



# Conducting Full-Spectrum Translational Research: Big Data Meets Embedded Mechanistic Studies

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Albert Einstein College of  
Medicine/Montefiore Medical Center

Translational  
Science 2019



# Session Goals

1. Describe the RU-CDN Full-Spectrum Translational Research Team Science Model
2. Discuss CTSA-PBRN Engagement & Collaboration Process: Partnerships and Priorities
3. Illustrate the RU-CDN Full-Spectrum Translational Research Team Science Model with a case study of the “Bariatric Metabolic Outcomes Project” (BMOP)
4. Provide personal reflections on each of our experiences with this collaboration



# BUILDING COMMUNITY-ACADEMIC TRANSLATIONAL RESEARCH PARTNERSHIPS

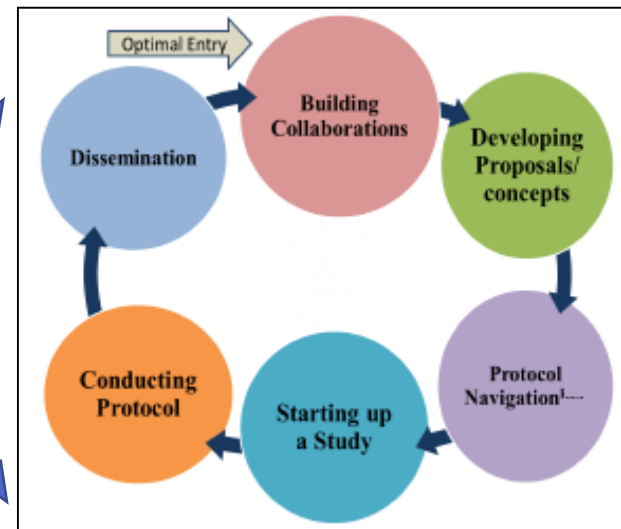
## CDN/N<sup>2</sup> = PBRN INFRASTRUCTURE<sup>1</sup>

- Quality Improvement
- Clinical Outcomes
- Comparative Effectiveness Research
- Patient Centered Outcomes Research (CER/PCOR)
- Training Clinician Investigators
- Implementation Science
- Disseminating Methods & Clinical Outcomes Results



## ROCKEFELLER = CTSA INFRASTRUCTURE<sup>2</sup>

- Laboratory Investigation
- Mechanistic Questions
- Protocol Navigation
- Clinical Scholars
- Bioinformatics/Phenotyping
- Disseminating Translational Research Methods



=

**CEnR**

CER/PCOR  
+  
Embedded  
Mechanistic  
Studies

*CEnR-Nav Process (CEnR-Nav)<sup>2</sup>  
[Investigators and partners  
may enter at any stage]*



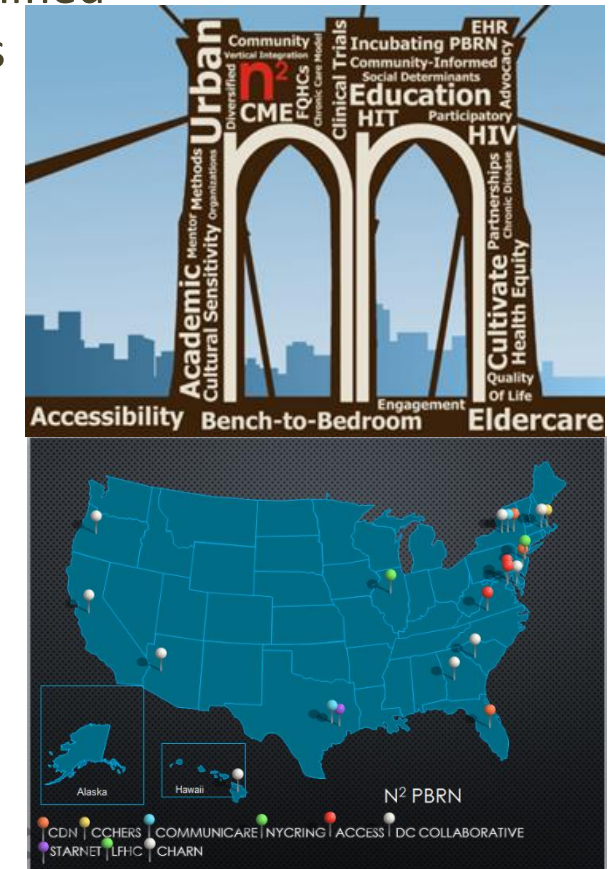


# *The Rockefeller University*

- Unique structure
  - 82 heads of labs
  - 25 Nobel prizes, 22 Lasker Awards, 20 National Medals of Science
  - 100+ year tradition of translational research
  - 40 bed JCAHO-accredited research-only hospital
  - AAHRPP-accredited
- 250 protocols
  - 80% investigator - initiated
  - 20% phase I, II, III or device trials
- Center for Clinical Translational Science, 2006 -
  - Community Engaged Research Core

## CDN N<sup>2</sup>: Building a Network of Safety Net PBRNs AHRQ Center of Excellence for Practice-based Research and Learning

- ▶ **A Practice-based Research Network (PBRN)** that works with Federally Qualified Health Centers (FQHCs) and other Primary Health Care Safety-net Practices
- ▶ **Research Infrastructure to build a Learning Healthcare System**
- ▶ **A collaboration among:**
  - Access Community Health Network (ACCESS)
  - Alliance of Chicago (ALLIANCE)
  - Association of Asian Pacific Community Health Organization (AAPCHO)
  - Center for Community Health Education Research and Service (CCHERS)
  - **Clinical Directors Network (CDN) [LEAD PBRN]**
  - Community Health Applied Research Network (CHARN)
  - Fenway Institute (FENWAY)
  - New York City Research and Improvement Group (NYCRING)
  - Oregon Community Health Information Network (OCHIN)
  - South Texas Ambulatory Research Network (STARNet)
  - One Florida







## NYU Langone Hospital— Brooklyn

[View All Locations \(2\)](#)

📍 150 55th Street  
Brooklyn, NY 11220

☎ 718-630-7000

[View All Contact Info](#)



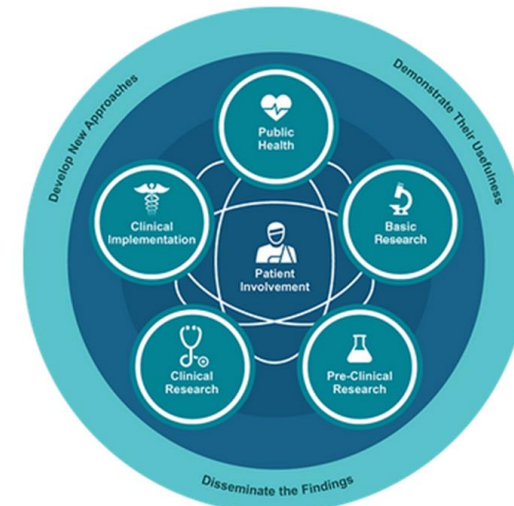
## Bariatric Surgery for Obesity

Doctors at NYU Langone's [Weight Management Program](#) and [Weight Management Program at NYU Langone Hospital—Brooklyn](#) may recommend bariatric, or weight loss, surgery for people with severe obesity—defined as having a [body mass index](#) (BMI) of 40 or greater—who are having trouble losing weight after trying other treatments for at least six months. Surgery may also be recommended for people who have a BMI of 35 to 39 and an obesity-related condition, such as [type 2 diabetes](#), [hypertension](#), [coronary artery disease](#), severe osteoarthritis, or [obstructive sleep apnea](#).

**Formerly:  
Sunset Park Family  
Health Center  
Network  
and  
Lutheran Medical  
Center**

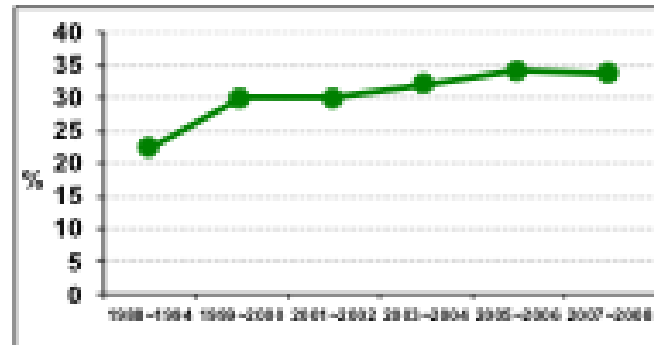
# Key Attributes of the RU-CDN Translational Research Model

- Conducting rigorous practice-based comparative effectiveness/health outcomes research in collaboration with academic investigators, community-based clinicians and staff, patients, and other stakeholders
- Engaging FQHCs and Primary Care Clinicians as investigators
- Embedding basic science & mechanistic questions into clinical studies conducted in practice-based settings

