



Project ASPeCT

(Anonymized, systematic, population e-
(geo-fenced) Contagion Tracking)

Geo-fenced Contagion
Tracking System

+

Comprehensive
Decision Support
Dashboard
Approach

Phase 1 Plan for Re-opening is Underway

- What do we know for sure -> Movement around the region will grow.
- Some types of movement increase the risk of spreading the virus.
- How do we **measure** the relative rate and risk of increase in movement? [Spread]
- How do we **predict** the effect of the increased movement? [Outcome]
- When will it exceed medical hospital **capacity** to treat COVID patients? [Capability]

Data Requested, Received and Presented to the EPG

- Move from disparate to comprehensive
- Move from descriptive to predictive or prescriptive
- Move from informative to actionable

Discuss an Aggregated Dashboard [Governor's Task Force]

- Capacity Dashboard [Capability]
- Testing Dashboard [Outcome]
- Movement Dashboard [Spread]

Let's answer the questions:

- How does each re-opening announcement/phase effect movement?
- How does the type of movement affect risk of spread?
- How can we identify the 5% and intervene?
- How will the movement behavior consume hospital capacity?
- How do we adjust the models through feedback from testing and tracing?

Overview

Dr. Peter Chang, M.D.

Tampa General Hospital
VP, Care Transitions
Chief Medical Informatics Officer



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University of South Florida
Director, DBA Degree Program
Information Systems & Decision Sciences
Muma College of Business



With acknowledgement to our medical professional
and data science research colleagues
who designed, developed and
deliver (every day) the information in this
presentation.

Caveats

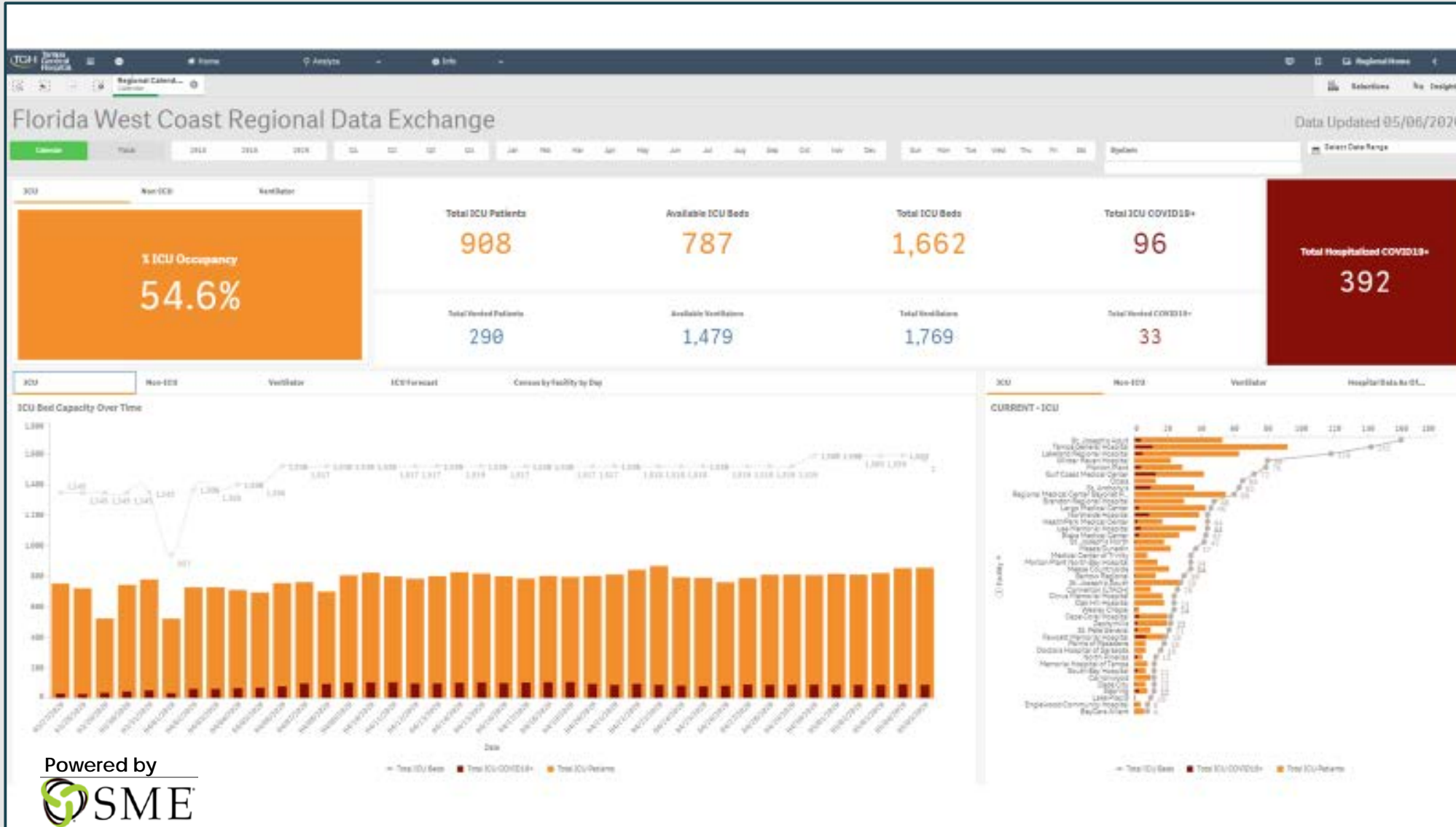
- **All data presented:**

- Contains no personally identifiable information
- Contains no HIPPA protected information
- Complies with comprehensive data protection laws in 80+ countries including GDPR (EU) and CCPA (California Consumer Privacy Act)
- Device data is Opt-In and Cleaned Daily for Opt-Out

- **Analysis performed:**

- Uses Massive Data to replicate the whole population
- Avoids samples filled with self-selection bias or skewed to those with access
- Stochastic in nature with probabilities at levels of confidence (not deterministic)
- Attempts to understand underlying behaviors in this region, and,
- Provides results specific to this region
 - Our demographics
 - Our density
 - Our movement behavior
 - Our social behaviors

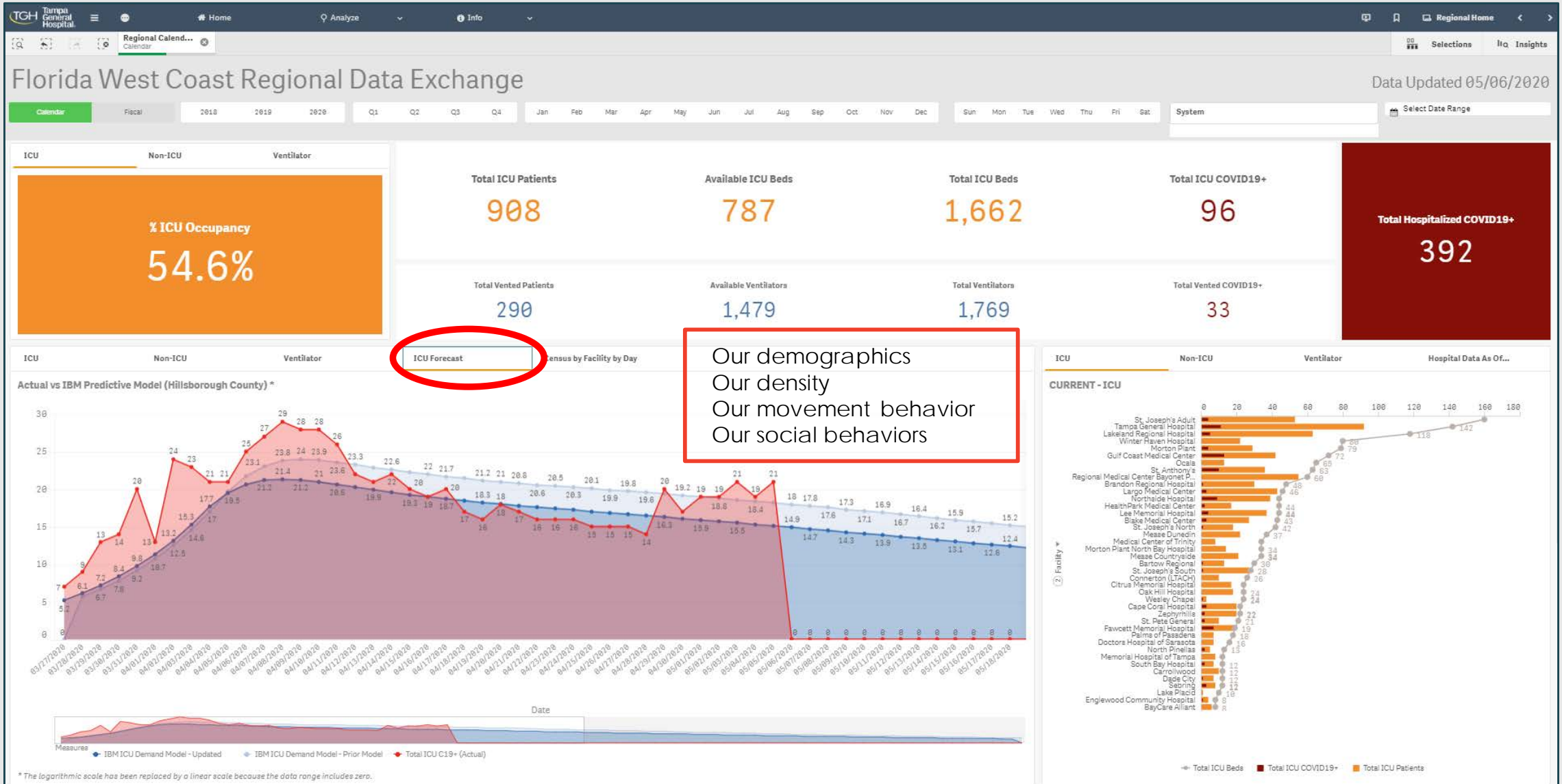
Capacity Dashboard – ICU Beds & Ventilators



- Data Sharing Collaboration between:
 - TGH
 - Advent Health
 - BayCare Health System
 - HCA Healthcare
 - Lakeland Regional Health
 - Lee Health
 - Manatee Memorial Hospital
- 51 Hospitals
- 13 Counties
- 5 million lives



Capacity Dashboard – Generic Models have low Predictive Power in the Region



Capacity Dashboard

Coronavirus: characteristics of 36,492 Florida resident cases

Data verified as of May 5, 2020 at 10 AM

Data in this report are provisional and subject to change.

