Model B‡	7.21	(1.33 to 13.09)	6468	21	1248	656 (D2)
Models*						
n						
controls=1319			Controls matched	Exposed	Pairs matched	Unique controls, n
	ATT 959	% CI	(unweighted), n	dropped, n	(weighted), n	controls, n
n exposed=1729 Model C*		% <b>CI</b> l6 to 11.16)	(unweighted), n 8895	dropped, n	(Weighted), n	955

#### STRENGTHS AND LIMITATIONS

- I. Utilization of quasi-experimental approaches
- 2. Risk of bias is minimized with careful use of a DAG (directed acyclic graph)
- 3. Comparability of the control group
- 4. Possibility of drawing causal conclusions
  - I. Positivity (inaccurate income threshold)
  - 2. Consistency (further work need to assess dose-response relationship)
  - 3. Conditional exchangeability
  - 4. Non-interference
- 5. Limitations: quality of data (missingness), non-logitudinal data, composite outcome

#### DISCUSSION

- "... While the findings of this study are consistent with what observed in the literature, conclusions are hampered by the potential biased nature of the control group."
  - "we wish to achieve a 'balance' in these values, which may approximate the balance produced by a conventional randomized procedures"
- Linkage between two datasets that are I year apart?
- Missing completely at random
- "A sensitivity analysis was run ..."
  - "ATT was also estimated by a multiple imputation-based sensitivity analysis"
- Using all variables in the set to create a propensity score?
- "The CIs thus account for the uncertainty due to the matching procedure, but do not account for the uncertainty due to the fact that the estimated propensity score is itself a function of the data; the latter feature leads to conservative inferences.

#### **OSIA** Presentation

April 2, 2020 Laurie Ann Moennich, MPH, CPH

**Cleveland Clinic** 



# Cantillon et al. (2018)

#### 

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From the \*Cleveland Clinic, Cleveland, Ohio, †Icahn School of Medicine at Mount Sinai, New York, New York, †Sparrow Clinical Research Institute, Lansing, Michigan, §Libin Cardiovascular Institute of Alberta, Calgary, Alberta, Canada, |Aurora Medical Group, Milwaukee, Wisconsin, Premier Cardiology, Newport Beach, California, \*Huntington Memorial Hospital, Pasadena, California, \*\*Naples Community Hospital, Naples, Florida, ††Central Baptist Hospital, Lexington, Kentucky, and ‡‡Abbott, Sylmar, California.

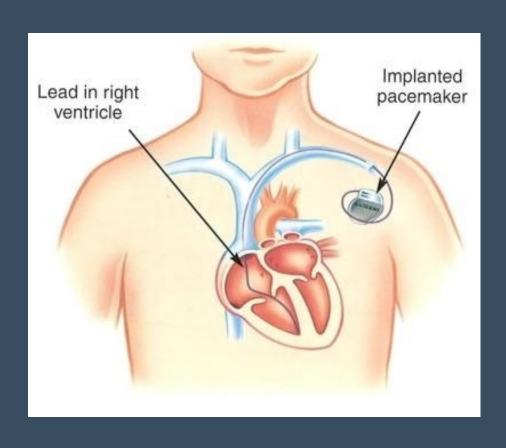




# Background

 Leadless cardiac pacemakers (LCPs) aim to reduce lead and pocket-related complications seen with transvenous pacemakers (TVPs)

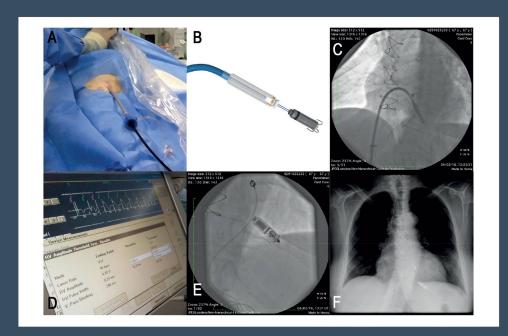
# Transvenous pacemakers (TVPs)