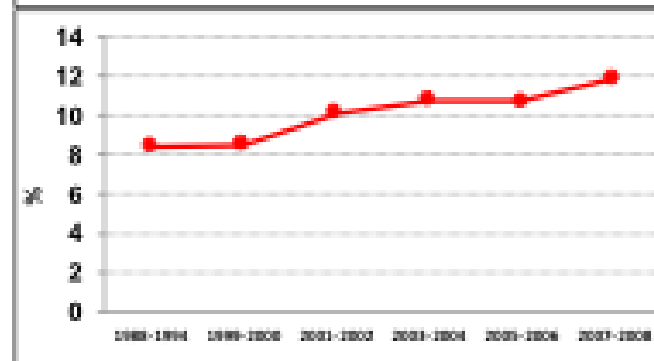


# The Deadly Trio

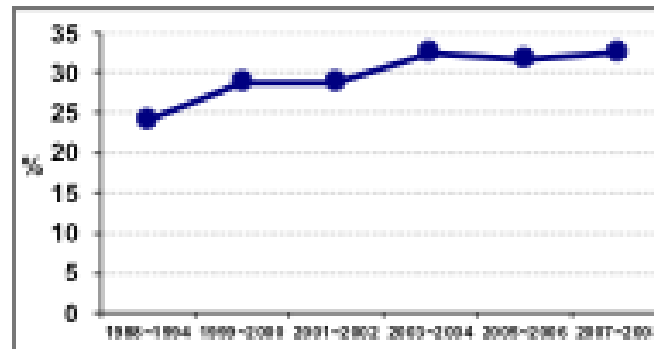
**HEALTH  
2014  
Obesity**



**Diabetes**



**Hypertension**



Source: CDC, 2016



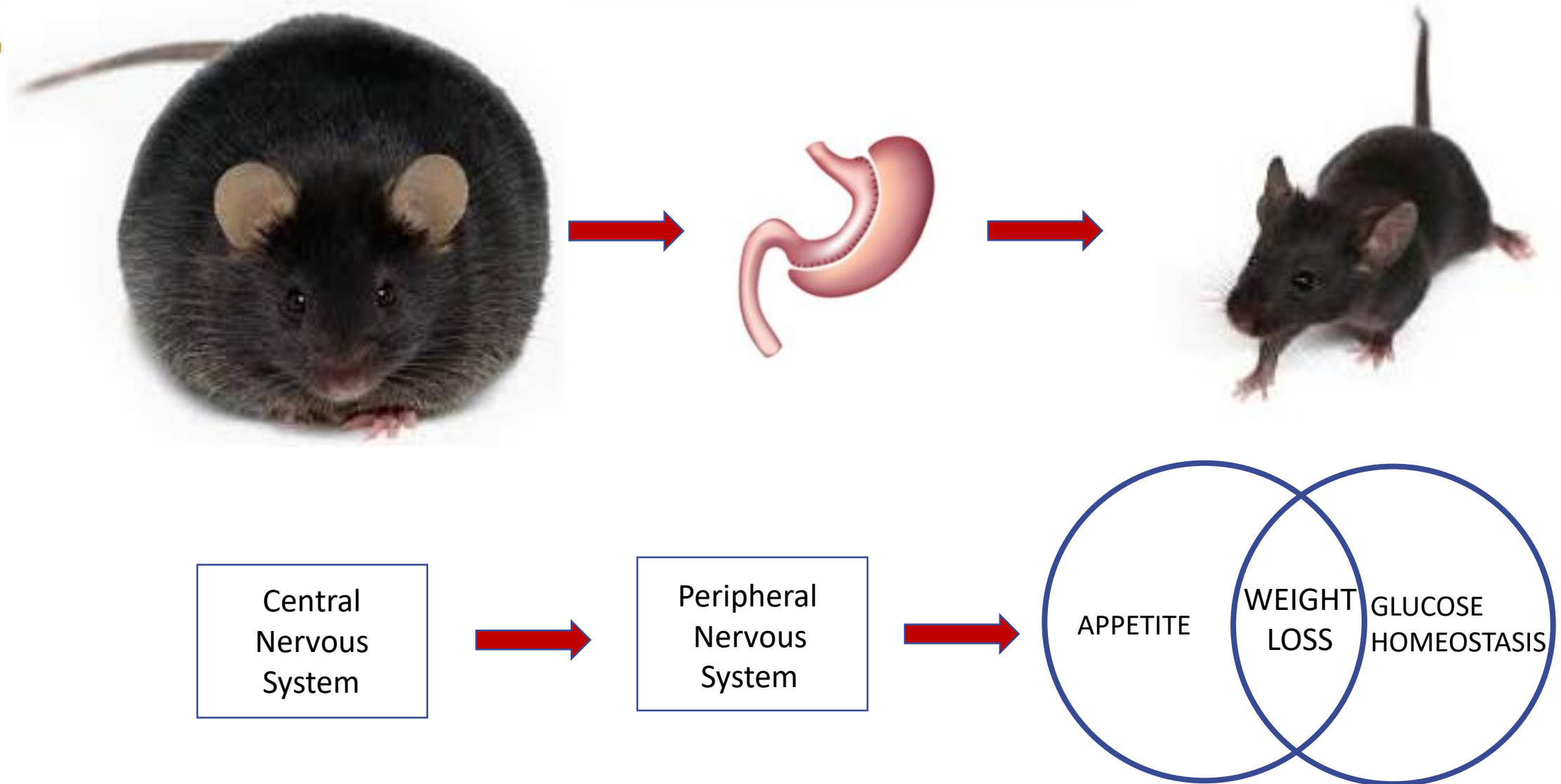




# The Process

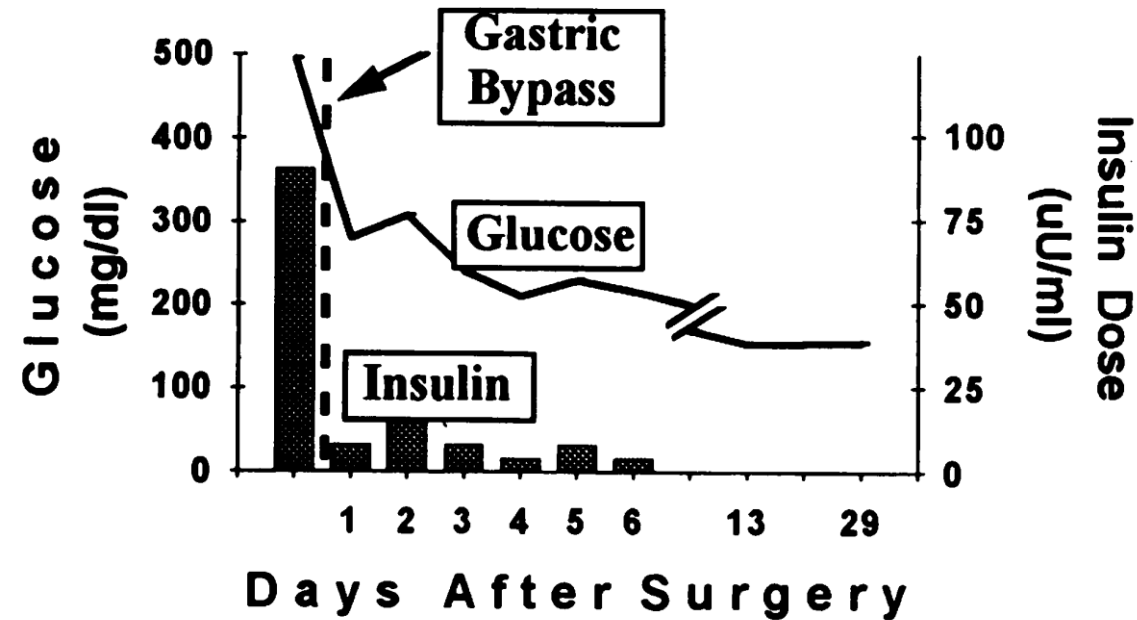
- Team Meetings with NYU-Lutheran Family Health Center and Hospital primary care physicians, medical and surgical specialists, social workers, nutritionists, psychologists and IT experts serving bariatric patients
- Collaborated on the:
  - Bariatric Metabolic Outcomes Project (BMOP)
  - NYC-CDRN Obesity Pilot Project
  - PCORnet Bariatric Surgery (PBS) Project

# How the collaboration began



# Early glycemic effects of bariatric surgery in humans

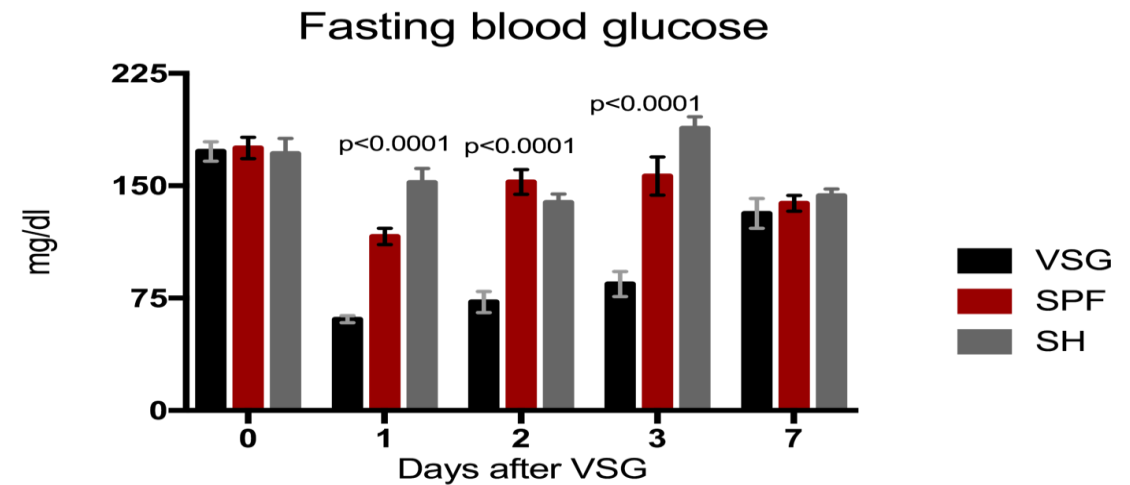
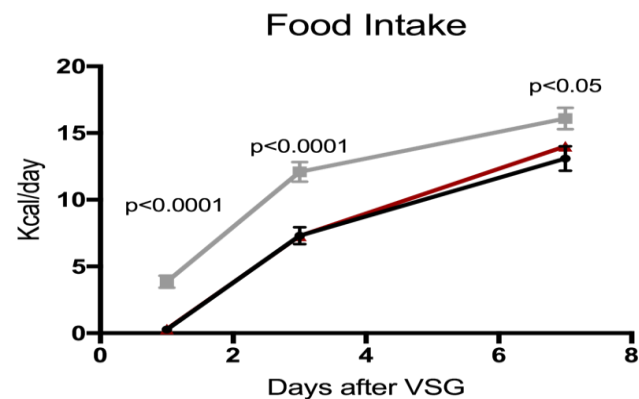
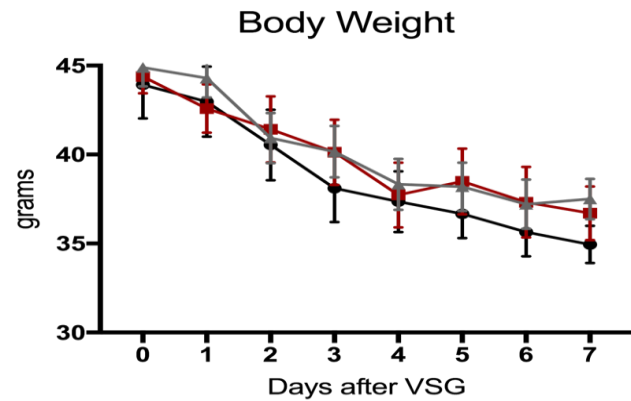
Vol. 222 • No. 3



Pories et al, 1995

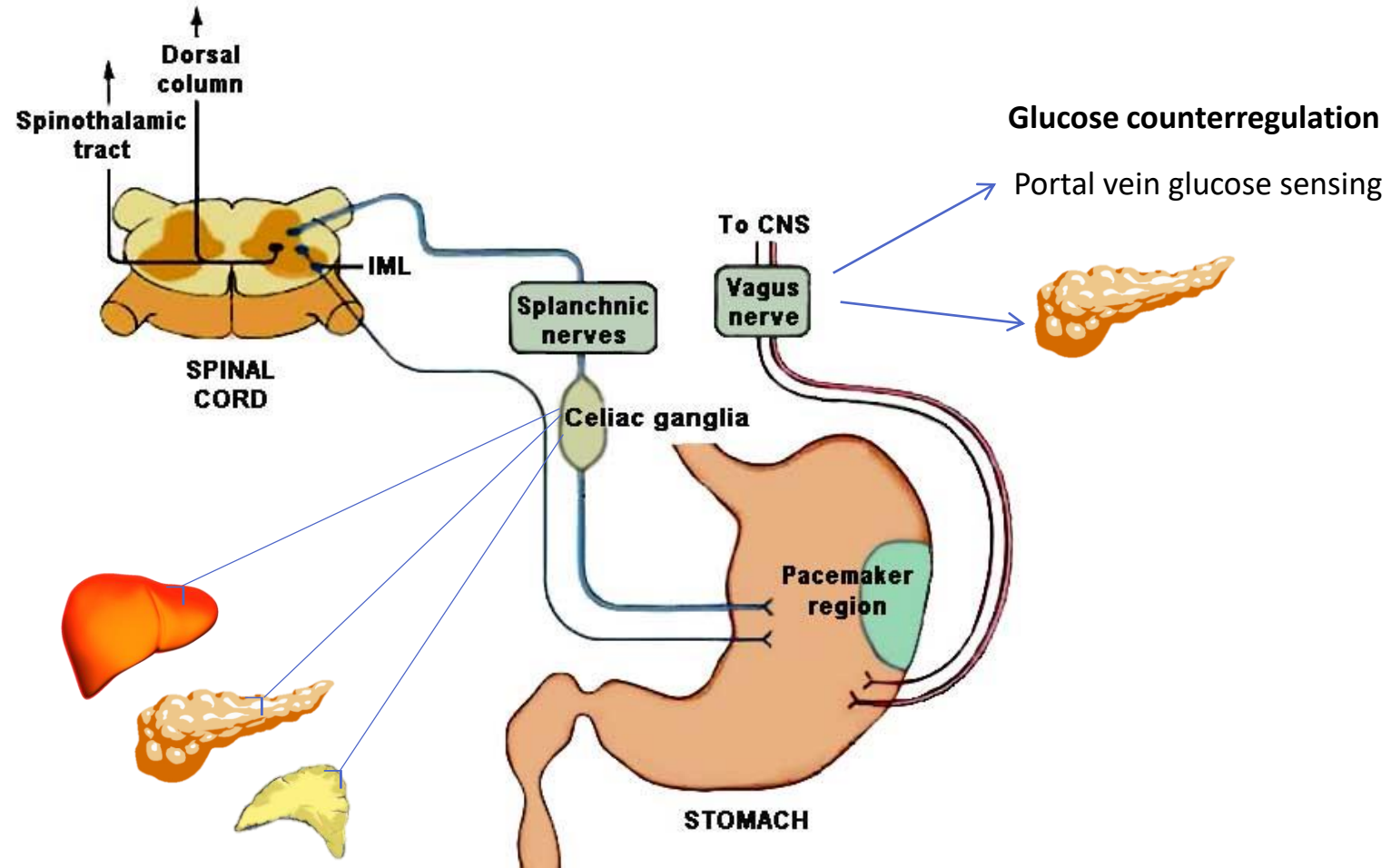
# Early glycemic effects of bariatric surgery in rodents

## Early Findings after VSG





# Gastric innervation and glucose homeostasis



**Glucose counterregulation:**  
sympathoadrenal response and increased  
hepatic glucose output

Fujita & Donovan, 2005; Kumukara, 2013; Taborsky, 2015  
Image adapted from Clinicalgate.com, chapter by Kenneth Koch



# Primary goal of starting community engagement project

- Goal was to test hypothesis that bariatric surgery led to a defect in glucose counter-regulation
- Identify bariatric patients in the community that would be eligible for a hypoglycemic clamp study at baseline and 6 months after the surgery
- Strategy of collaboration involved meeting with group at community health center to present our ideas and listen to their own ideas of what should be studied.