Age group	Cases	Hospitalizations	Deaths
0-4 years	203 1%	13 0%	0 0%
5-14 years	431 1%	10 0%	0 0%
15-24 years	2,764 8%	86 1%	0 0%
25-34 years	5,389 15%	302 5%	12 1%
35-44 years	5,493 15%	534 8%	27 2%
45-54 years	6,543 18%	821 13%	59 4%
55-64 years	6,218 17%	1,092 17%	153 10%
65-74 years	4,566 13%	1,378 22%	335 23%
75-84 years	2,975 8%	1,261 20%	441 30%
85+ years	1,902 5%	833 13%	444 30%
Unknown	8 0%	0 0%	0 0%
Total	36,492	6,330	1,471

Gender	Cases
Male	18,195 50%
Female	18,271 50%
Unknown	26 0%
Total	36,492

>65 years old
 26% of Cases
 55% of Admissions
 83% of Deaths

Testing Dashboard

COVID-19 TGH Tracking Live Leadership Dashboard | Test Tracker Live Feed

Data Updated 05/06/2020 9:47 PM

Calendar Fiscal 2018 2019 2020 2021 Q1 Q2 Q3 Q4 Jan Feb Mar Apr May Jun Jul Aug Sep Oct Nov Dec Sun Mon Tue Wed Thu Fri Sat Negative Pending Positive Select Date Range

Total Positive Tests

461 ^{10,001}
Resulted

Positive Tests Today

9 ³¹⁰
Results Today

Pending Results (TGH Lab)

254 ^{13:04}
Median Hrs Since Ordered (TGH Lab)

Pending Results (Commercial)

171 ^{7:06:57}
Median Hrs Since Ordered (Commercial)

Resulted

10,001 ^{4:04}
Median TAT

C-19 Tests Ordered

10,426

Ordered (In-House)

741 ⁵⁴
Positive Tests

Ordered (Discharged)

9,685 ⁴⁰⁷
Positive Tests

Patients in ICU

9 ⁵
Patients on Ventilators

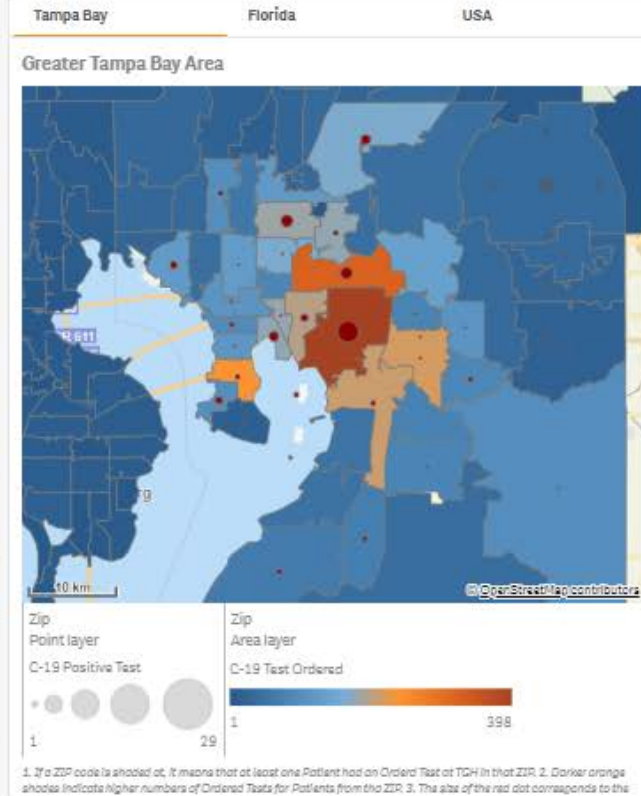
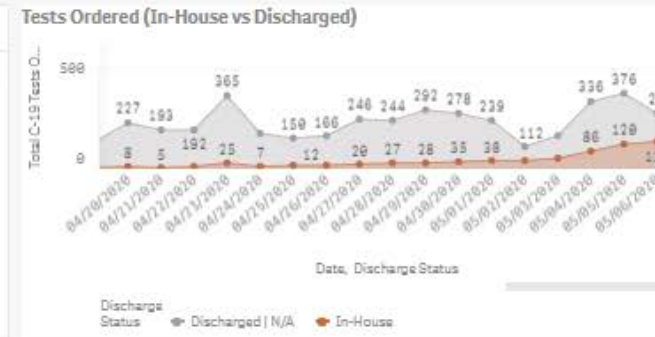
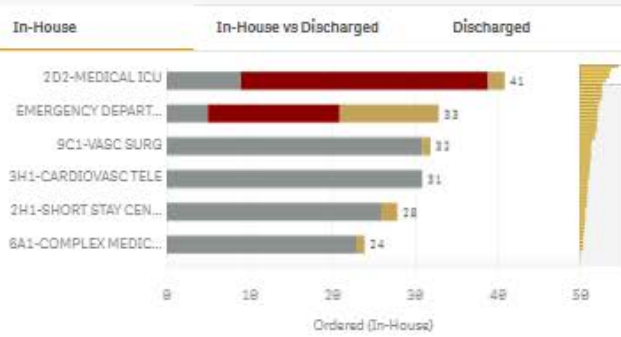
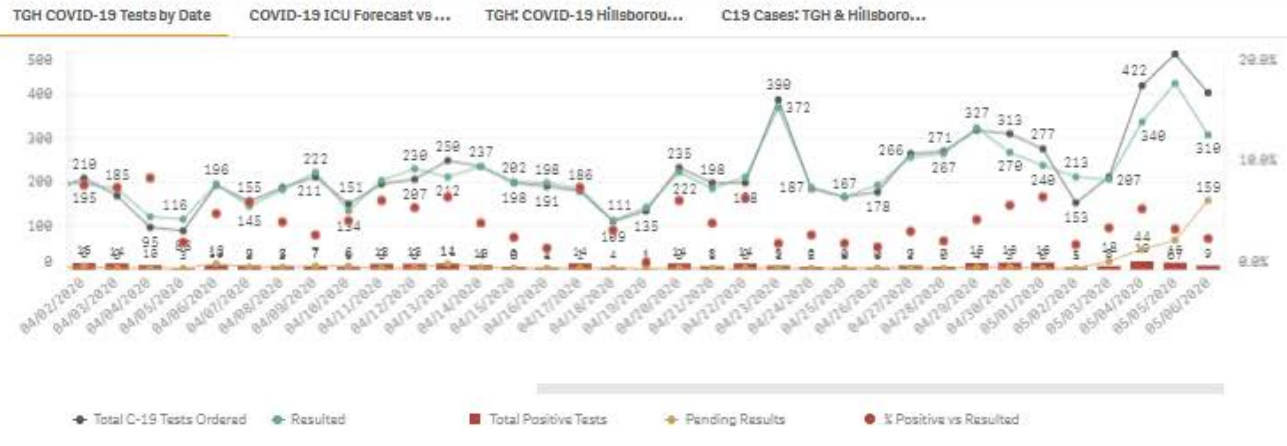
Legend



TGH COVID-19 Metrics

=" Q	Values
- Inpatient Pending Results	18
- Total Positive Patients In-House	15
- Inpatient Positive	12
- Patients in ICU	9
- Patients on Ventilators	5
- New Positive Last 24 Hrs	9
- New Pending Last 24 Hrs	159
- New Inpatient Positive Last 24 Hours	1

TGH Metrics as of 05/06/2020 9:47 PM



Movement Dashboard

Powered by



Data Partner – Mobilewalla

Geolocation daily of some 3 million devices across 13 counties and 5 million people...

Movement Behaviors Affect Risk

- Three types of movement:
 - How Far Traveled (ROGSI)
 - Number of Unique Locations Visited (NULV)
 - Number of Dense Locations Visited (NUDL)
- Combined Risk Score
 - Individual Device Vector
 - Geo-fenced Area Score
 - Social Isolation Score
 - Median NULV,
 - Top 25 NULV Devices,
 - Median NUDL

Movement Risk and Virus Spread

- The Social Isolation Score has been “trained” using actual new cases for thousands of devices across hundreds of zip codes.
- The Social Isolation Score is statistically correlated with number of new cases
 - As the score for an area increase due to increased movement behaviors, the number of new cases climbs
 - Since every area behaves differently the risk score is different by area
 - The risk score is heavily affected by the 5-10% of devices that move the most thru the most dense locations.