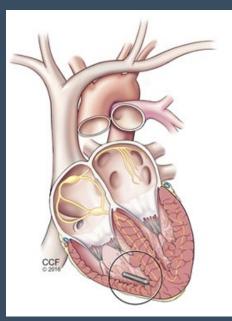


- ~ 1 million TVPs are implanted annually around the world
- Reliable, familiar technology
- Implantation technique requires the pulse generator to be implanted in a subcutaneous pocket
- Acute complications:
  - Pneumothorax, hemothorax, cardiac performation, pocket hematoma, lead dislodgement
- Long term complications:
  - Early battery depletion, lead fracture, incomplete capture, tricuspid valve regurgitation, infection

# Leadless pacemakers (LCPs)

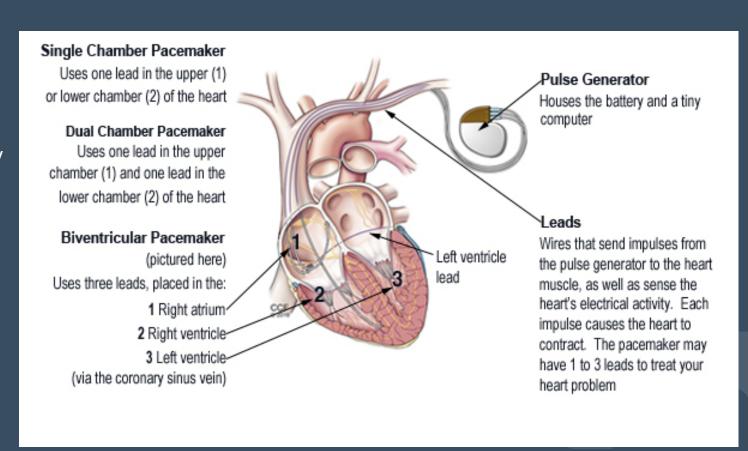
- Relatively new (and exciting!) to the EP world
- No need for a subcutaneous pocket
- No leads
- Very small (~1cm³)
- Self contained unit delivered through a transfemoral venous catheter and affixed into the right ventricle
- Complications minimized





# Can we compare LCPs and TVPs?

- Direct comparison of adverse events is limited by differences in patient populations/characteristics
  - Leadless pacemakers are typically indicated for patients who need single ventricle pacing versus TVPs (can include single, dual, and CRT pacing)
- Comparisons also limited by study design



#### Methods

- Short term and long term AEs from the Nanostim LCP are compared with conventional single chamber TVPs
  - Safety data from extended follow up of Leadless IDE trial
  - TVP data is from US insurance claims database

#### Leadless Pacemaker IDE Trial

- Patients implanted with Nanostim LCP
  - Feb. 1, 2014-Jan. 31, 2016
  - Follow up 2 wks, 6wks, 3 months, 6 months
    - Every six months till end of study.
  - Primary safety endpoint:
    - Freedom from serious adverse device event (SADE) @ 6mo post implant
    - SADE is classified as any untoward event that is related to the device or procedure
      - "serious" = led to death, life-threatening illness or injury, permanent impairment, hospitalization, and/or medical intervention



#### **TVP Data**

- Extracted from Truven Health MarketScan Research Database
  - 20 billion de-identified, person specific insurance claims from ~350 US private sector payers
- Commercial Claims and Encounters Database combined with Medicare Supplemental Database
- Patients 18 years or older
  - Implanted with single-chamber pacemaker from any manufacturer
  - ICD-9 code 37.81, 37.82 or CPT code 33207
  - Relevant co-morbidities collected from medical history prior to implant
    - atrial fibrillation, hypertension, dia- betes, coronary artery disease, vascular disease, tricuspid valve disease

#### TVP Data – Safety Data

- Complications collected from inpatient and outpatient billing codes recorded from date of implantation onward
  - Infection (device-related infection, endocarditis)
  - Thoracic trauma (pneumothorax and hemothorax from lead insertion)
  - Pocket complications (hematoma, pocket revision)
  - Electrode dislodgement
  - Venous embolism or thrombosis
  - Cardiac perforation
  - Generator complications
    - Generator explants (within 30 days = acute, within 18 months = mid-term (earlier than expected))
  - Multiple codes from the same event were counted as a single event (ex. Device infection and extraction would be one event).