# Bariatric Metabolic Outcomes Project (BMOP)

- Interdisciplinary group, including gastroenterologists, surgeons, internists, family medicine practitioners, endocrinologists, nutritionists, psychologists, IT professionals
- Lively discussion about obesity and its management
- Discussions led to hypothesis generation on outcomes, as well project ideas involving:
  - sleep apnea
  - joint mobility early after surgery in rheumatoid arthritis
  - body image after bariatric surgery
  - diabetes
  - renal function
  - stress associated with voluntary food restriction/dieting



# Clinical Observations Proposed by NYU/Lutheran Bariatric Program Clinicians

| Medical Specialty | Variables of Interest (Hypotheses)                      |
|-------------------|---|
| Pulmonary         | Changes in continuous positive airway pressure (CPAP) ? |
| Rheumatology      | Improvement in joint symptoms ?<br>Increased mobility ? |
| Endocrinology     | Hypoglycemia?   |
| Mental Health     | Depression and suicide?                                 |





# Study Proposal - Feasibility

The group hypothesized that patient baseline clinical and laboratory characteristics may accurately inform who will respond to bariatric surgery with significant and sustained metabolic improvement.



# EHR Study

## **Inclusion Criteria**

EHR data from November 2010- to December 2014

One of the following procedures:

- RYGB - 43644
- VSG - 43775
- LAGB - 43770

Baseline evaluation:

- With pre-surgical (within 3 months prior to surgery) evaluation
- With at least two clinical evaluations post-surgery (within 6 months post surgery)
- Follow-up could be in Surgery, Primary Care, Cardiology, Endocrinology, Nephrology

Diagnosis:

- Obesity – 278.00
- T2DM – 250.00



# Variables Extracted from EHRs

- **Demographics**: age, gender, ethnicity, insurance, zip code
- **Medical**: hypertension, diabetes, diabetes duration, dyslipidemia, OSA, use of CPAP, diagnosis of RA, depression
- **Clinical characteristics**: weight, BMI
- **Prescription drugs**: anti-hypertensives, anti-diabetics, statins, fibrates, niacin, weight loss, aspirin, steroids
- **Laboratory parameters**: hemoglobin A1C, fasting blood glucose, CBC, CMP, cholesterol, triglycerides, PHQ2/9

# BMOP Results – proof of principle

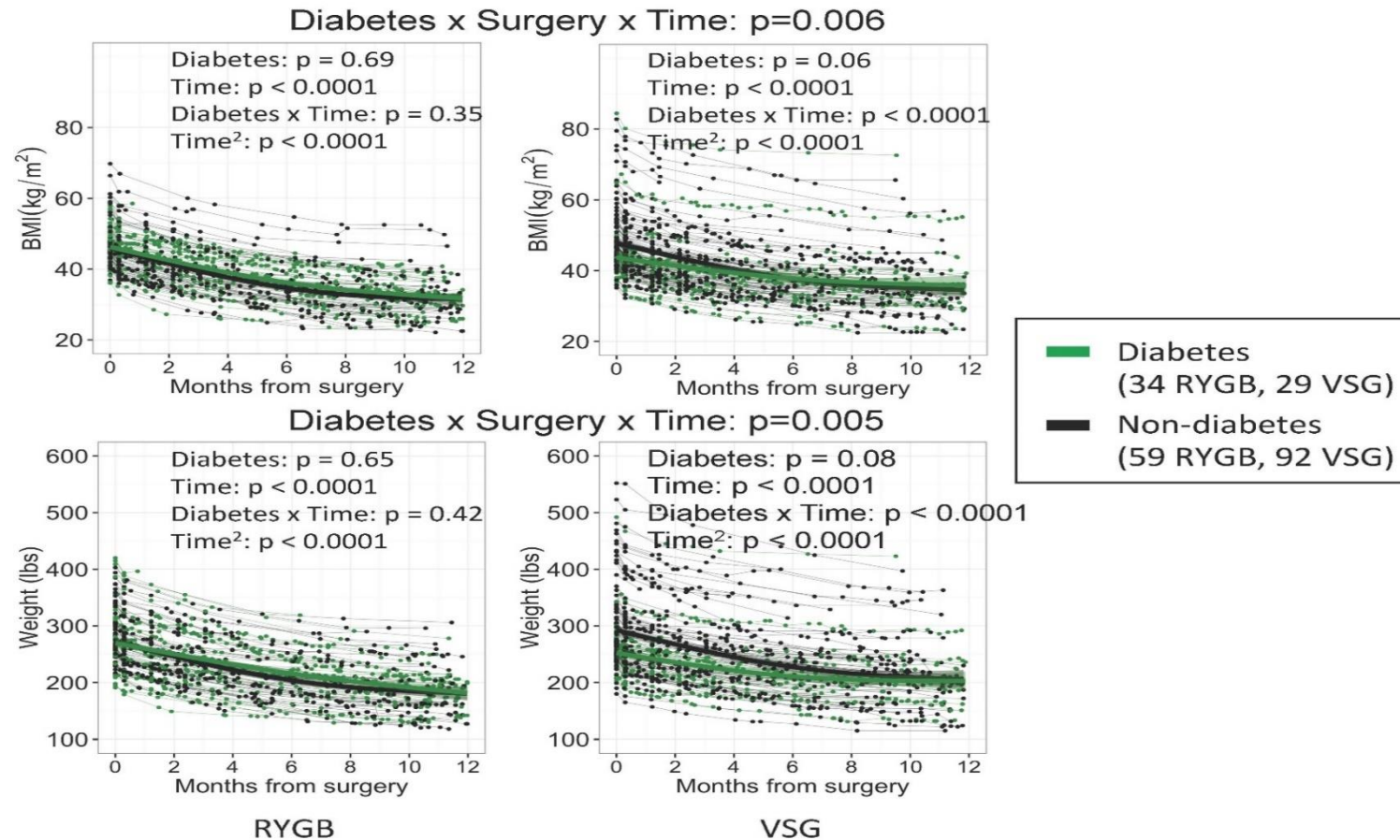
**Table 1. Clinical Characteristics of the Patients at Baseline**

| Characteristic                        | RYGB<br>(n = 93) | VSG<br>(n = 121) | P-value     |
|---------------------------------------|------------------|------------------|-------------|
| <b>Demographics, Vitals, and Labs</b> |                  |                  |             |
| Age (years)                           | 42.2 ± 10.5      | 38.9 ± 11.4      | <b>0.03</b> |
| Female                                | 83 (89.2%)       | 99 (81.8%)       | 0.13        |
| Hispanic ethnicity                    | 50 (53.8%)       | 57 (47.1%)       | 0.57        |
| BMI (kg/m <sup>2</sup> )              | 47.8 ± 6.6       | 48.4 ± 9.4       | 0.58        |
| Weight (lbs)                          | 283.3 ± 54.1     | 293.8 ± 73.4     | 0.25        |
| Systolic BP (mm Hg)                   | 124.2 ± 15.5     | 124.1 ± 16.3     | 0.98        |
| Diastolic BP (mm Hg)                  | 77.4 ± 8.4       | 77.1 ± 8.5       | 0.80        |
| Hemoglobin A1c (%)                    | 8.0 ± 1.8        | 6.9 ± 0.8        | <b>0.04</b> |
| Glucose                               | 126.7 ± 34.4     | 111.5 ± 42.5     | 0.18        |
| <b>Comorbid Conditions</b>            |                  |                  |             |
| Depression                            | 17 (18.3%)       | 22 (18.2%)       | 0.99        |
| Diabetes                              | 34 (36.6%)       | 29 (24.0%)       | <b>0.05</b> |
| Hyperlipidemia                        | 29 (31.2%)       | 28 (23.1%)       | 0.19        |
| Hypertension                          | 46 (49.5%)       | 52 (43.0%)       | 0.35        |
| Hypertriglyceridemia                  | 3 (3.2%)         | 3 (2.5%)         | 1.00        |
| Sleep apnea                           | 51 (54.8%)       | 73 (60.3%)       | 0.42        |

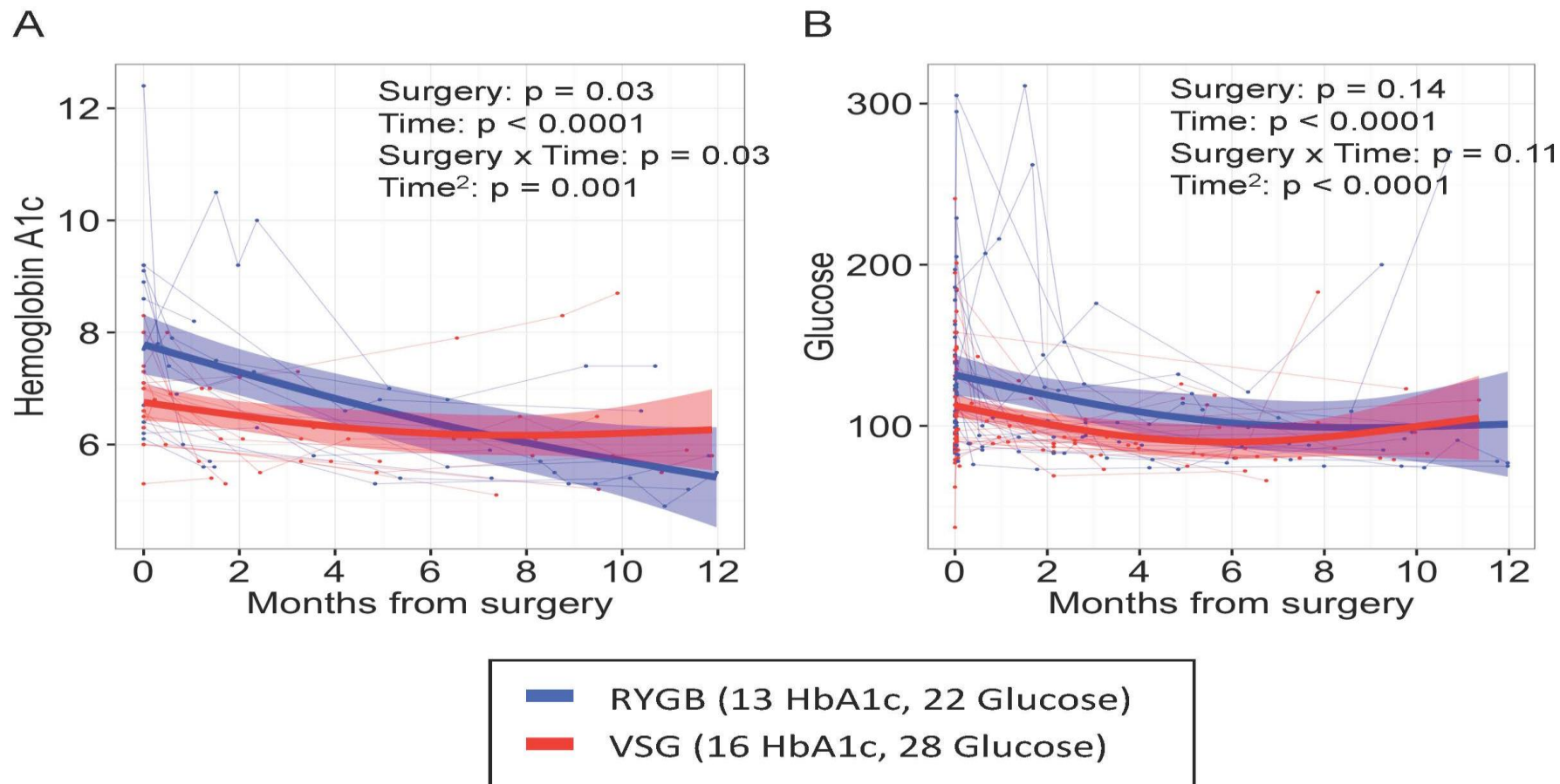
Data are presented as mean ± SD for continuous variables or n and percentage for categorical variables. Abbreviations: RYGB, Roux-en-Y gastric bypass; VSG, vertical sleeve gastrectomy; BMI, body mass index; BP, blood pressure.