Movement Dashboard – Heat Map (PRE)

Powered by



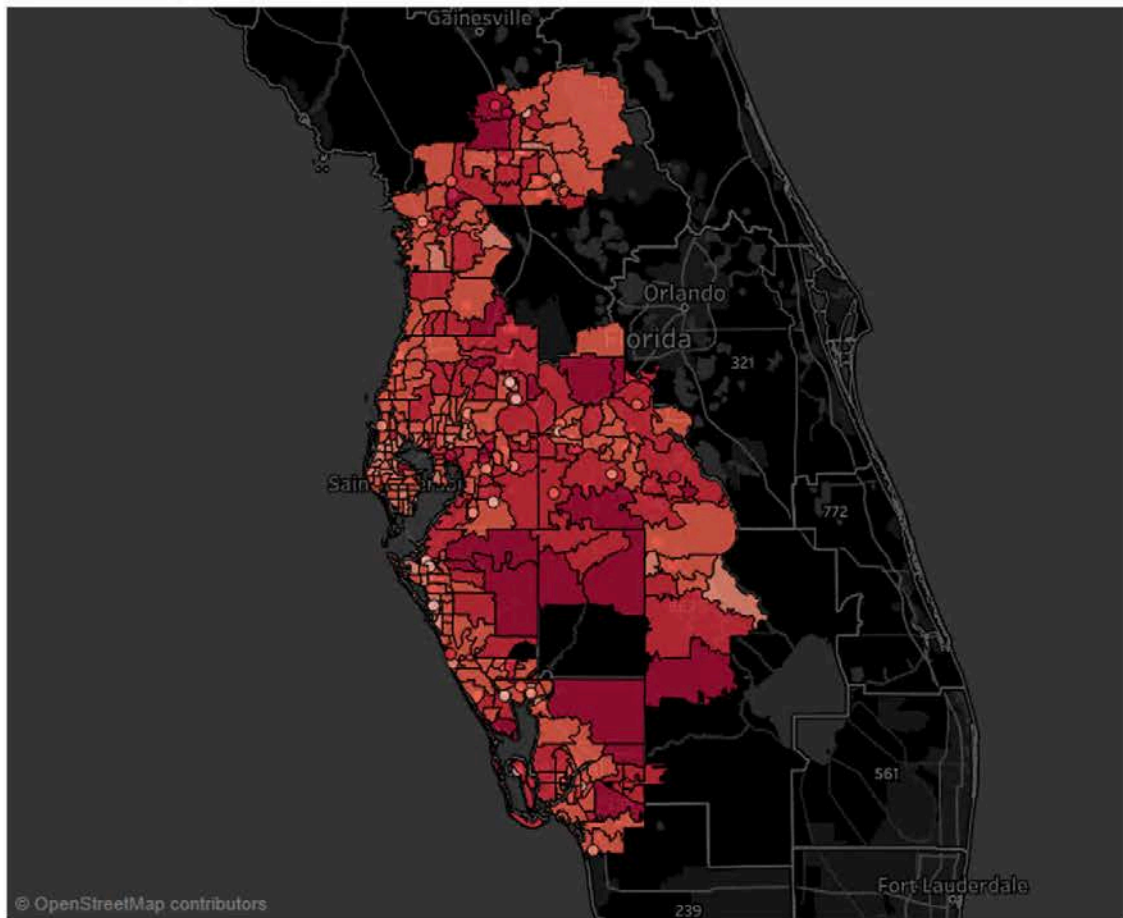
mobilewalla

Day of Date

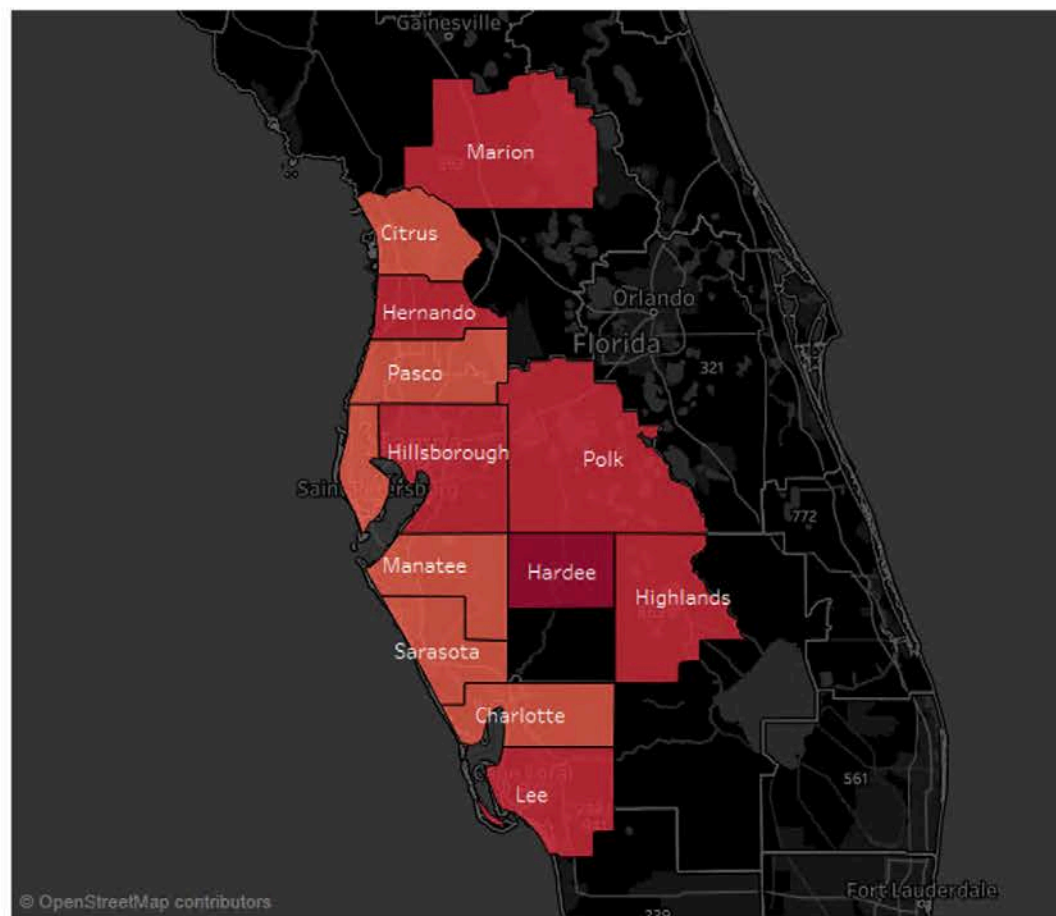
< March 18, 2020 >

Mobilewalla Social Isolation Risk Heat Map

Zip - March 18, 2020



County - March 18, 2020



Movement Dashboard – Heat Map (POST)