# Methods (cont.) - Comparisons

- Subset of TVP patients with similar comorbidities to LCP cohort was identified.
- 2:1 propensity score matching
  - Nearest-neighbor method without replacement
- 2:1 ratio was the highest ratio for which resulting groups were wellmatched on all baseline parameters
- Covariates: age, sex, and relevant baseline comorbidities including atrial fibrillation, coronary artery disease, diabetes, hyperlipidemia, hypertension, tricuspid valve disease, and peripheral vascular disease.
- Primary outcome: overall freedom from complications
- Secondary outcome: proportion of long/short term events between groups

#### Statistical Analysis

- Continuous variables Student's t test
- Categorical variables Chi-squared test
- Proportions compared Fisher exact test
- Event rates compared Poisson regression
- Freedom from complications Kaplan-Meier method and compared between TVPs and LCPs using weighted Cox proportional hazards regression
  - Adjusted for age, sex, and baseline comorbidities
- R (😂!!!) Version 3.1.1:
  - survival
  - MatchIt
  - coxphw

# Baseline Demographic Characteristics

Characteristic	Patients with leadless pacemaker $(n = 718)$	Patients with transvenous pacemaker $(n = 1436)$	P
Age (y)	75.6 ± 11.9	76.1 ± 12.3	.39
Follow-up (d)	323 (197–489)	408 (167–547)	<.001
Sex: male	447 (62.3%)	905 (63.0%)	.77
Atrial fibrillation	425 (̀59.2%́)	881 (61.4%)	.36
Coronary artery disease	262 (36.5%)	485 (33.8%)	.23

335 (23.3%)

970 (67.5%)

266 (18.5%)

163 (11.4%)

1146 (79.8%)

.49 .55

.21

.41

Values are presented as mean  $\pm$  SD, as median (interquartile range), or as n (%).

178 (24.8%)

475 (66.2%)

557 (77.6%)

150 (20.9%)

91 (12.7%)