# BMOP Results – proof of principle



# BMOP Results – proof of principle



# Bariatric Metabolic Outcomes Project Dissemination: Live CME at NYU Lutheran & Webinar

## Speaker:

**Ana B. Emiliano, MD MS**

Instructor in Clinical Investigation  
The Rockefeller University

## Moderator:

**Rabih Nemr, MD FACS**

Department of Surgery  
Associate Program Director  
Surgery Program  
NYU Lutheran

*May 24, 2017 – 5PM-6PM*



Translational  
Science 2019

**CDN**  
CLINICAL DIRECTORS NETWORK  
www.CDNetwork.org

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## Metabolic Outcomes of Bariatric Surgery

### Bariatric Metabolic Outcomes Project - BMOP

**Speaker:**  
Ana B. Emiliano, MD, MS  
Instructor in Clinical Investigation  
The Rockefeller University

**Moderator:**  
Rabih Nemr, MD  
Department of Surgery  
Surgery Program Associate Program Director  
NYU Lutheran

**Speakers:**  
Ana Emiliano, MS, MD  
Instructor in Clinical Investigation, The Rockefeller University

**Moderated by:**  
Rabih Nemr, MD

<https://www.CDNetwork.org/library/metabolic-outcomes-of-bariatric-surgery>

**Recent Webcasts**

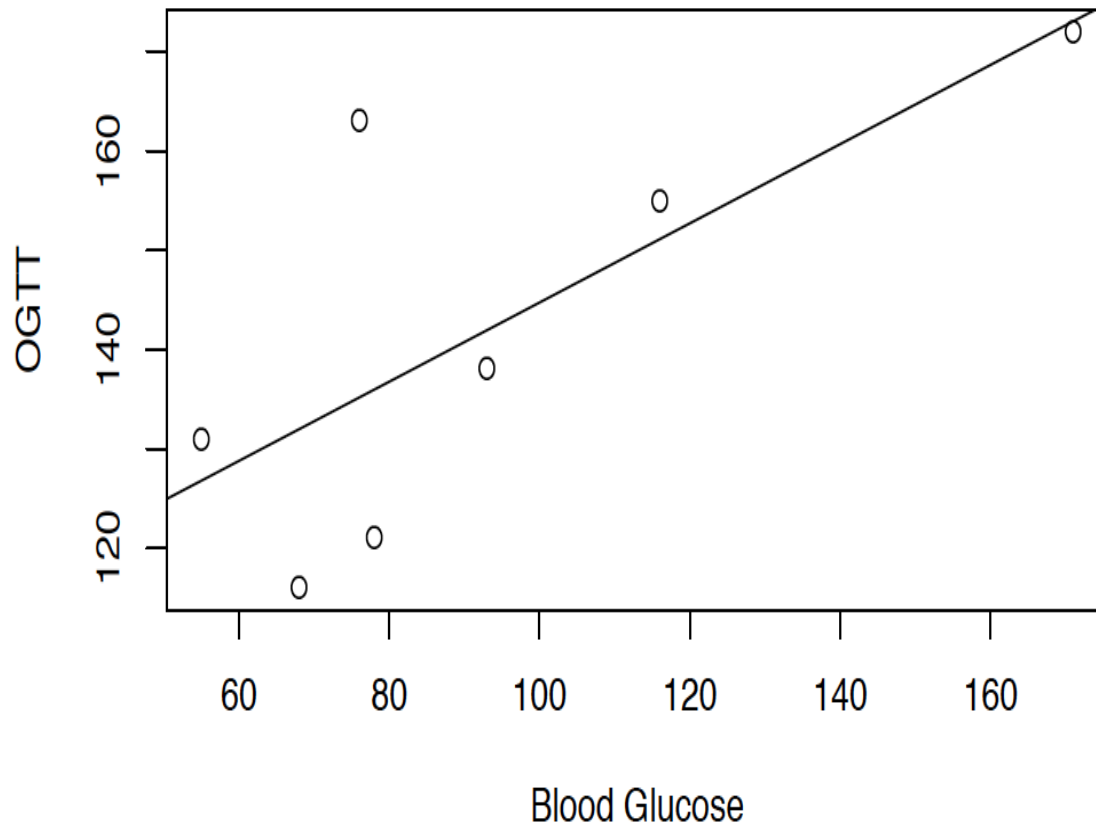
Pre-Exposure Prophylaxis (PrEP): Best Practices for Pharmacists  
December 13, 2018

PrEP Pre-Exposure Prophylaxis Rolling out a PrEP Program in a FQHC by Engaging Front Line Staff  
November 27, 2018

Taking the Pain out of P-values  
November 9, 2018

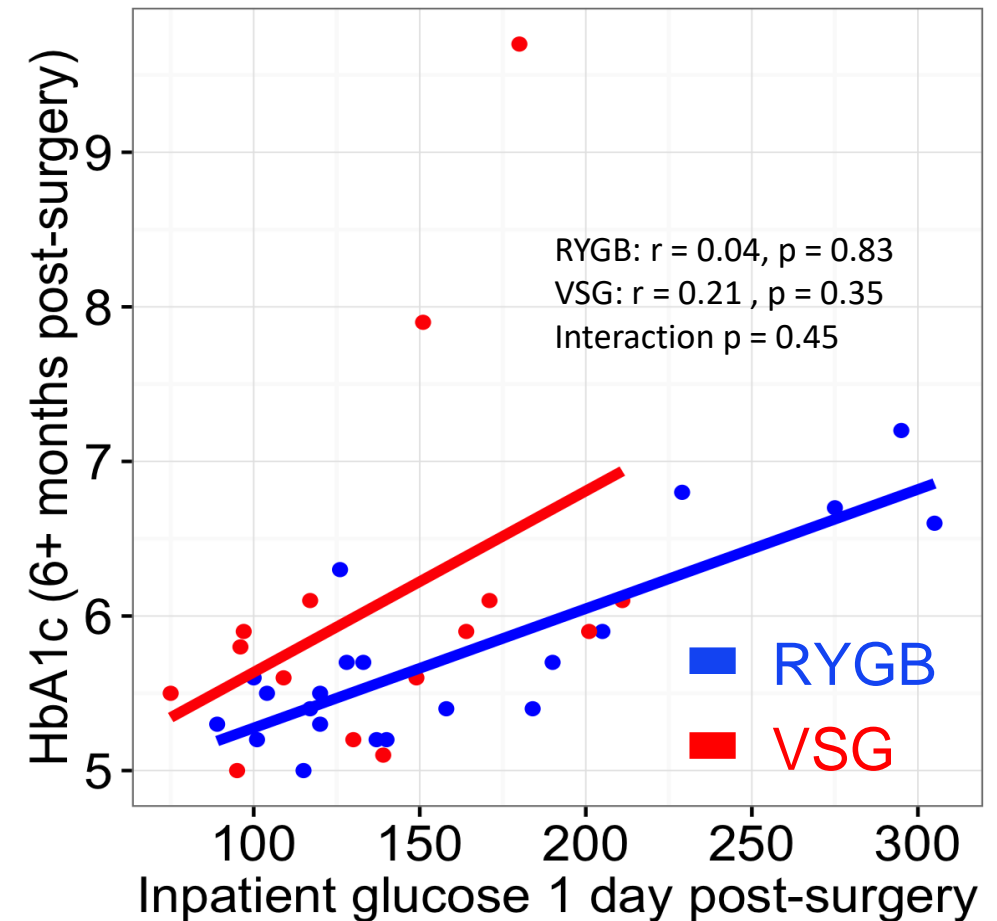
# Integrative Translational Science

## Mouse Model Results



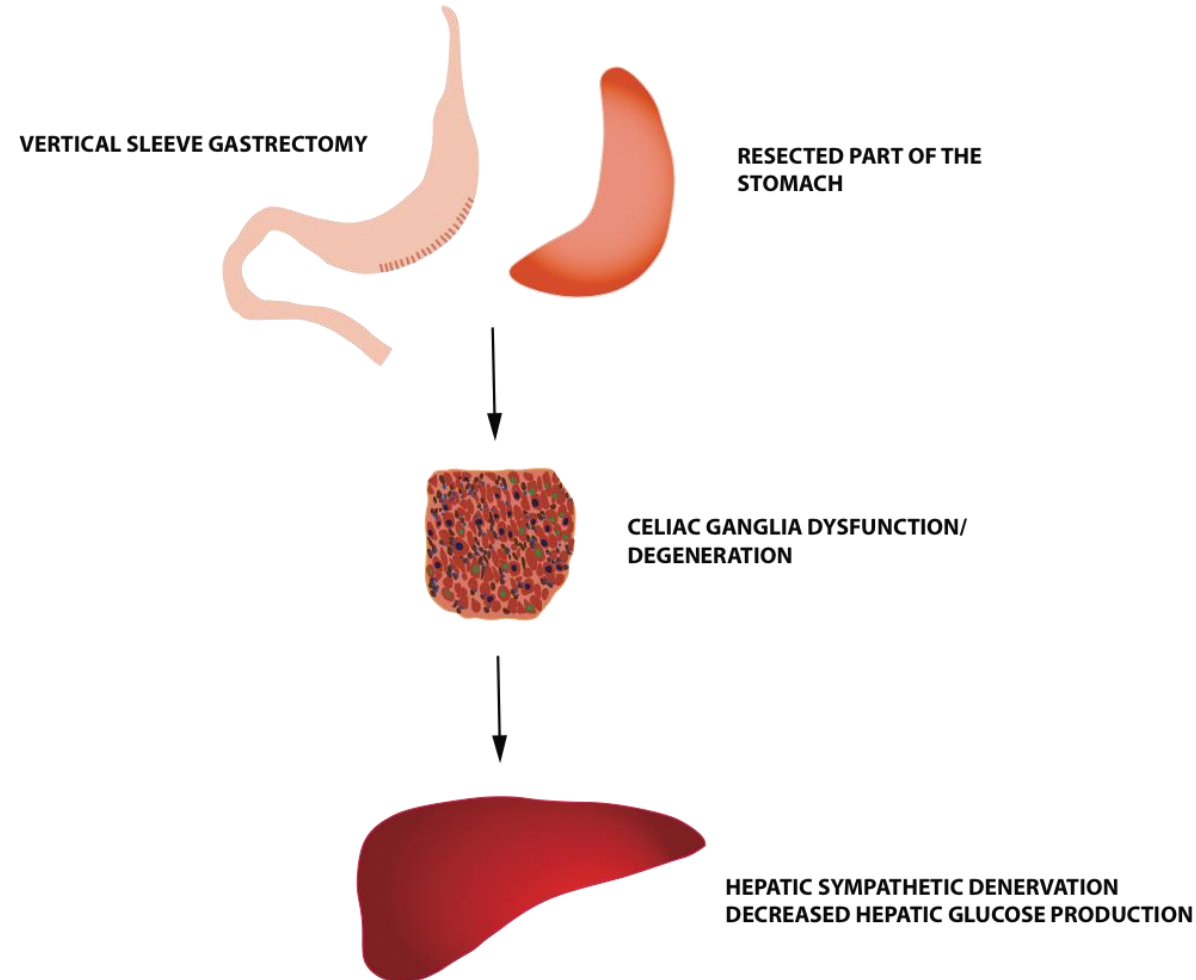
Correlation between blood glucose on the first post-operative day after sleeve gastrectomy in DIO mice and the 120 minute-time point of the OGTT on post-operative day 35. Correlation 72%,  $p=0.06$ .