Powered by



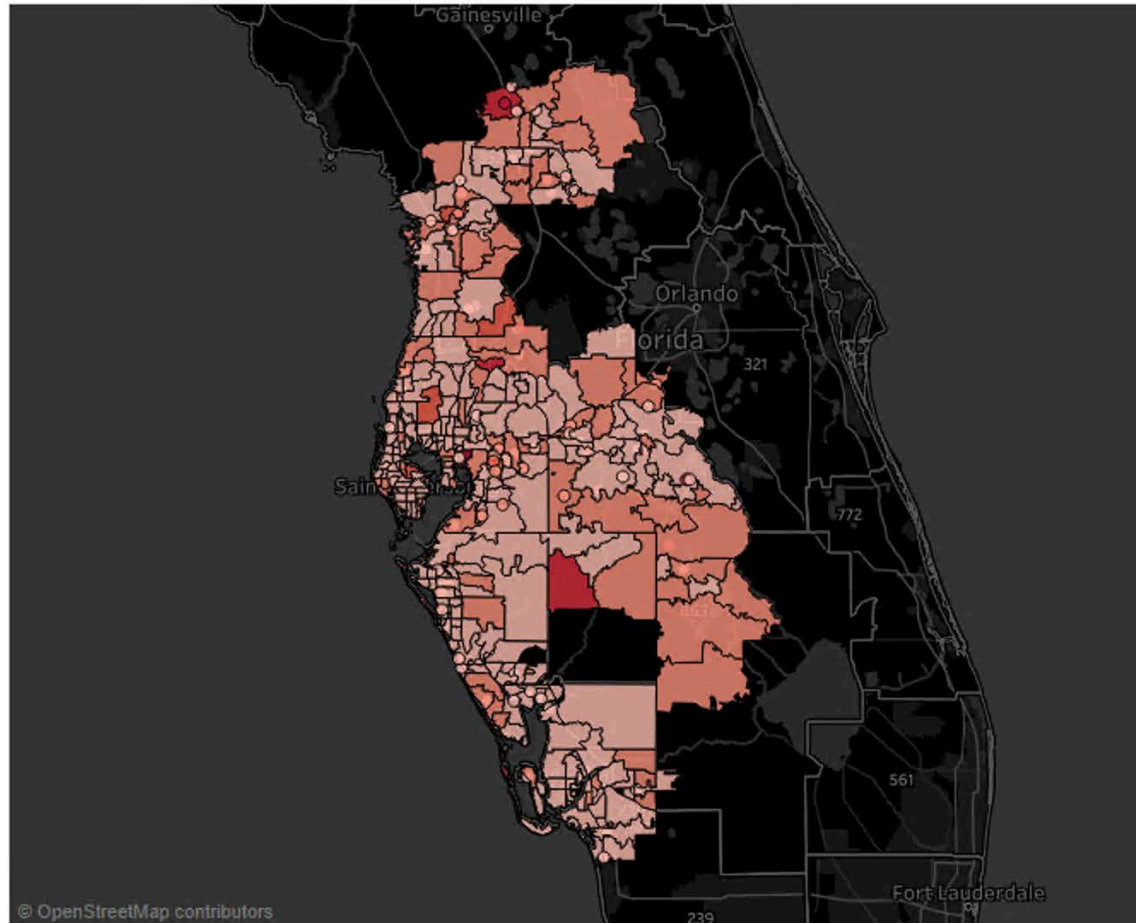
mobilewalla

Day of Date

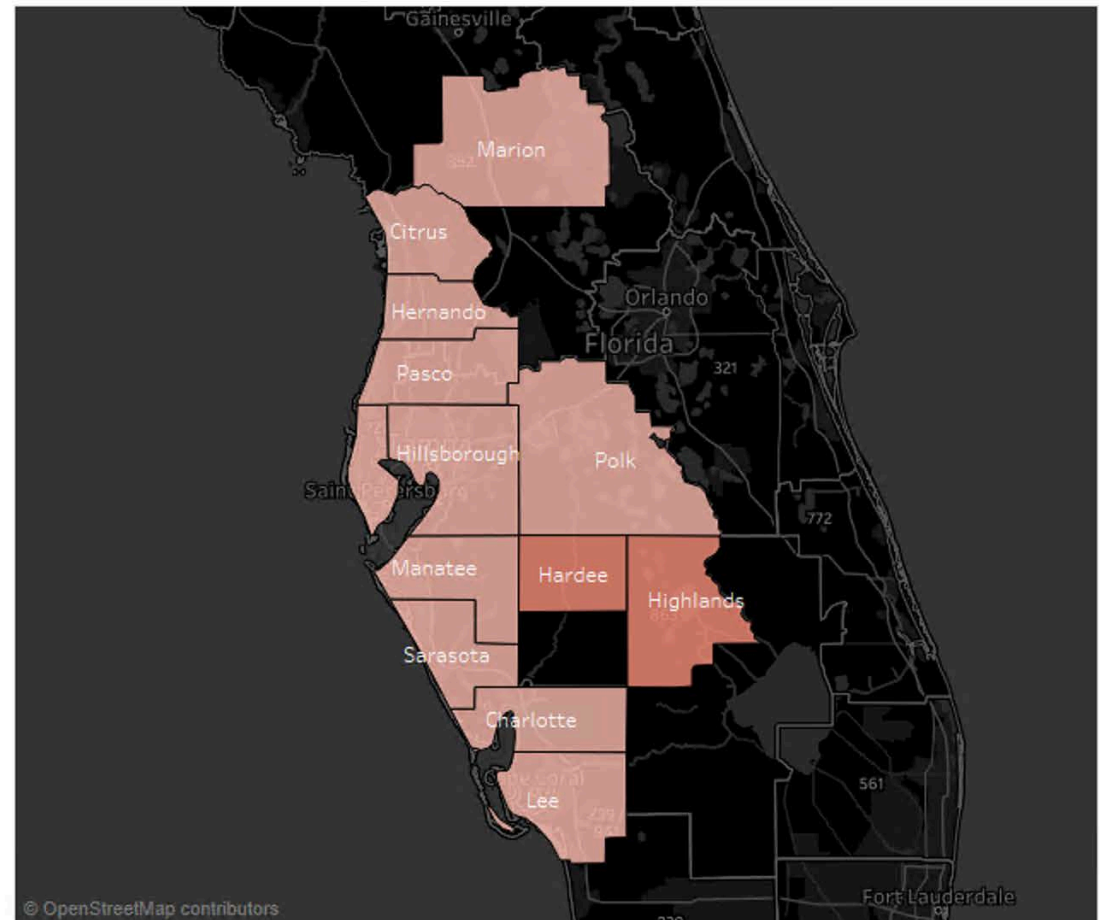
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Mobilewalla Social Isolation Risk Heat Map

Zip - April 5, 2020



County - April 5, 2020



Movement Dashboard – Heat Map (DURING)

Powered by



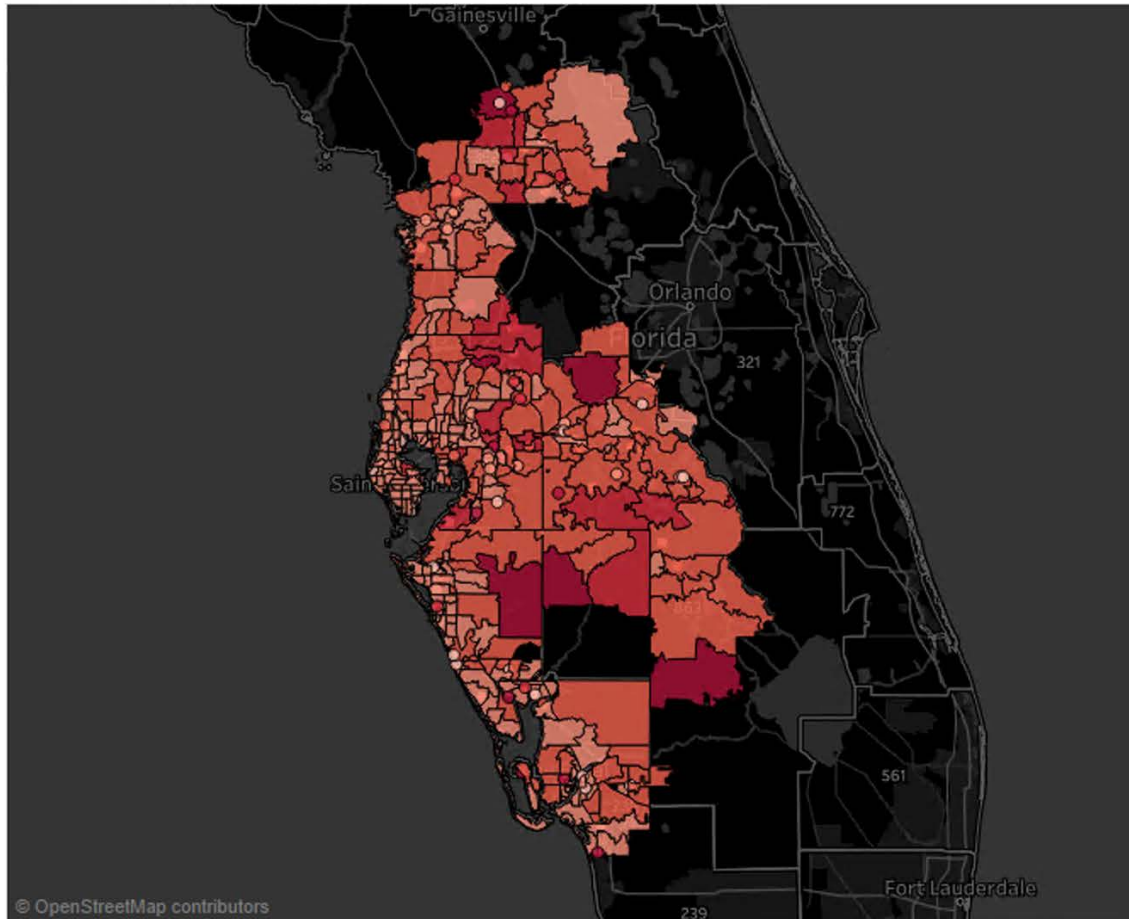
mobilewalla

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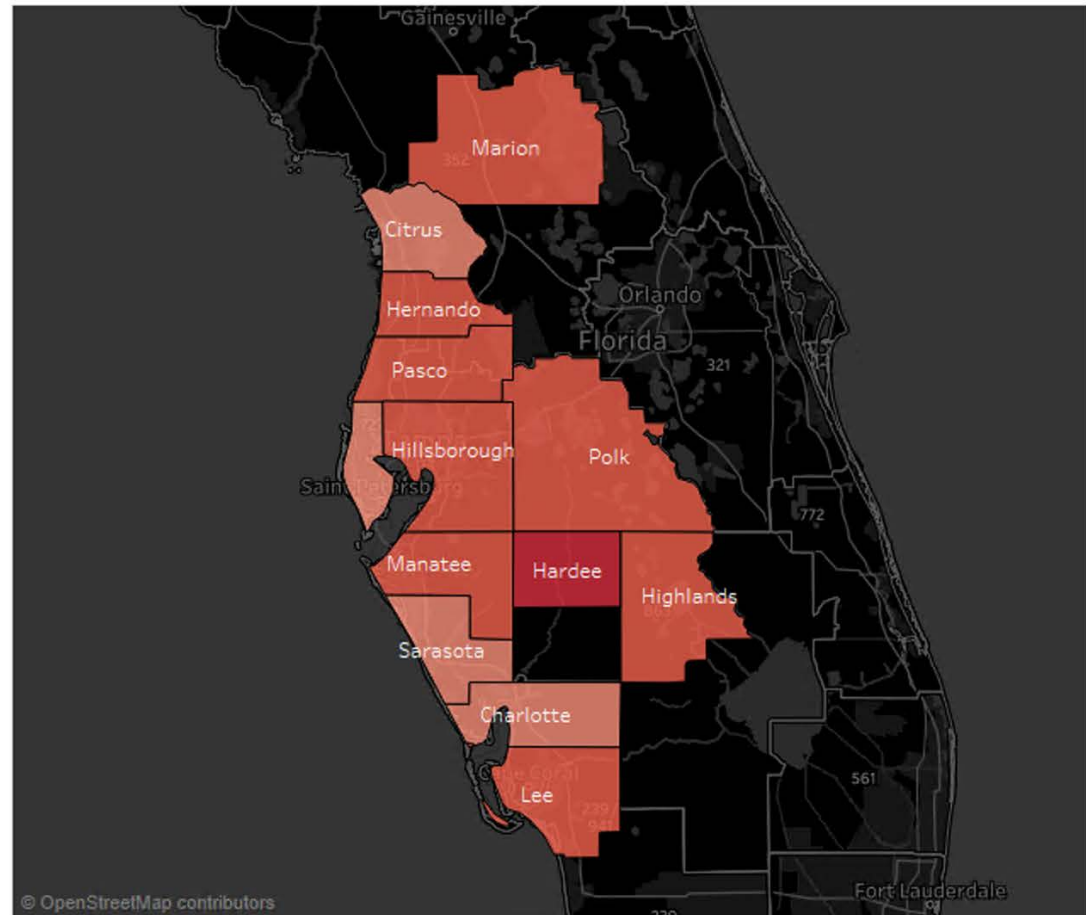
< April 22, 2020 >