Baseline demographic characteristics of propensity score–matched patients

Table 1

Diabetes mellitus

Tricuspid valve disease

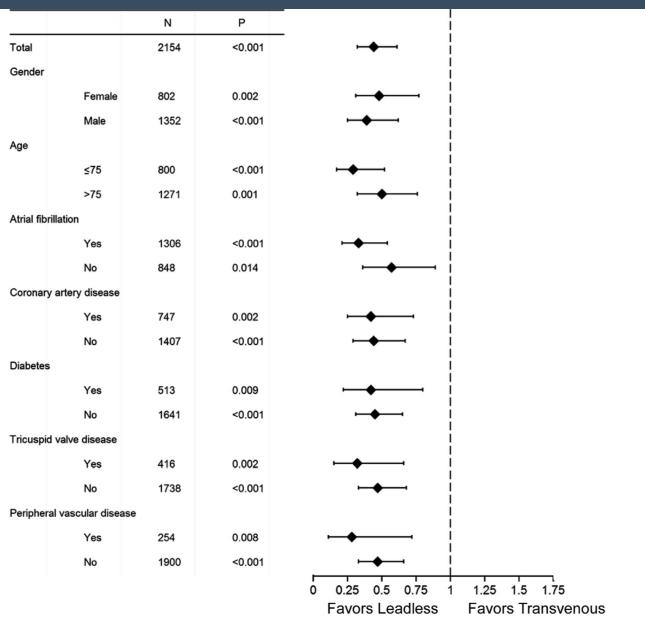
Peripheral vascular disease

Hyperlipidemia

Hypertension

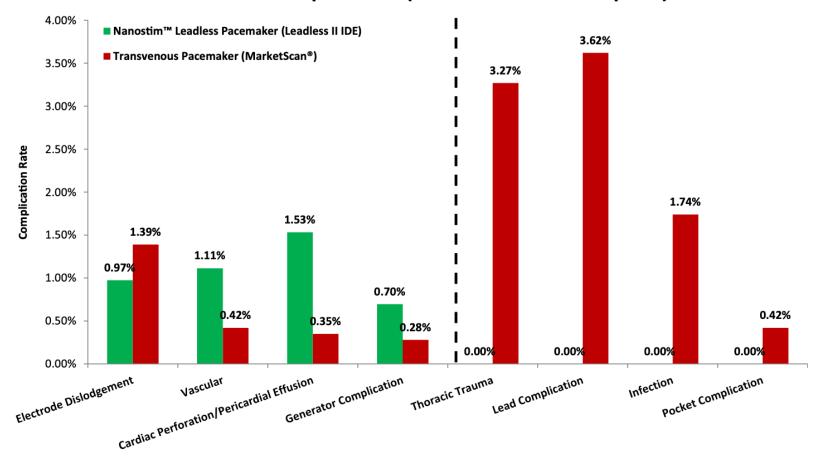
# Propensity score-matched analysis

- After applying 1:2 propensity score matching to the 9376 patients with TVPs from the unmatched analysis, the 718 patients with LCPs were matched with 1435 (15.3% of un-matched cohort) patients with TVPs with clinical characteristics as listed in Table 1.
- Fewer overall complications in the leadless group when compared with the propensity score—matched transvenous group (adjusted hazard ratio 0.44; 95% CI 0.32–0.60; P <.001).



**Figure 2** Plot presents adjusted hazard ratios and 95% confidence intervals for the risk of complication with the leadless pacemaker vs transvenous pacemaker in various patient subgroups.

#### **Short-term Complications (Within 1 Month of Implant)**



**Figure 3** Short-term complication rates presented per category for patients with leadless pacemaker and patients with transvenous pacemaker. The exact rate is shown at the top of each bar.

#### Mid-term Complications (1 month – 1.5 years after implant) 5 4.74 ■ Nanostim™ Leadless Pacemaker (Leadless II IDE) 4.5 ■ Transvenous Pacemaker (MarketScan®) 4 Complication Rate per 100 Patient-Years 3.5 3 2.59 2.5 2 1.5 1.15 1 0.5 0.31 0.36 0.29 **Generator Complication Electrode Dislodgement Pocket Lead Complication** Infection

**Figure 4** Mid-term complication rates presented per category for patients with leadless pacemaker and patients with transvenous pacemaker. The exact rate is shown at the top of each bar. One of the reported cardiac perforation complications also had an associated hemothorax as a result of a cardiopulmonary resuscitation performed during the procedure.

## Discussion

- Overall reduction in both short- and mid-term events was driven by a virtual elimination of lead, pocket, and infectious complications from LCPs
- TVPs had slightly lower rates of uncommon but potentially serious complications of pericardial effusion and vascular events
- LCPs incurred serious cardiac tearing injuries that were reduced over time with operator experience and training (better outcomes when operators did more than 10 implants)

## Limitations

- Full scope of long-term complications (including device extraction) from LCPs will not be understood for 10-15 more years.
- MarketScan databases are not a random sample but a large cohort from large employers
  - Underrepresented: self-insured and small/medium employers
  - Excluded: Medicare Advantage and traditional Medicare plans
- Repeat SAEs could have been accidentally treated as same instance = undercounting
- Single complications with encounters on nonconsecutive services dates
   possible over counting

## Limitations (cont.)

- Differing definitions of complications and types that can occur between the pacemaker groups
- LEADLESS II study SAEs adjudicated by independent committee, TVP SAEs not adjudicated
- LEADLESS II trial may have had more experienced operators,
   TVP operators could be from wider background of experience

## Cleveland Clinic

Every life deserves world class care.