## Human Results (CDN/NYU Lutheran EHR)

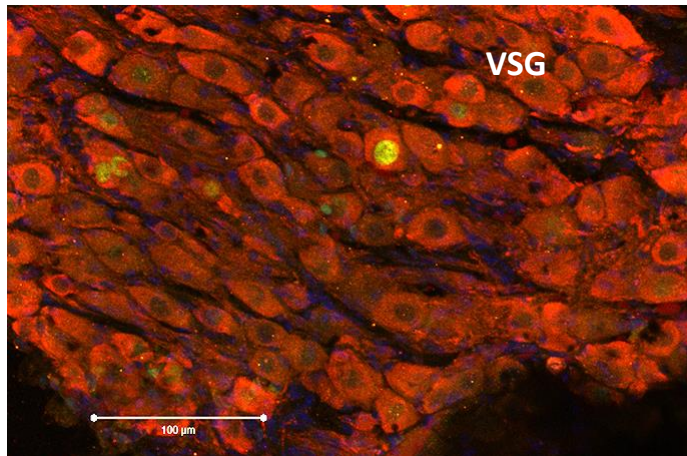
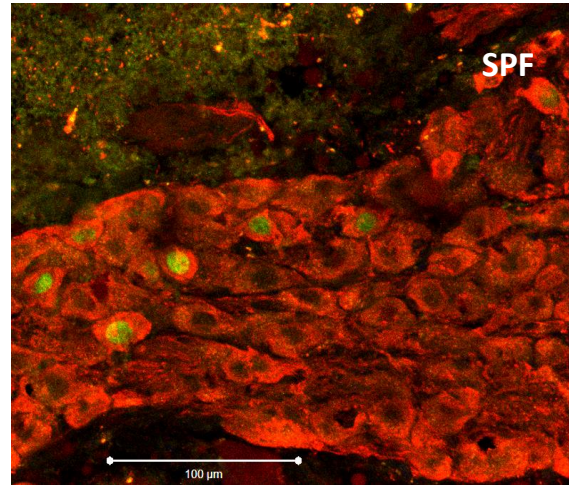
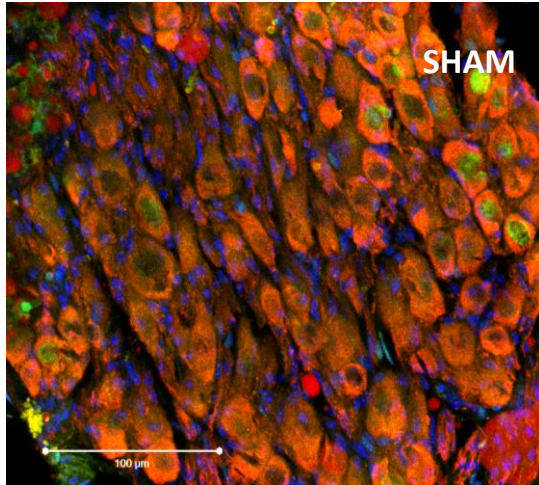




# Integrative Translational Science

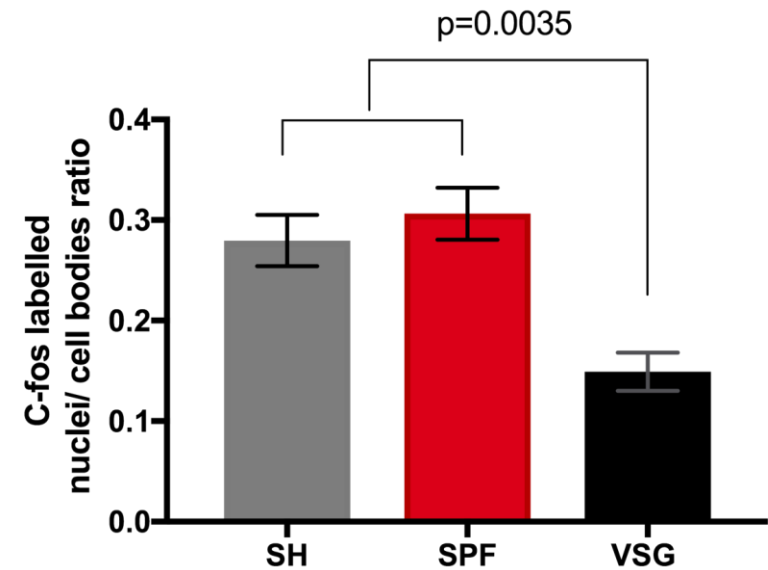


# Integrative Translational Science

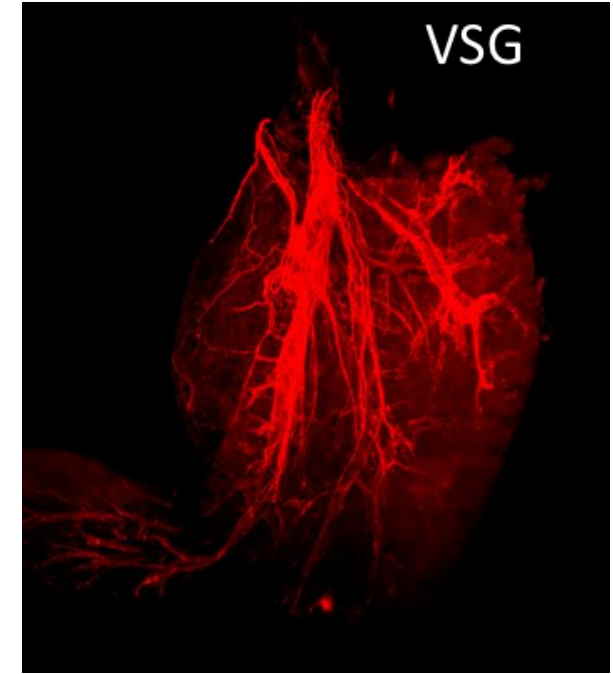
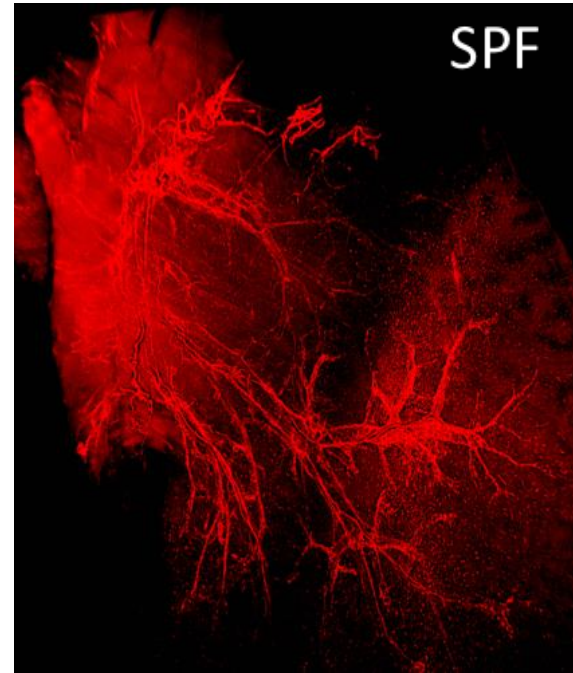


**CELIAC GANGLIA  
AFTER 2-DG INJECTION**

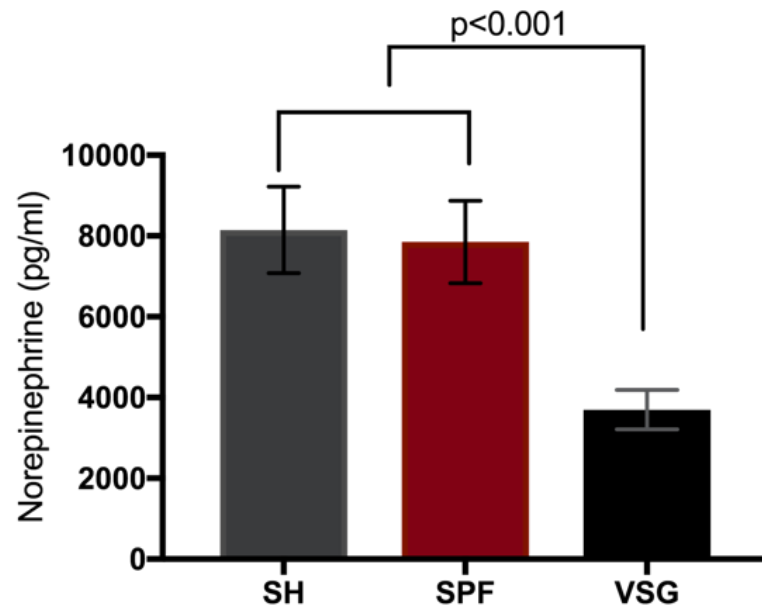
**CELIAC GANGLIA ACTIVATION AFTER 2-DG INJECTION**



## Hepatic tyrosine hydroxylase-labeled fibers

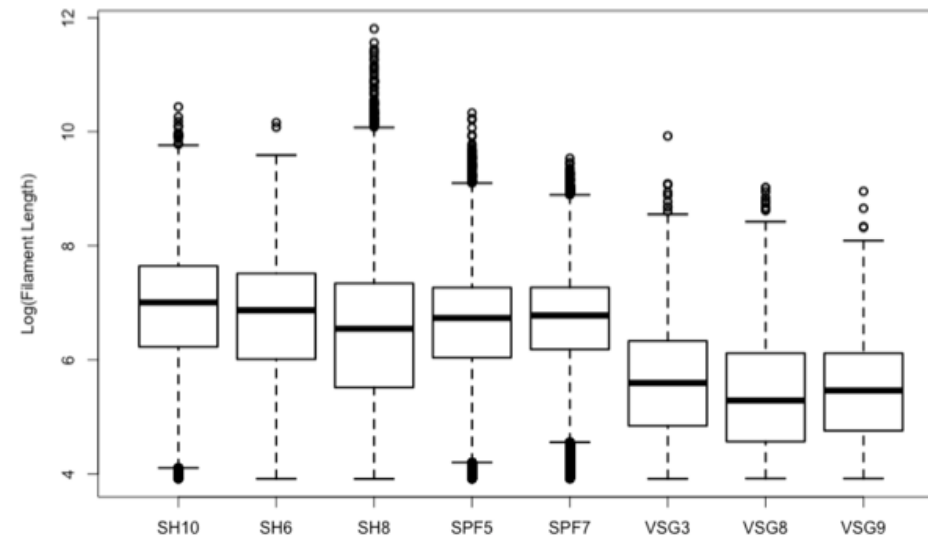


### LIVER NOREPINEPHRINE CONTENT



Norepinephrine content by HPLC 30 days after VSG

*Emiliano et al, manuscript in preparation*



SH vs. SPF:  $p=0.75$   
SH vs. VSG:  $p=0.0002$   
SPF vs. VSG:  $p=0.0005$



# Collaboration outcomes

- It was not possible to directly test my initial hypothesis and perform hypoglycemic clamp before and after bariatric surgery – not financially feasible
- BMOP EHR analysis results validated our approach in the sense that what we found replicated the literature on bariatric surgery outcomes
- Very early glycemic outcomes as predictor of long term glycemic outcomes provides a potential mechanistic link between our laboratory finding and improved glucose homeostasis after bariatric surgery