Mobilewalla Social Isolation Risk Heat Map

Zip - April 22, 2020



County - April 22, 2020

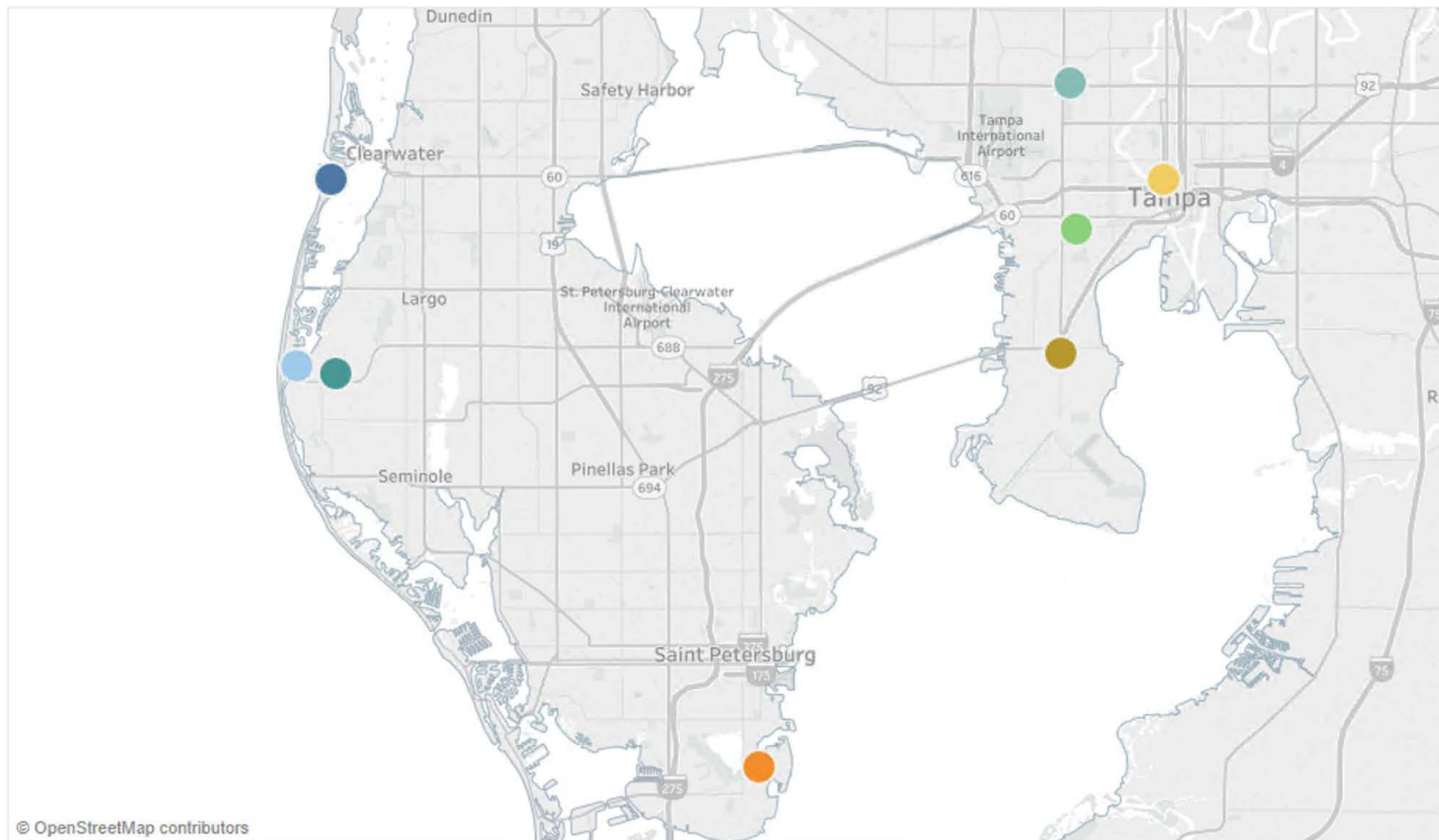


Movement Dashboard – Risky Cluster ID

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mobilewalla



POI

- Beach
- Boathouse
- Church
- Furniture Shop & Restaurants
- Lighthouse Bay Apartment Co..
- Park & Recreation Area
- Walmart

Geo-Fenced:
>150 Devices in a 500x500 square-foot area in 8 hours

- Two Types of Clusters:
- Movement Risk
 - Acuity/Demographic Risk



mobilewalla

Movement Dashboard - Capacity Correlation

Powered by

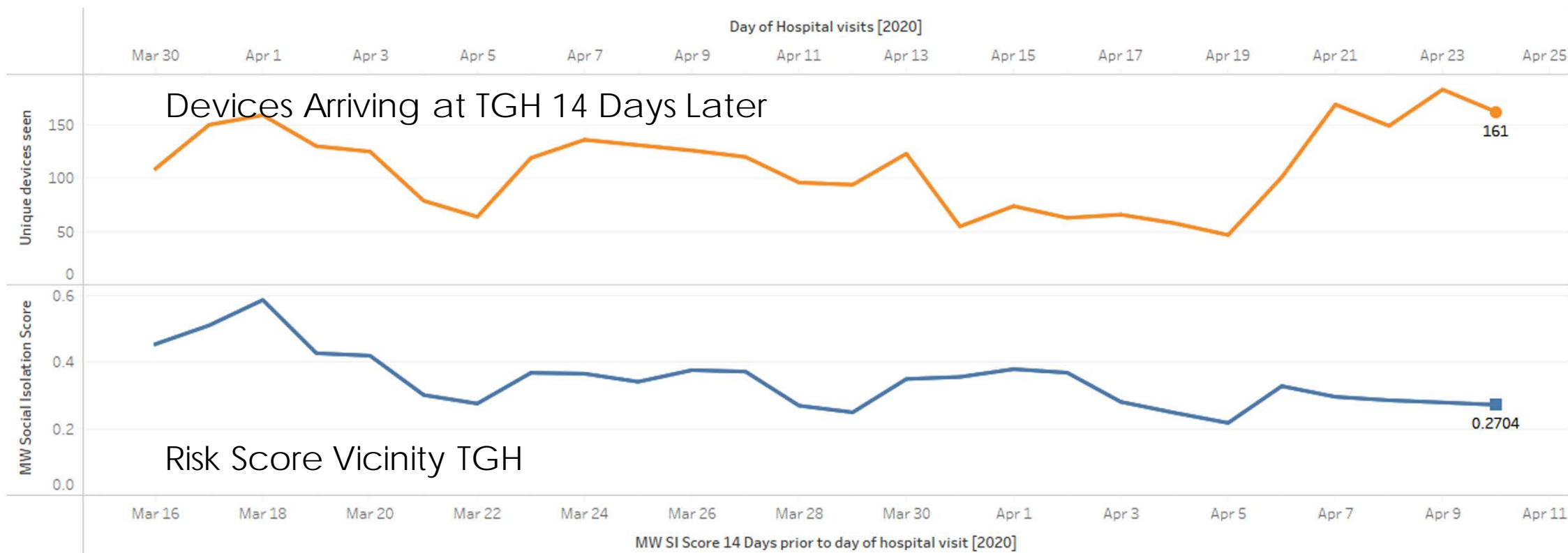


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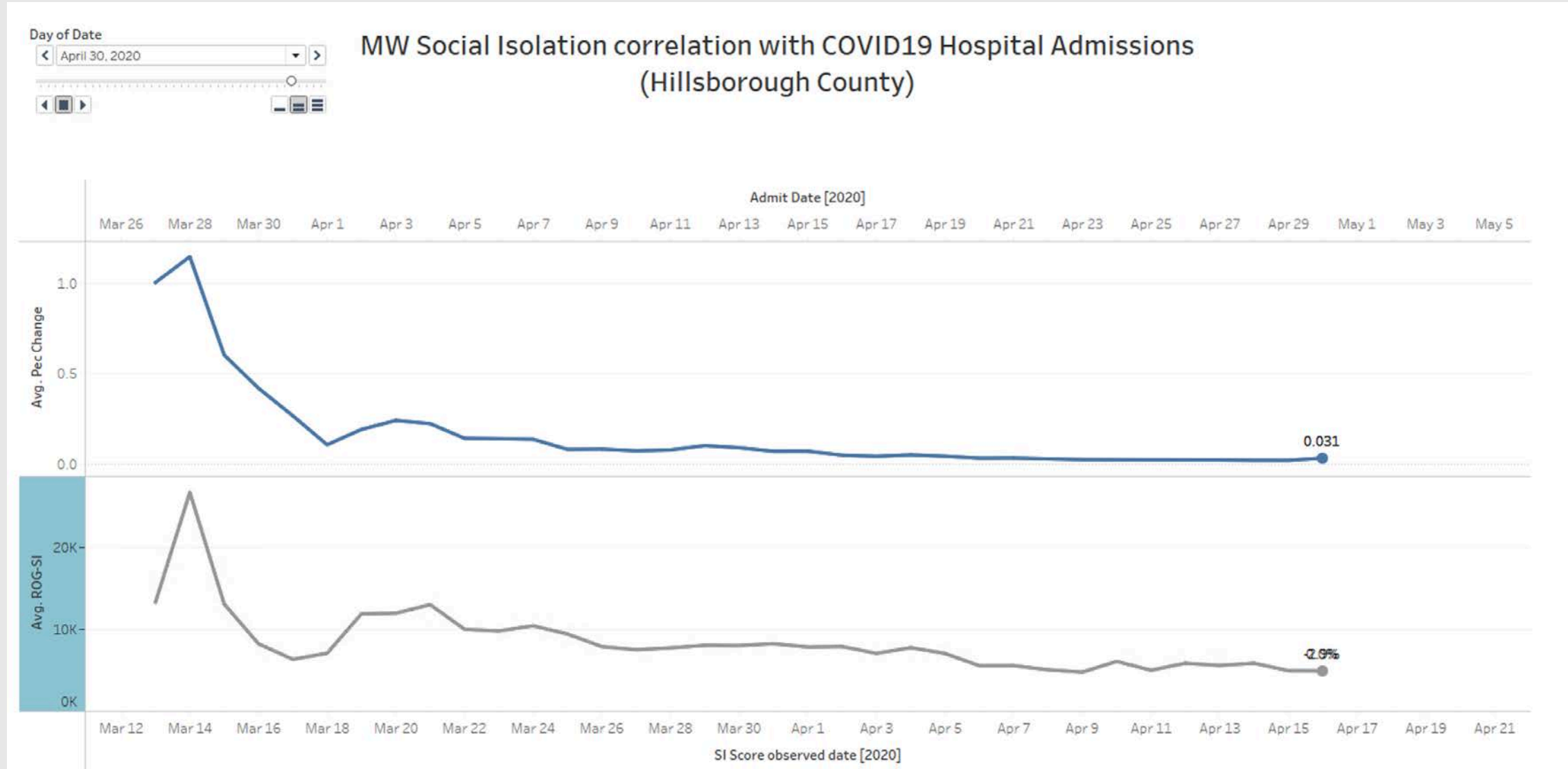
Date