# Comparative study of acute and mid-term complications with leadless and transvenous cardiac pacemakers (2) (40)

Daniel J. Cantillon, MD, FHRS,\* Srinivas R. Dukkipati, MD, FHRS,† John H. Ip, MD,‡ Derek V. Exner, MD, FHRS,§ Imran K. Niazi, MD, Rajesh S. Banker, MD,¶ Mayer Rashtian, MD, FHRS,# Kenneth Plunkitt, MD, FHRS,\*\* Gery F. Tomassoni, MD, FHRS,†† Yelena Nabutovsky, MS,‡‡ Kevin J. Davis, BS,‡‡ Vivek Y. Reddy, MD†

OSIA 2<sup>nd</sup> Reader Presentation
PQHS 500
Sofija Conic

#### Overview

- Study Objective
- Key Takeaways
- Limitations
- Future Studies

#### Study Objective

**OBJECTIVE** The purpose of this study was to compare complications between the LCP cohort from the LEADLESS Pacemaker IDE Study (Leadless II) trial and a propensity score–matched realworld TVP cohort.

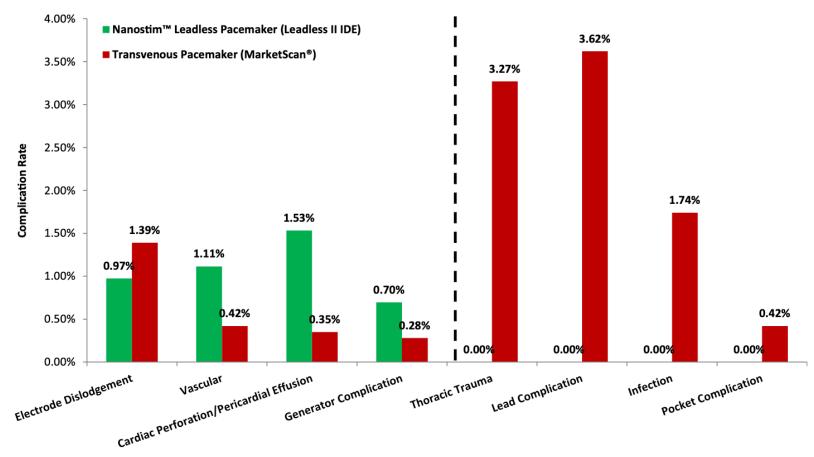
#### Key Takeaways

- Patients with LCPs experienced fewer complications overall (hazard ratio 0.44; 95% confidence interval 0.32–0.60; P < .001)
- In both the short and mid term time frames, the LCP group had **no lead-related, pocket-related, and infectious complication**s. In the TVP group there were:
  - 2.59 lead-related complications per 100 patient-years (n = 36)
  - 0.29 electrode dislodgements per 100 patient years (n = 4)
  - 1.15 pocket complications per 100 patient years (n = 16)
  - 4.74 infections per 100 patient years (n = 66)

### Key Takeaways

- Short term (<30 days):</li>
  - Short-term complications were greatly reduced in the LCP cohort (5.8% vs 9.4%; P = 0.01)
  - However, there was a higher rate of pericardial effusions (1.53% vs 0.35%, P = .005) in the LCP group
  - There were similar rates of vascular events (1.11% vs 0.42%; P = .085), dislodgments (0.97% vs 1.39%; P = .54), and generator complications (0.70% vs 0.28%, P = 0.17)
  - LCPs had no thoracic trauma compared to patients with TVPs (rate of thoracic trauma 3.27%)

#### **Short-term Complications (Within 1 Month of Implant)**



**Figure 3** Short-term complication rates presented per category for patients with leadless pacemaker and patients with transvenous pacemaker. The exact rate is shown at the top of each bar.

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**Figure 4** Mid-term complication rates presented per category for patients with leadless pacemaker and patients with transvenous pacemaker. The exact rate is shown at the top of each bar. One of the reported cardiac perforation complications also had an associated hemothorax as a result of a cardiopulmonary resuscitation performed during the procedure.