## Surgical Treatment of Obesity: Bariatric Surgery



Vertical banded  
gastroplasty



Laparoscopic adjustable  
gastric band



Vertical sleeve  
gastrectomy



Jejunioileal bypass



Bilio pancreatic  
diversion



BPD With  
doudenal switch



Roux-en-Y  
gastric bypass

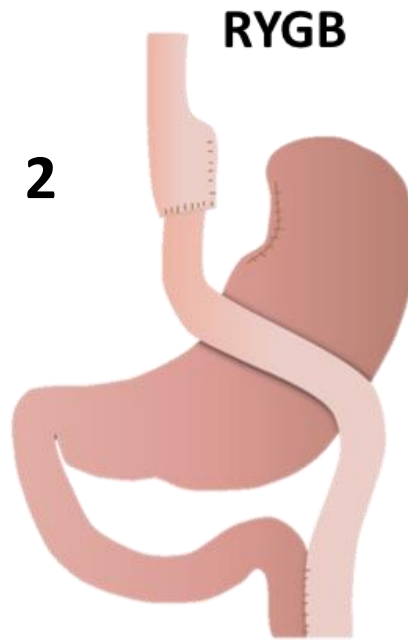
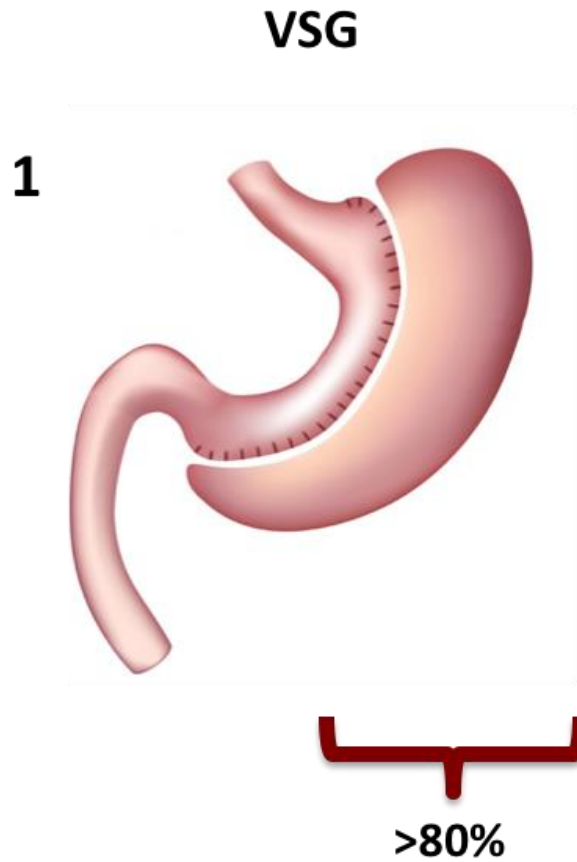
• **Gastric restriction**: volume, stoma size

• **Diversion**: **by-pass** (exclusion), interposition

• **Resection**: sleeve or hemi-gastrectomy

**Combinations of above**

## Most Common Types of Bariatric Surgery in the US





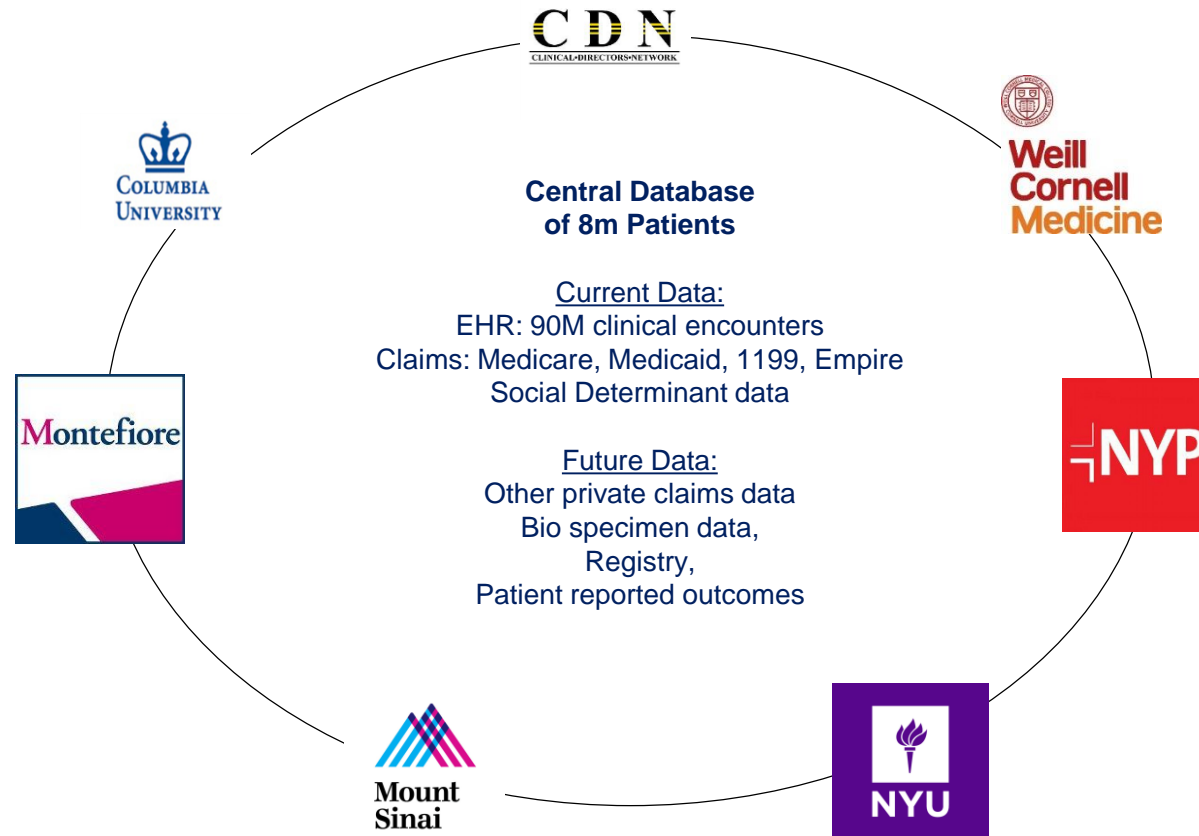


**NYC-CDRN**

New York City Clinical  
Data Research Network

(now INSIGHT Network)

3



**Weill  
Cornell  
Medicine**

**PCORNet - NYC-CDRN** (PCORI Grant #CDRN-1306-03961)  
(PI: Rainu Kaushal, MD MPH, Co-PI: Jonathan N. Tobin, PhD)





# PCORnet NYC-CDRN Obesity Pilot Study

## Goals:

1) Learn more about how different factors and experiences come together for people managing weight issues. The project is made up of two components:

- A 10 minute, 25 question survey about managing weight issues and/or undergoing bariatric surgery
- After survey responses have been collected, survey answers are linked to information in patient medical records/EHRs

2) Develop and test methodologies to:

- Build a secure, HIPAA-compliant process to combine medical records across multiple NYC institutions and other data sources (eg, health plans) in a way that protects patient privacy
- Integrate individual level data from EHRs with Patient Reported Outcomes collected via surveys



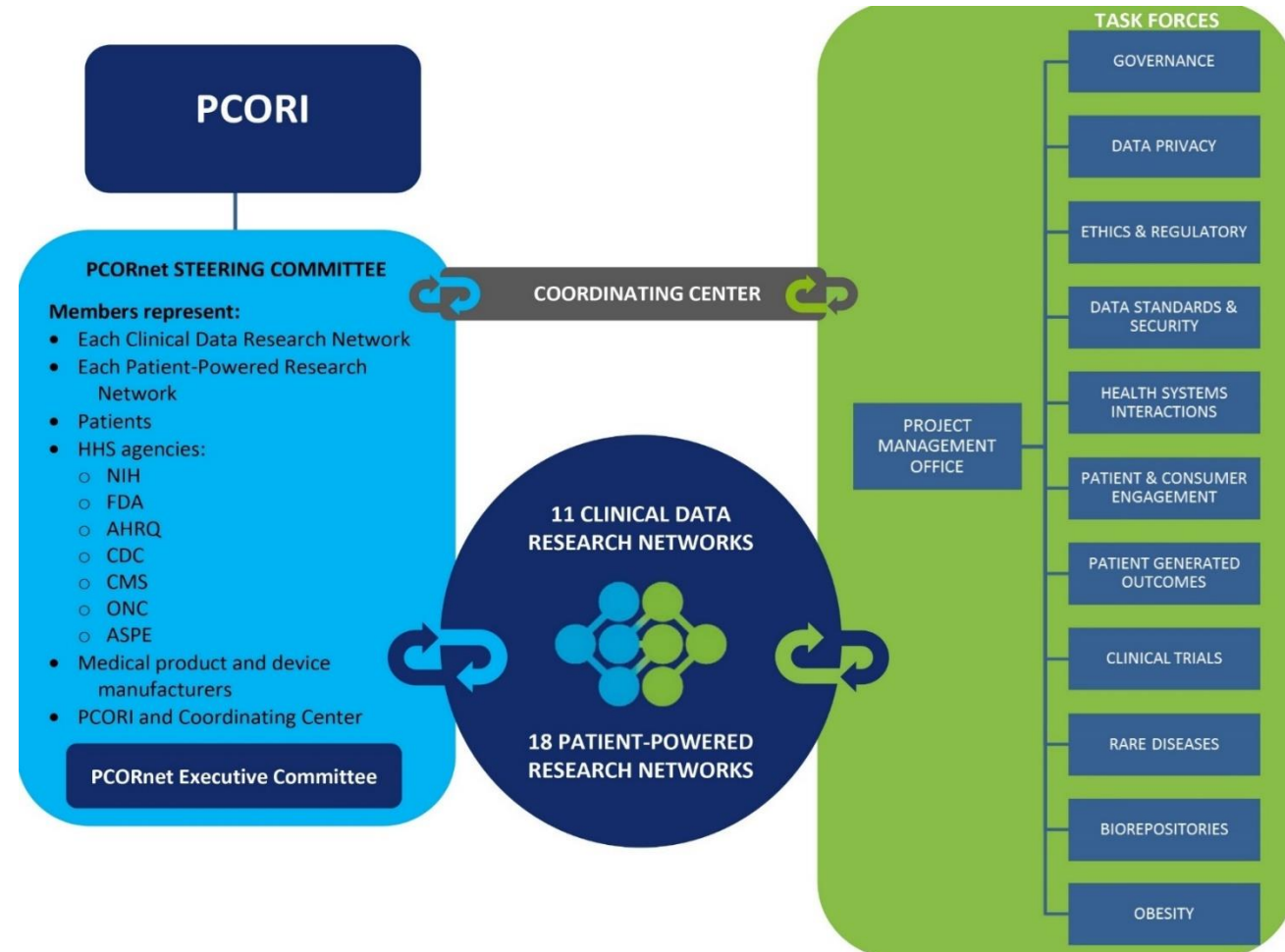
# PCORnet NYC-CDRN Obesity Pilot Study- PPRNs and PCOs

| Medical Specialty | Variables of Interest (Hypotheses)                      | PCORnet Patient Powered Research Network (PPRN) Partner   | Patient Centered Outcomes (PCO) Measure |
|-------------------|---|---|---|
| Pulmonary         | Changes in continuous positive airway pressure (CPAP) ? | Sleep Apnea Patient Centered Outcomes Network ( <b>SAPCON</b> )                                   | STOP-Bang questionnaire                 |
| Rheumatology      | Improvement in joint symptoms ?<br>Increased mobility ? | ARthritis Patient Partnership with Comparative Effectiveness Researchers ( <b>AR-PoWER PPRN</b> ) |   |
| Endocrinology     | Hypoglycemia?   |   | Hypoglycemia                            |
| Mental Health     | Depression and suicide?                                 | Mood Patient-Powered Research Network ( <b>MoodNetwork</b> )                                      | Patient Health Questionnaire (PHQ) 9    |

# HARNESSING THE POWER OF HEALTHCARE DATA NATIONALLY

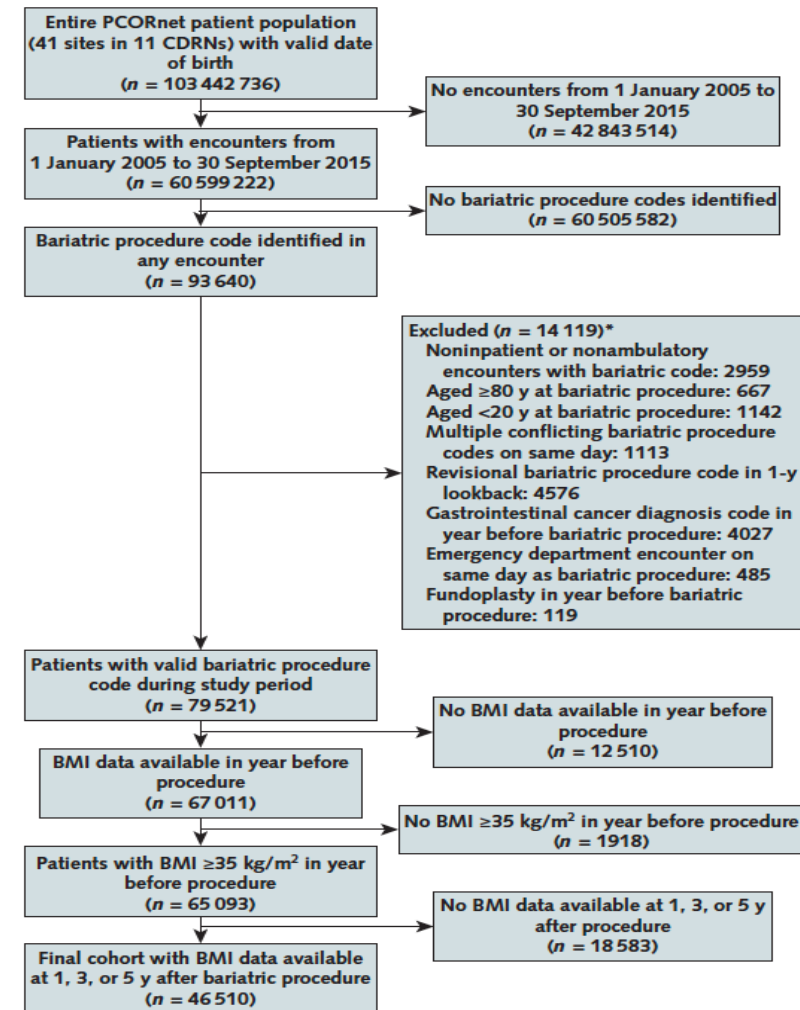


- Large diverse population
- Geographic co-location in a fragmented healthcare market
- Centralized structure
- Largest concentration of AMCs



# PCORnet Bariatric Study

- National PI: David Arterburn, MD
- NYC-CDRN co-PIs: Ana Emiliano, MD and Rabih Nemr, MD



BMI = body mass index; CDRN = Clinical Data Research Network;  
PCORnet = National Patient-Centered Clinical Research Network.  
\* Patients could be excluded for >1 reason.