MW Social Isolation Score correlation

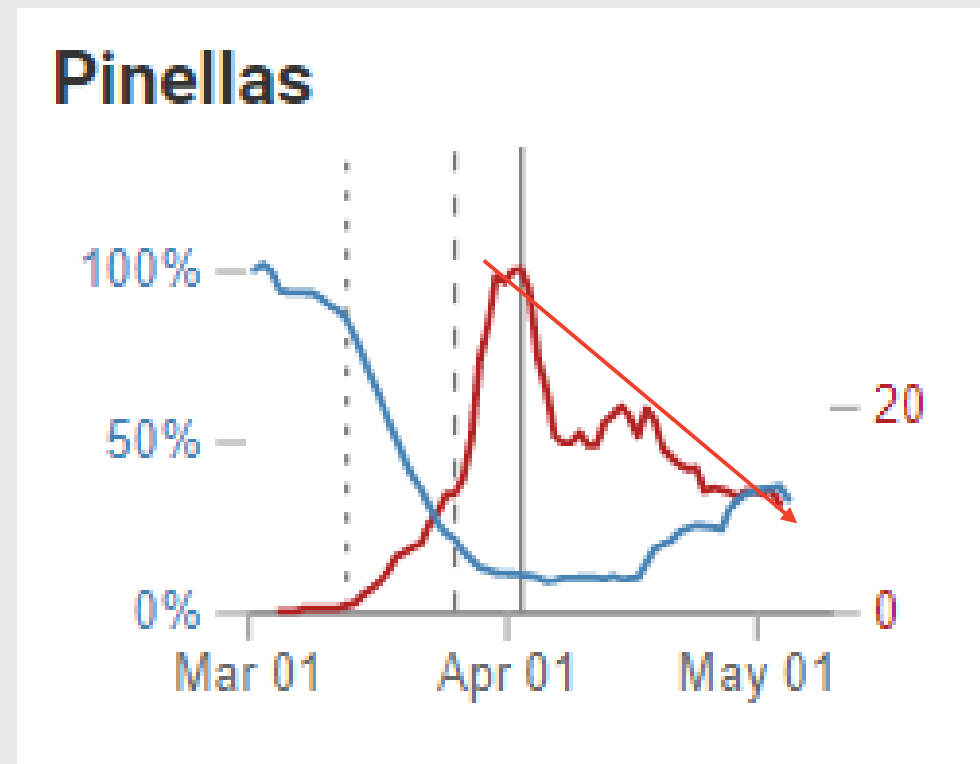
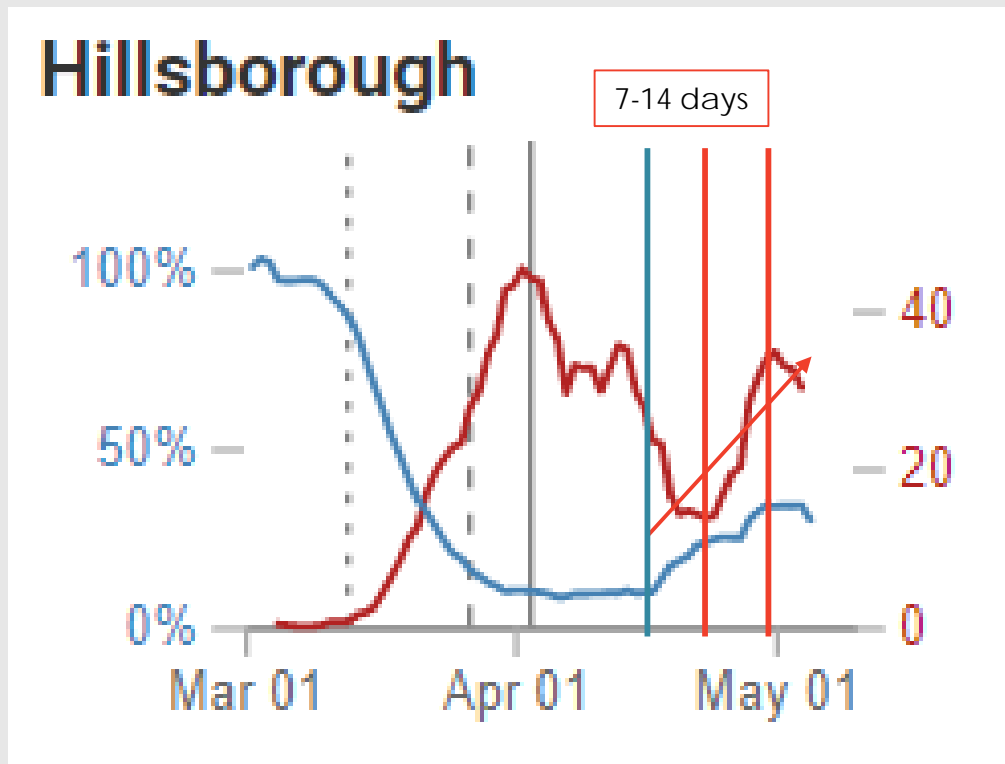
SI Trend - April 10, 2020



County: Risk of Spread (Movement Score) vs. Hospital Admissions (% Change)



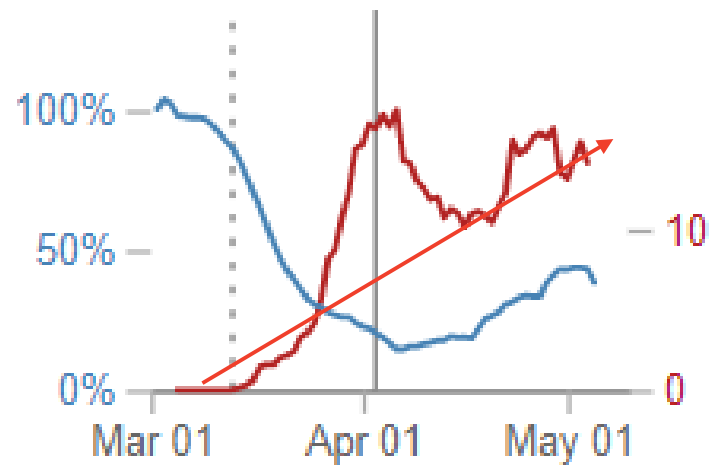
Movement (% Δ) vs. New Cases (#)



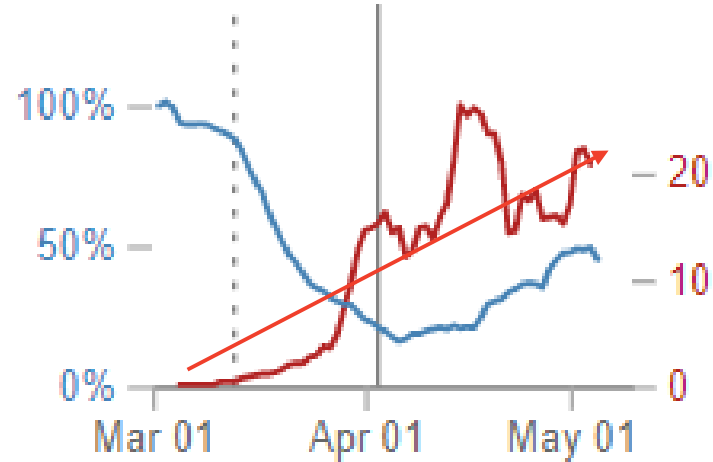
Reference: Playford et. al. How Florida slowed coronavirus: everyone stayed home before they were told to, Tampa Bay Times, 5/10/2020.

Movement (% Δ) vs. New Cases (#)