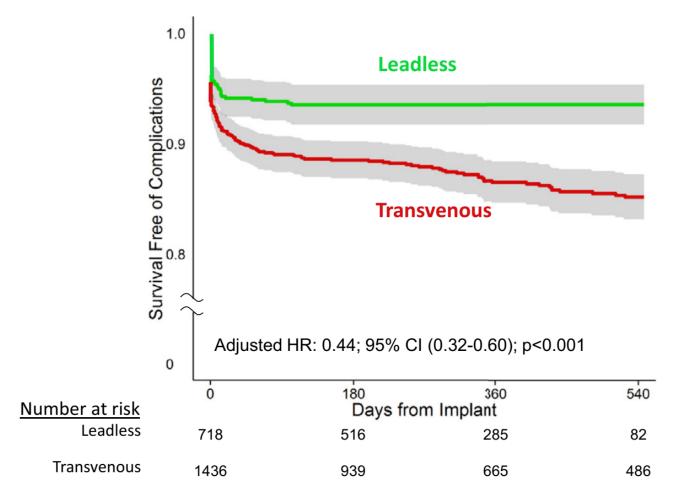
**Pocket** 

**Lead Complication** 

Infection

**Electrode Dislodgement** 

**Generator Complication** 



**Figure 1** Kaplan-Meier curve (with 95% CI) illustrates that patients with LCPs were at a lower risk of experiencing a complication than were patients with TVPs. The Cox proportional hazards result is adjusted for age, sex, and baseline comorbidities. The starting point for the curves is the implantation of the device for both the LCP and TVP cohorts. CI = confidence interval; HR = hazard ratio; LCP = leadless pacemaker; TVP = transvenous pacemaker.

#### Propensity Score Matching

• 1:2 propensity score matching

 Table 1
 Baseline demographic characteristics of propensity score–matched patients

Characteristic	Patients with leadless pacemaker $(n = 718)$	Patients with transvenous pacemaker $(n = 1436)$	Р
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Hyperlipidemia	475 (66.2%)	970 (67.5%)	.55
Hypertension	557 (77.6%)	1146 (79.8%)	.25
Tricuspid valve disease	150 (20.9%)	266 (18.5%)	.21
Peripheral vascular disease	91 (12.7%)	163 (11.4%)	.41

Values are presented as mean  $\pm$  SD, as median (interquartile range), or as n (%).

#### Limitations – Data Source Differences

- LCP data came from LEADLESS II clinical trial, which only included the Nanostim LCP device – is it unique?
- LEADLESS II trial had scheduled follow up at 2 weeks, 6 weeks, 3 months, and every 6 months
- Different levels of surgical experience in academic centers/research hospitals – lower complications because of more experience?
- TVP data originated from insurance claims database
  - Not a random sample of claims data primarily drawn from large employers
  - Patients did not have scheduled follow up
- Can we compare these cohorts?

#### Limitations - Insurance Claims Data (TVP)

- Claims data is collected for billing
- Limited clinical data
  - Cannot identify complications requiring surgical management
  - No information on atrial fibrillation severity
  - No record of patient death
- Complications were identified by ICD codes
  - Did the researchers successfully identify all complications of interest?
  - Cannot definitively associate every complication with the TVP implant
  - Multiple diagnostic and procedure codes observed on the same or consecutive service dates were treated as a single occurrence, so repeat occurrences could be undercounted
  - Single complications with encounters on nonconsecutive service dates could be overcounted
  - There were complications in the LCPs group that could not have been quantified in patients with TVPs, including 5 instances of arrhythmia during implantation (0.70%), 2 acute migrations during implantation (0.28%), 1 angina event (0.14%), and 3 transient neurological events (0.42%).

#### Limitations – Device Differences

- Different types of complications occur with the different pacemaker systems
  - Different implantation technique/surgery types
  - "...the implantation technique involving a subcutaneous pulse generator and transvenous lead has remained unchanged and is the most common source of complications, occurring in up to 12% of device recipients."
- Can we compare these devices?

#### **Future Studies**

- Longer follow-up duration
  - Complications were only evaluated for 18 months after implantation
  - Does not address long term complications such as battery depletion, lead fracture, incomplete capture, tricuspid valve regurgitation, infection, etc.
- Look at cohorts that were collected in a similar way
  - Possibly compare insurance claims data for LCPs vs TVP
  - This would produce cohorts with more comparable populations, follow up limitations, surgeon skill, etc.