# Collaboration with PCORnet Bariatric Study

Annals of Internal Medicine

ORIGINAL RESEARCH

## Comparative Effectiveness and Safety of Bariatric Procedures for Weight Loss

### A PCORnet Cohort Study

David Arterburn, MD, MPH; Robert Wellman, MS; Ana Emiliano, MD; Steven R. Smith, MD; Andrew O. Odegaard, PhD, MPH; Sameer Murali, MD; Neely Williams, MDiv; Karen J. Coleman, PhD; Anita Courcoulas, MD, MPH; R. Yates Coley, PhD; Jane Anau, BS; Roy Pardee, JD, MA; Sengwee Toh, ScD; Cheri Janning, RN, BSN, MS; Andrea Cook, PhD; Jessica Sturtevant, MS; Casie Horgan, MPH; and Kathleen M. McTigue, MD, MPH, MS; for the PCORnet Bariatric Study Collaborative\*

**Background:** There has been a dramatic shift in use of bariatric procedures, but little is known about their long-term comparative effectiveness.

**Objective:** To compare weight loss and safety among bariatric procedures.

**Design:** Retrospective observational cohort study, January 2005 to September 2015. (ClinicalTrials.gov: NCT02741674)

**Setting:** 41 health systems in the National Patient-Centered Clinical Research Network.

**Participants:** 65 093 patients aged 20 to 79 years with body mass index (BMI) of 35 kg/m<sup>2</sup> or greater who had bariatric procedures.

**Intervention:** 32 208 Roux-en-Y gastric bypass (RYGB), 29 693 sleeve gastrectomy (SG), and 3192 adjustable gastric banding (AGB) procedures.

**Measurements:** Estimated percent total weight loss (TWL) at 1, 3, and 5 years; 30-day rates of major adverse events.

**Results:** Total numbers of eligible patients with weight measures at 1, 3, and 5 years were 44 978 (84%), 20 783 (68%), and 7159 (69%), respectively. Thirty-day rates of major adverse events were 5.0% for RYGB, 2.6% for SG, and 2.9% for AGB. One-year mean TWLs were 31.2% (95% CI, 31.1% to 31.3%) for RYGB, 25.2% (CI, 25.1% to 25.4%) for SG, and 13.7% (CI, 13.3%

to 14.0%) for AGB. At 1 year, RYGB patients lost 5.9 (CI, 5.8 to 6.1) percentage points more weight than SG patients and 17.7 (CI, 17.3 to 18.1) percentage points more than AGB patients, and SG patients lost 12.0 (CI, 11.6 to 12.5) percentage points more than AGB patients. Five-year mean TWLs were 25.5% (CI, 25.1% to 25.9%) for RYGB, 18.8% (CI, 18.0% to 19.6%) for SG, and 11.7% (CI, 10.2% to 13.1%) for AGB. Patients with diabetes, those with BMI less than 50 kg/m<sup>2</sup>, those aged 65 years or older, African American patients, and Hispanic patients lost less weight than patients without those characteristics.

**Limitation:** Potential unobserved confounding due to nonrandomized design; electronic health record databases had missing outcome data.

**Conclusion:** Adults lost more weight with RYGB than with SG or AGB at 1, 3, and 5 years; however, RYGB had the highest 30-day rate of major adverse events. Small subgroup differences in weight loss outcomes were observed.

**Primary Funding Source:** Patient-Centered Outcomes Research Institute.

Ann Intern Med. doi:10.7326/M17-2786

For author affiliations, see end of text.

This article was published at Annals.org on 30 October 2018.

\* For key investigators and stakeholders in the PCORnet Bariatric Study Collaborative, see the Appendix (available at Annals.org).

Annals.org

Observational  
Comparative  
Effectiveness

Outcomes Study



# Collaboration with PCORnet Bariatric Study



Surgery for Obesity and Related Diseases 14 (2018) 1374–1388

SURGERY FOR OBESITY  
AND RELATED DISEASES

Original article

## Comparative effectiveness of bariatric procedures among adolescents: the PCORnet bariatric study<sup>☆</sup>

Thomas H. Inge<sup>a,b,\*</sup>, R. Yates Coley<sup>c</sup>, Lydia A. Bazzano<sup>d</sup>, Stavra A. Xanthakos<sup>e</sup>,  
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Observational  
Comparative  
Effectiveness

Outcomes Study

# Collaboration with PCORnet Bariatric Study

## Combining distributed regression and propensity scores: a doubly privacy-protecting analytic method for multicenter research

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**Purpose:** Sharing of detailed individual-level data continues to pose challenges in multicenter studies. This issue can be addressed in part by using analytic methods that require only summary-level information to perform the desired multivariable-adjusted analysis. We examined the feasibility and empirical validity of 1) conducting multivariable-adjusted distributed linear regression and 2) combining distributed linear regression with propensity scores, in a large distributed data network.

**Patients and methods:** We compared percent total weight loss 1-year postsurgery between Roux-en-Y gastric bypass and sleeve gastrectomy procedure among 43,110 patients from 36 health systems in the National Patient-Centered Clinical Research Network. We adjusted for baseline demographic and clinical variables as individual covariates, deciles of propensity scores, or both, in three separate outcome regression models. We used distributed linear regression, a method that requires only summary-level information (specifically, sums of squares and cross products matrix) from sites, to fit the three ordinary least squares linear regression models. A comparison set of analyses that used pooled deidentified individual-level data from sites served as the reference.

**Results:** Distributed linear regression produced results identical to those from the corresponding pooled individual-level data analysis for all variables in all three models. The maximum numerical difference in the parameter estimate or standard error for all the variables was  $3 \times 10^{-11}$  across three models.

**Conclusion:** Distributed linear regression analysis is a feasible and valid analytic method in multicenter studies for one-time continuous outcomes. Combining distributed regression with propensity scores via modeling offers more privacy protection and analytic flexibility.

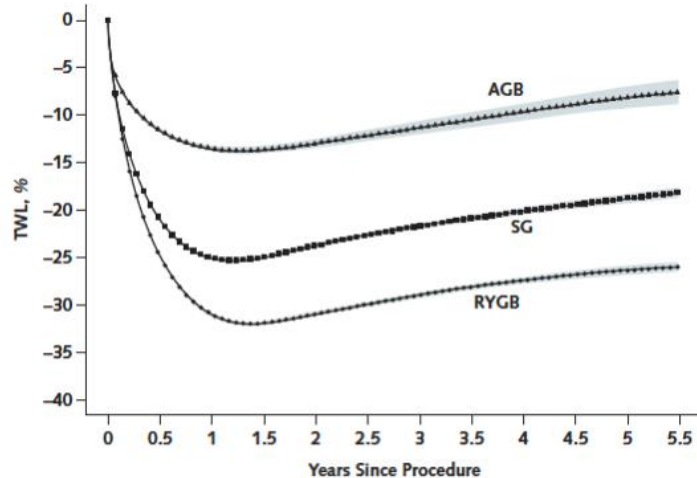
**Keywords:** distributed regression, propensity score, distributed data networks, privacy-protecting methods

Observational  
Comparative  
Effectiveness

Methodological  
Study

# PCORnet Bariatric Study Results that will influence my practice

**Figure 2.** Estimated percentage of TWL through 5 y after bariatric surgery, by procedure type.



This plot shows the estimated percentage of TWL for a patient with the average baseline covariate profile using results from our sensitivity analysis, which included all follow-up weight measurements from 56 156 patients with any postsurgery weight observations. Additional details are provided in the Methods section of the text and the Statistical Appendix section of the **Supplement**. Shaded areas indicate pointwise 95% CIs. AGB = adjustable gastric banding; RYGB = Roux-en-Y gastric bypass; SG = sleeve gastrectomy; TWL = total weight loss.

Significantly lower weight loss observed in:

- Patients with diabetes
- Individuals with BMI less than 50 kg/m<sup>2</sup>
- Patients aged 65 years or older
- African American patients
- Hispanic patients



# Conclusions

- Engaged community-based clinicians with basic science, translational and health services researchers
- Generated hypotheses from practice-based observations
- Collaborated in local pilot studies to develop and refine methods to extract and combine EHR data with patient-reported outcomes
- Participated in national observational comparative effectiveness studies of bariatric surgical outcomes for adults and adolescents and developed and validated a novel methodology to enhance patient privacy and data security when conducting distributed, multivariable regression analyses

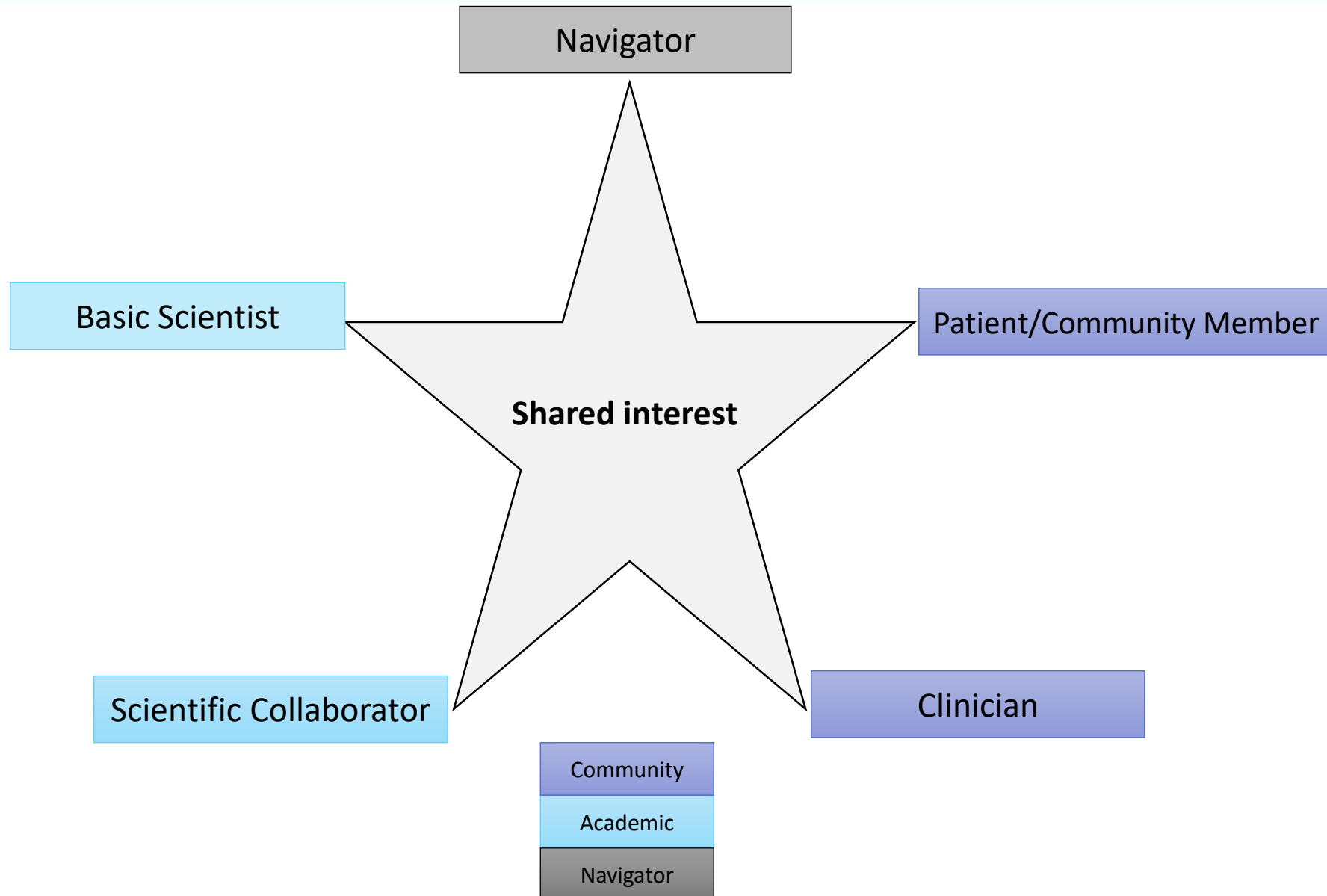




# *Philosophy*

Rather than being polar ends of the translational spectrum, T0 mechanistic research and T3-T4 community/patient-oriented research are powerful synergistic partners