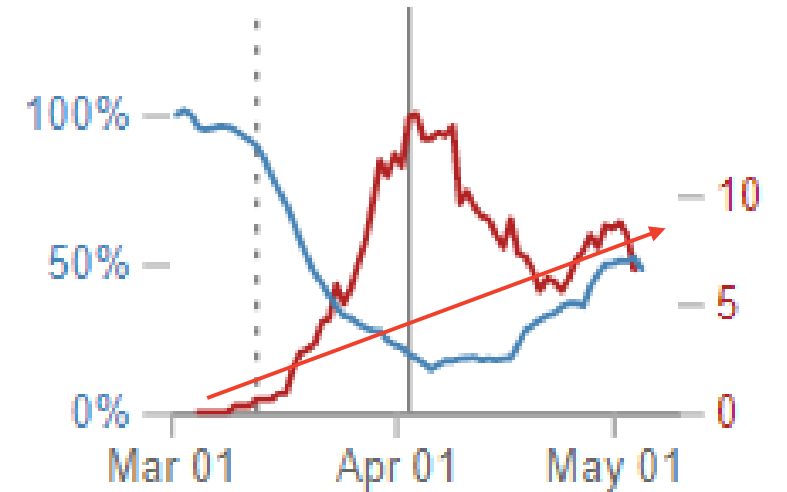
Polk



Manatee

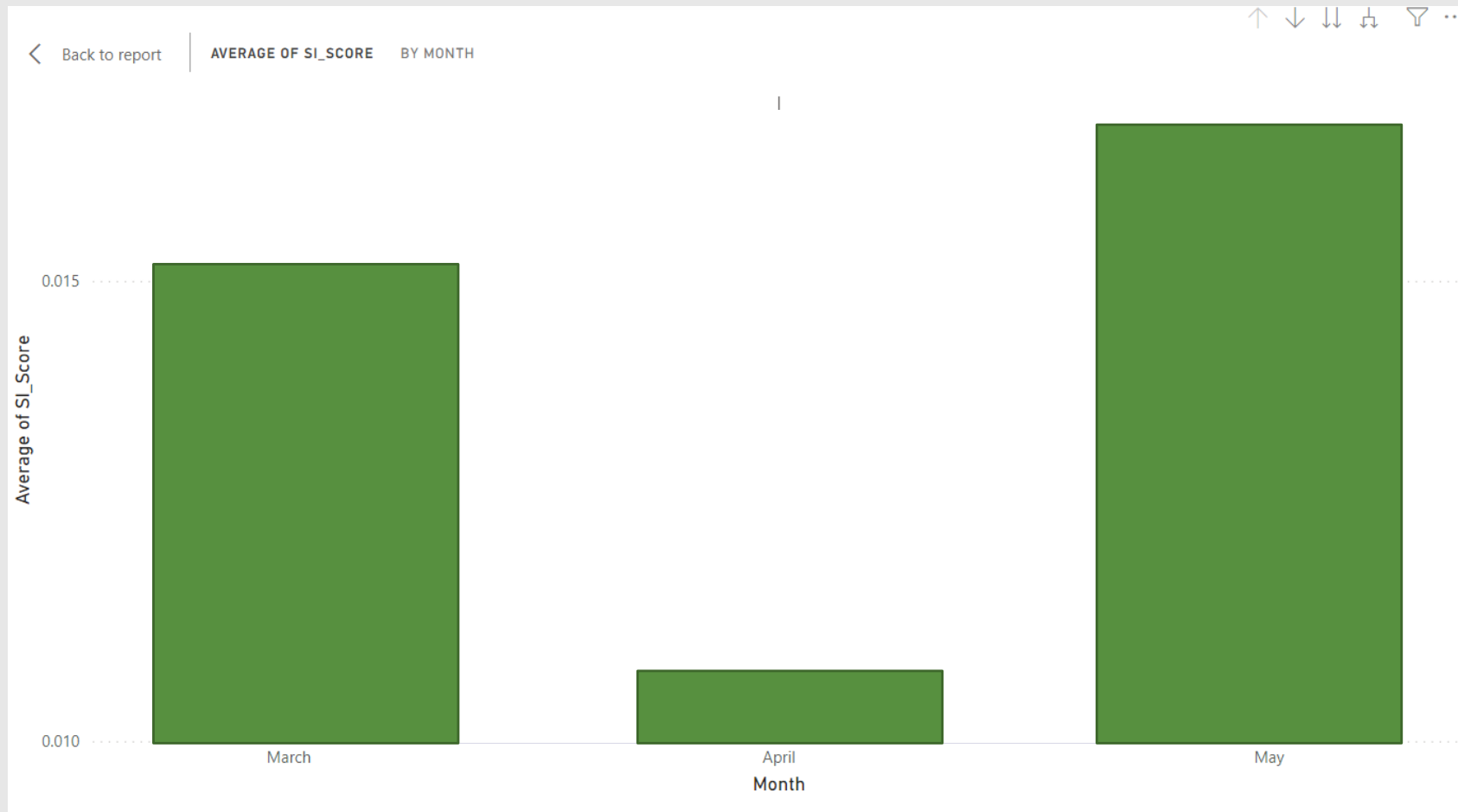


Sarasota

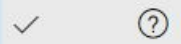


Region: Movement Behavior

Macro SI Score: calculated by 3 mobility measures



Here's the analysis of the 29.17% decrease in Average of SI_Score between March and April



Average of SI_Score and Count of SI_Score

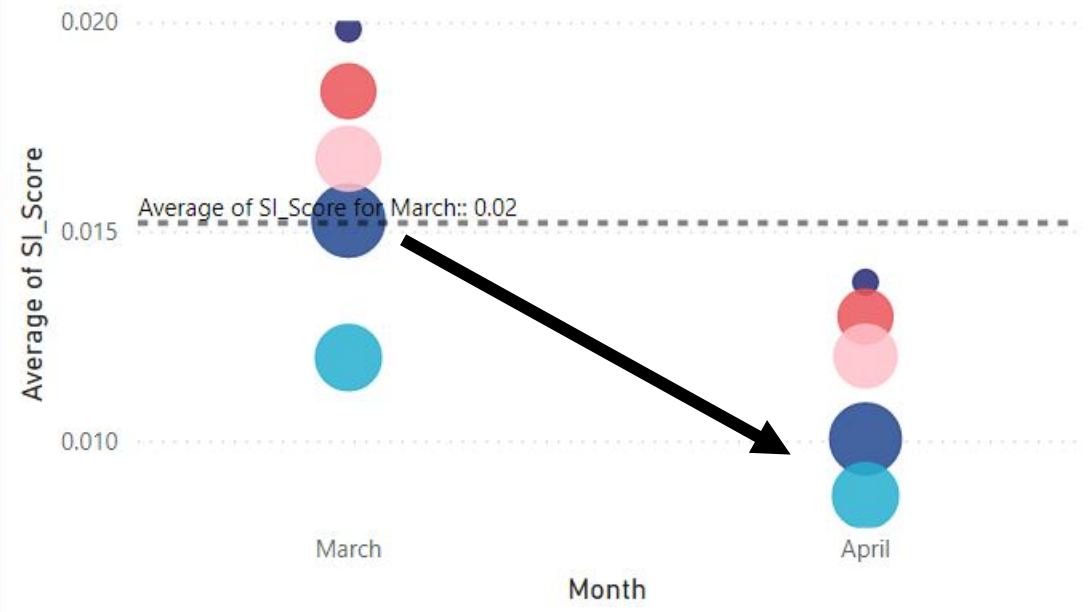
BY COUNTY AND MONTH



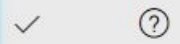
'Hillsborough' had the most significant impact on the decrease among county.

Hillsborough

county ● Hardee ● Hillsborough ● Marion ● Pinellas ● Polk



Here's the analysis of the 29.17% decrease in Average of SI_Score between March and April



Average of SI_Score and Count of SI_Score

BY ZIP AND MONTH



33835, 34250, and 34487, among others, had the most significant impact on the decrease among zip.

33835

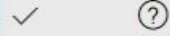
34250

34487

zip ● 33835 ● 34134 ● 34250 ● 34487 ● 34636



Here's the analysis of the 55.34% increase in Average of SI_Score between April and May



Average of SI_Score and Count of SI_Score

BY COUNTY AND MONTH



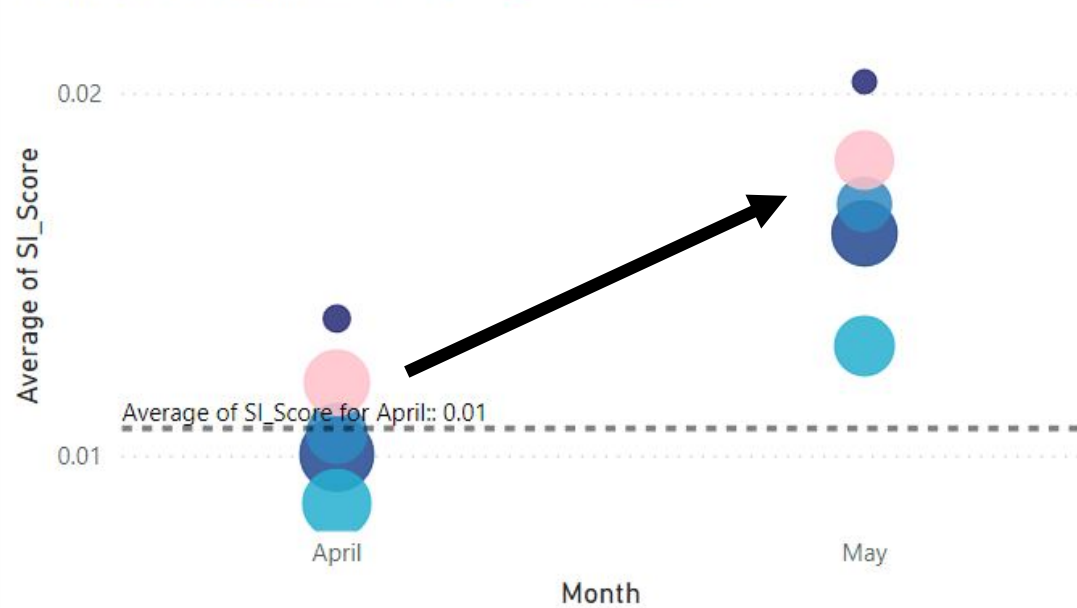
'Hillsborough', 'Polk', and 'Lee', among others, had the most significant impact on the increase among county.

Hillsborough

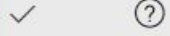
Polk

Lee

county ● Hardee ● Hillsborough ● Lee ● Pinellas ● Polk



Here's the analysis of the 55.34% increase in Average of SI_Score between April and May



Average of SI_Score and Count of SI_Score

BY ZIP AND MONTH



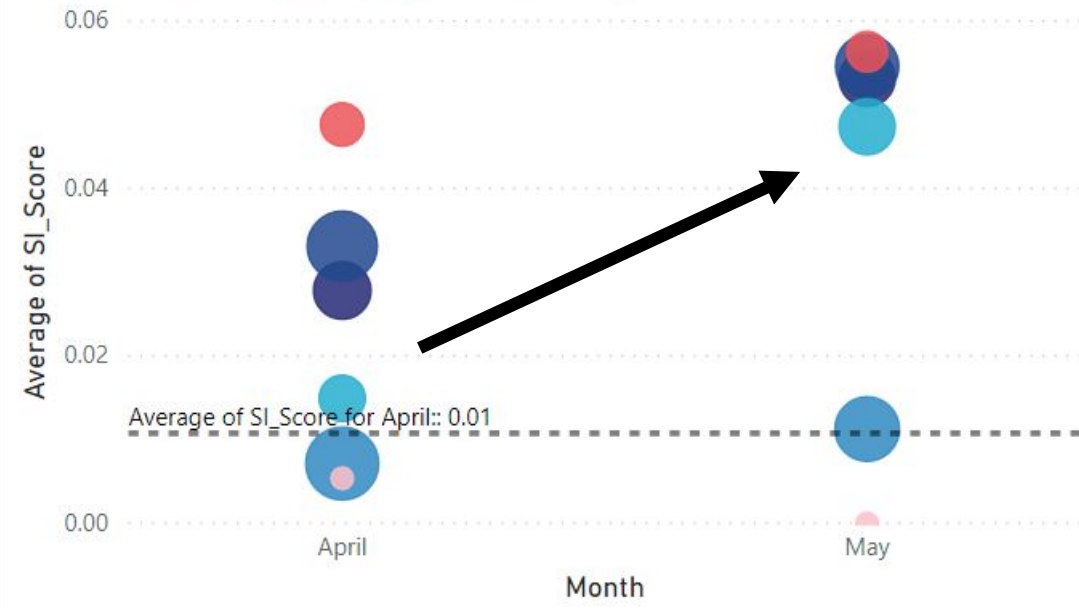
34441, 33586, and 33840, among others, had the most significant impact on the increase among zip.