# Stakeholders in Community Engaged Research



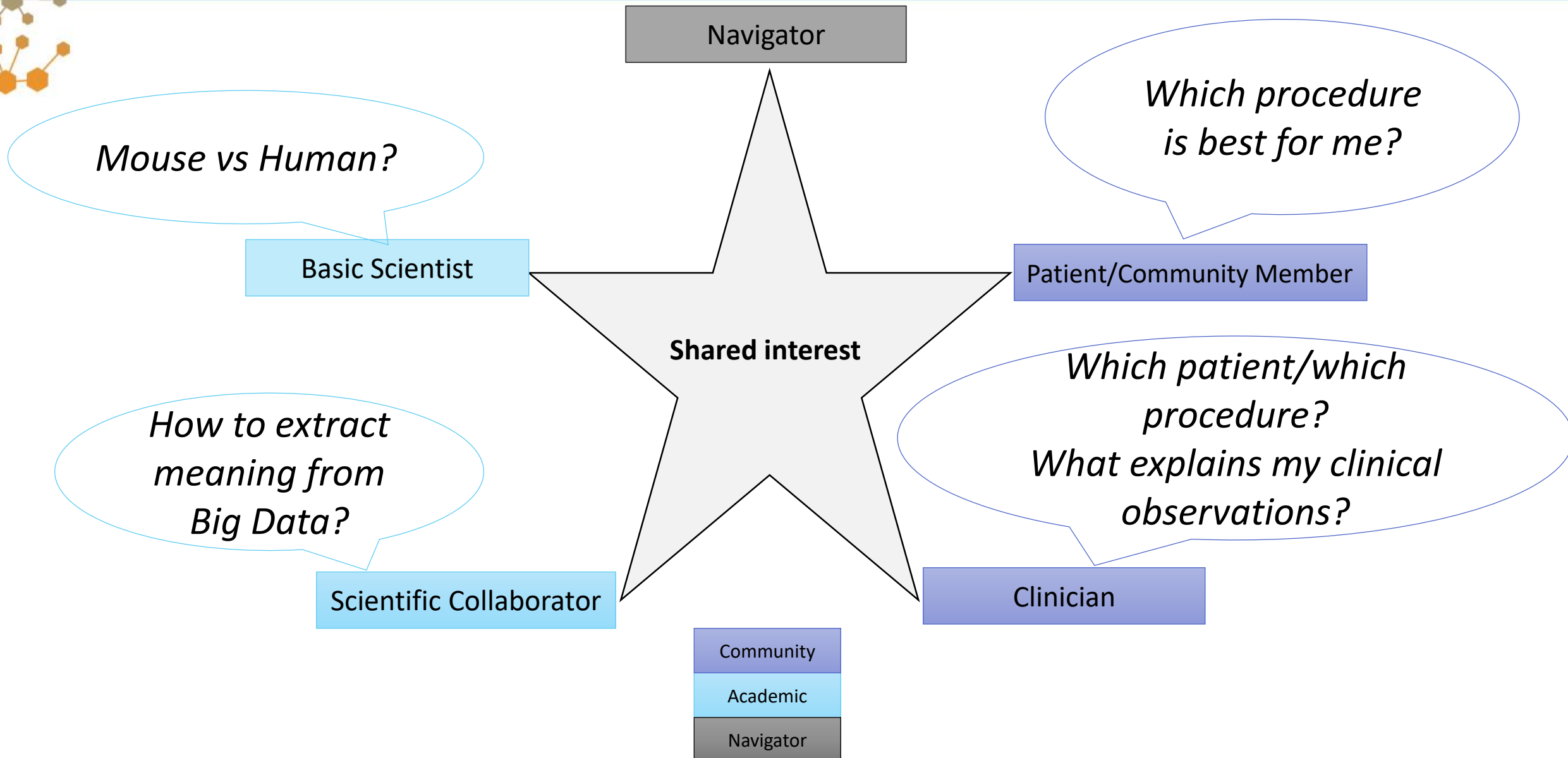




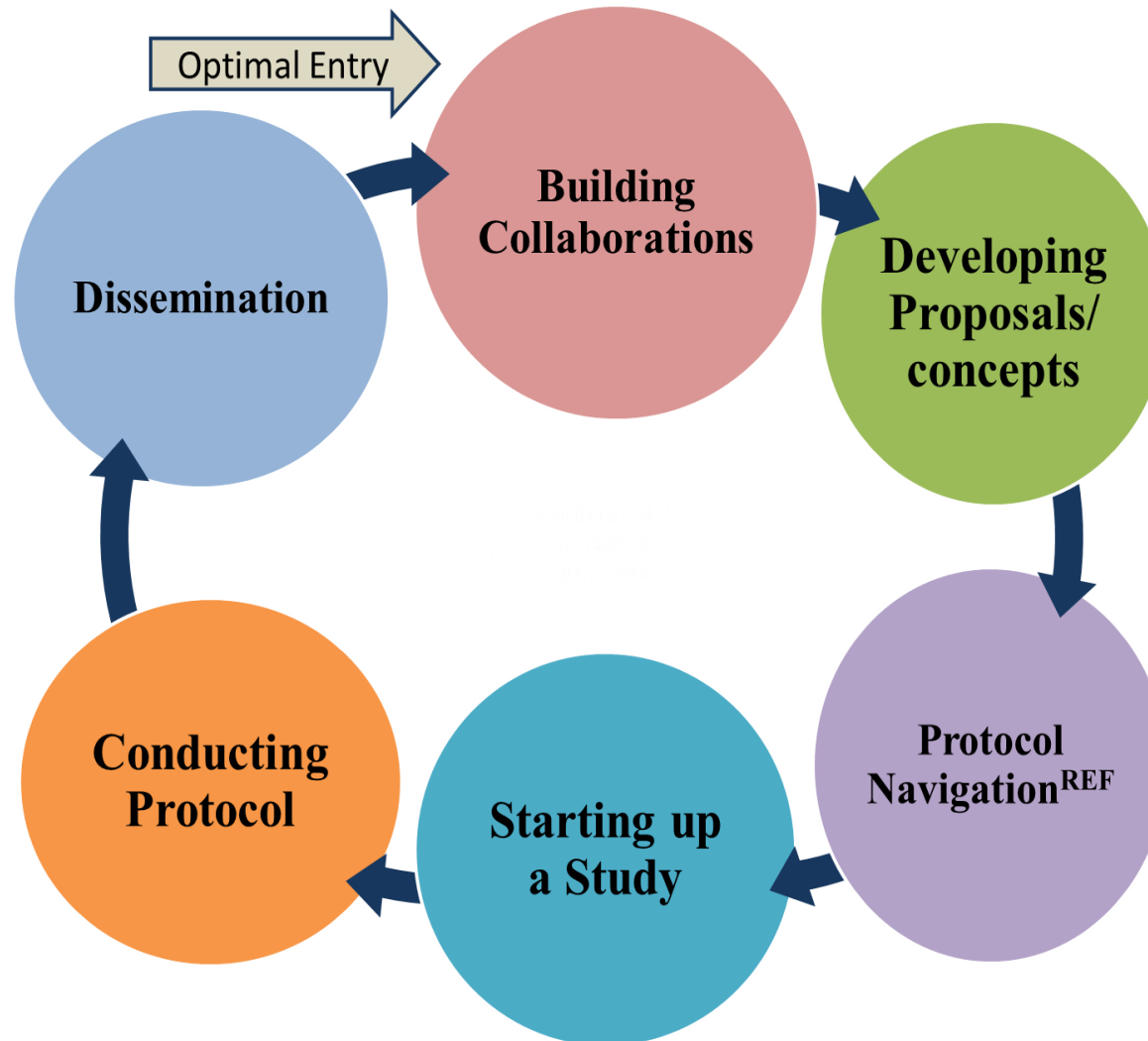
# Who Was at the Meeting

| FQHC  | CDN (PBRN) / RU (CTSA)   |
|---|--|
| Site Principal Investigator (Bariatric Surgery) | Clinical Epidemiologist  |
| Primary Care/Family medicine                    | Project Manager  |
| Endocrinology                                   | The Rockefeller University Clinical and Translational Science Award Program (CTSA) |
| Pulmonary                                       | Clinical Scholar – Physician/Scientist   |
| Gastroenterology                                | Biostatistics  |
| Mental Health Specialist                        | Bioinformatics   |
| Nutritionist/Dietitian                          | Pilot Grant Mechanism  |
| Information and Statistician                    | CEnR/Protocol Navigation   |

# Stakeholders in Community Engaged Research



# Community-Engaged Research Navigation





# Outcomes: Something for everyone

| Career Stage | Time invested | Protocol Aims, mapped to Translational Continuum |    |    |    |    | Measure of partnership | External Funding | Publication | Health Impact |
|--------------|---------------|--|----|----|----|----|------------------------|------------------|-------------|---------------|
|              |               | T0   | T1 | T2 | T3 | T4 |                        |                  |             |               |

# Outcomes: Something for everyone

| Career Stage           | Time invested              | Protocol Aims, mapped to Translational Continuum |    |    |    |    | Measure of partnership                         | External Funding                     | Publication               | Health Impact            |
|------------------------|----------------------------|--|----|----|----|----|--|--------------------------------------|---------------------------|--------------------------|
|                        |                            | T0   | T1 | T2 | T3 | T4 |  |                                      |                           |                          |
| Early career           | Extended                   |  |    |    |    |    | Time, leadership, co-authorship, dissemination | Clinical scholar<br>Pilot<br>K award | Co-author, Annals Int Med |                          |
| Clinicians             | Extended                   |  |    |    |    |    | Time, leadership, co-authorship, dissemination |                                      | Co-authors Annals Int Med | Evidence based practices |
| Patients               | Limited & <i>in silico</i> |  |    |    |    |    | PCOs, surveys, EHR data                        |                                      |                           | Evidence based Rx        |
| Collaborators          | Extended                   |  |    |    |    |    | Time, Analysis, Dissemination                  | PCORI                                | Co-authors Annals Int med |                          |
| PBRN & CTSA Navigators | Extended                   |  |    |    |    |    | Time, leadership, co-authorship, grant-writing | CCTS<br>AHRQ<br>PCORI                | Co-author, methodology    |                          |



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- **PCORNet - NYC-CDRN** (PCORI Grant #CDRN-1306-03961) (PI: Rainu Kaushal, MD MPH, Co-PI: Jonathan N. Tobin, PhD)
- **The PCORnet Bariatric Study - Comparing the Benefits and Harms of Three Types of Weight Loss Surgery** - (PCORI/OBS-1505-30683) (PI: David Arterburn, MD, MPH – NYC-CDRN Co-PIs: Ana Emiliano MD MSC, Rabih Nemr MD FACS)





# *Reflections on the Collaboration*



*Discussion*

*Questions & Answers*