34441

33586

33840

zip ● 33586 ● 33840 ● 34134 ● 34441 ● 34636 ● 34679



Capacity Dashboard – Region 6/4/2020

Florida West Coast Regional Data Exchange

Data Updated 06/04/2020

ICU

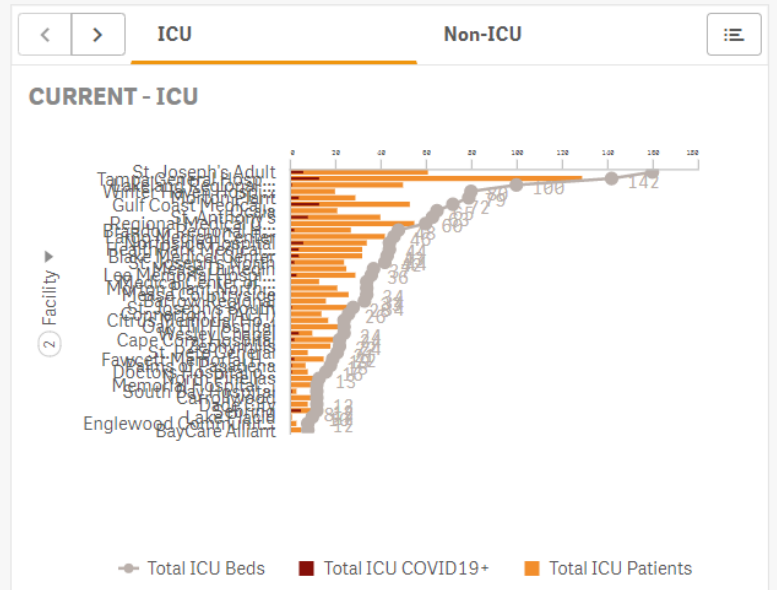
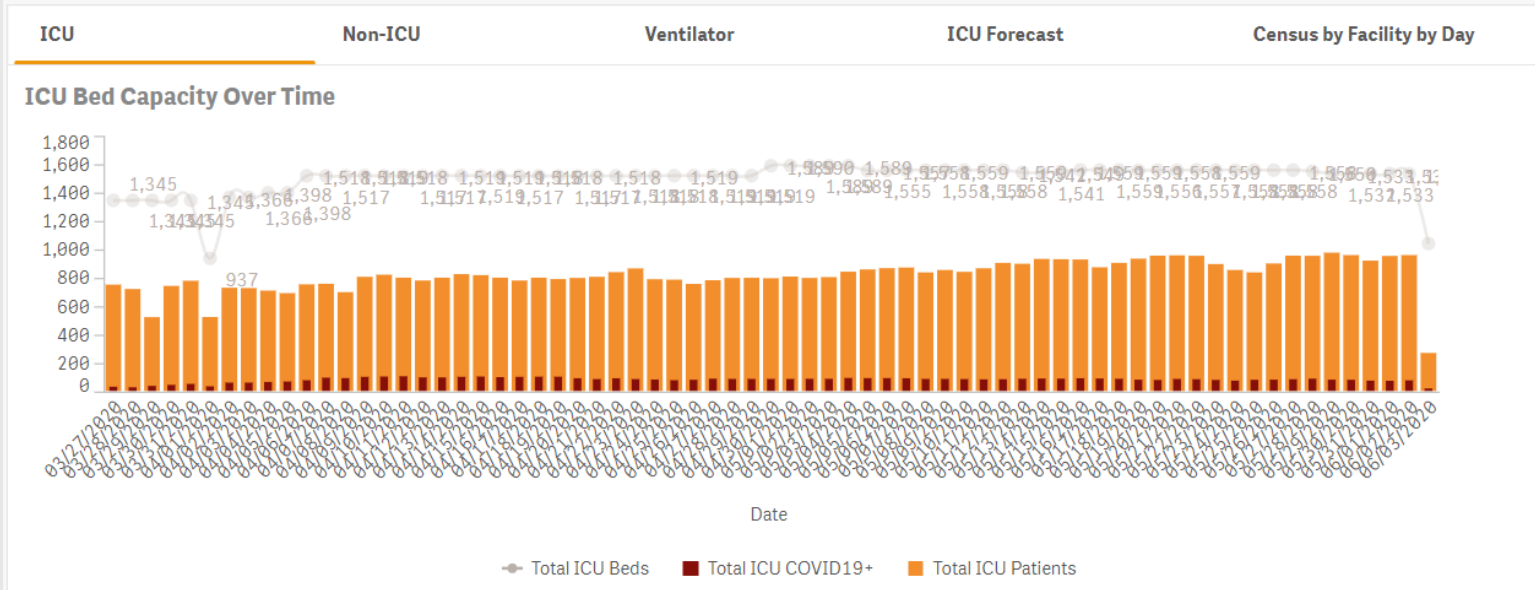
% ICU Occupancy

61.6%

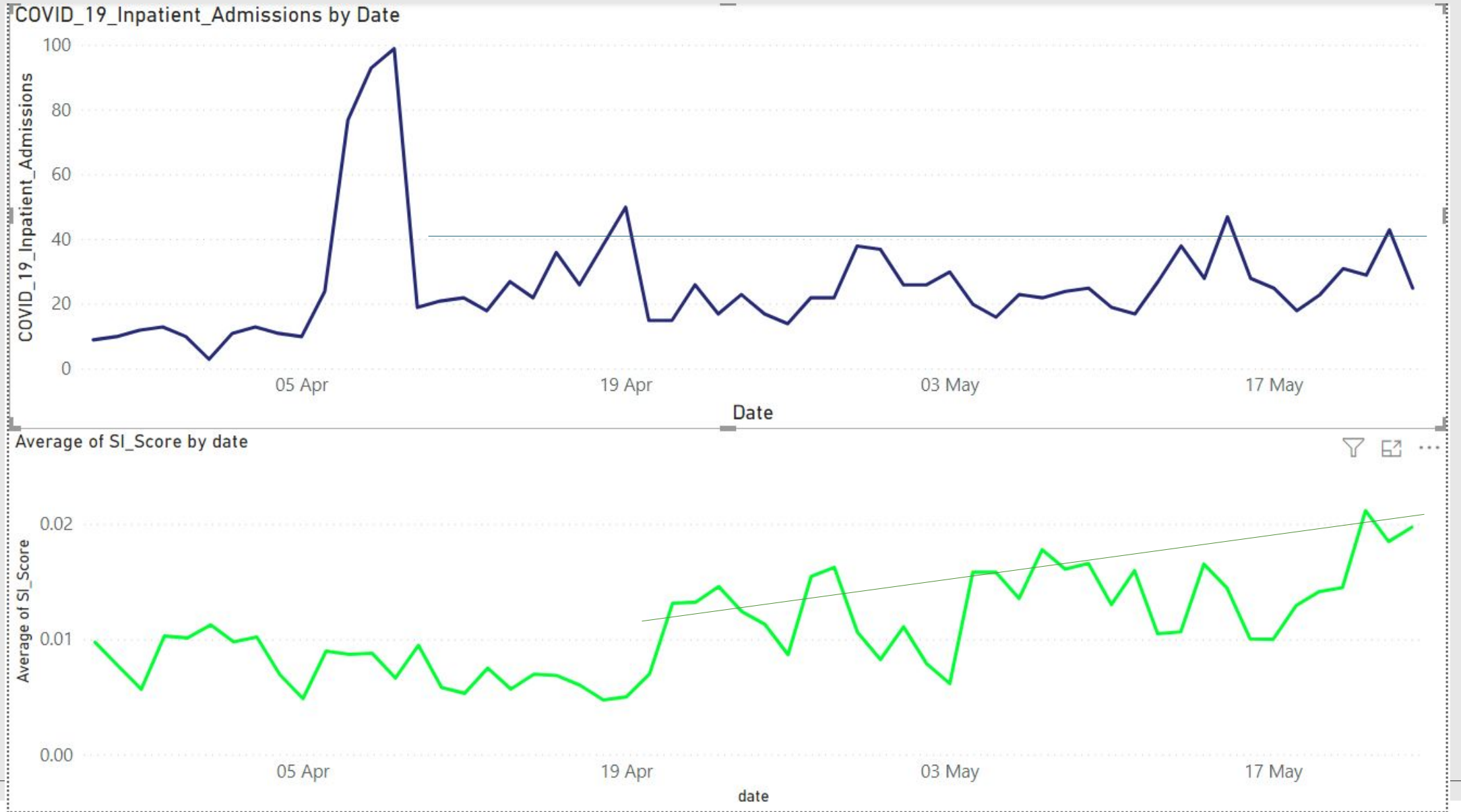
Total ICU Patients	Available ICU Beds	Total ICU Beds	Total ICU COVID19+
1k	629	1,639	83
Total Vented Patients	Available Ventilators	Total Ventilators	Total Vented COVID19+
273	1,500	1,773	21

Total Hospitalized COVID19+

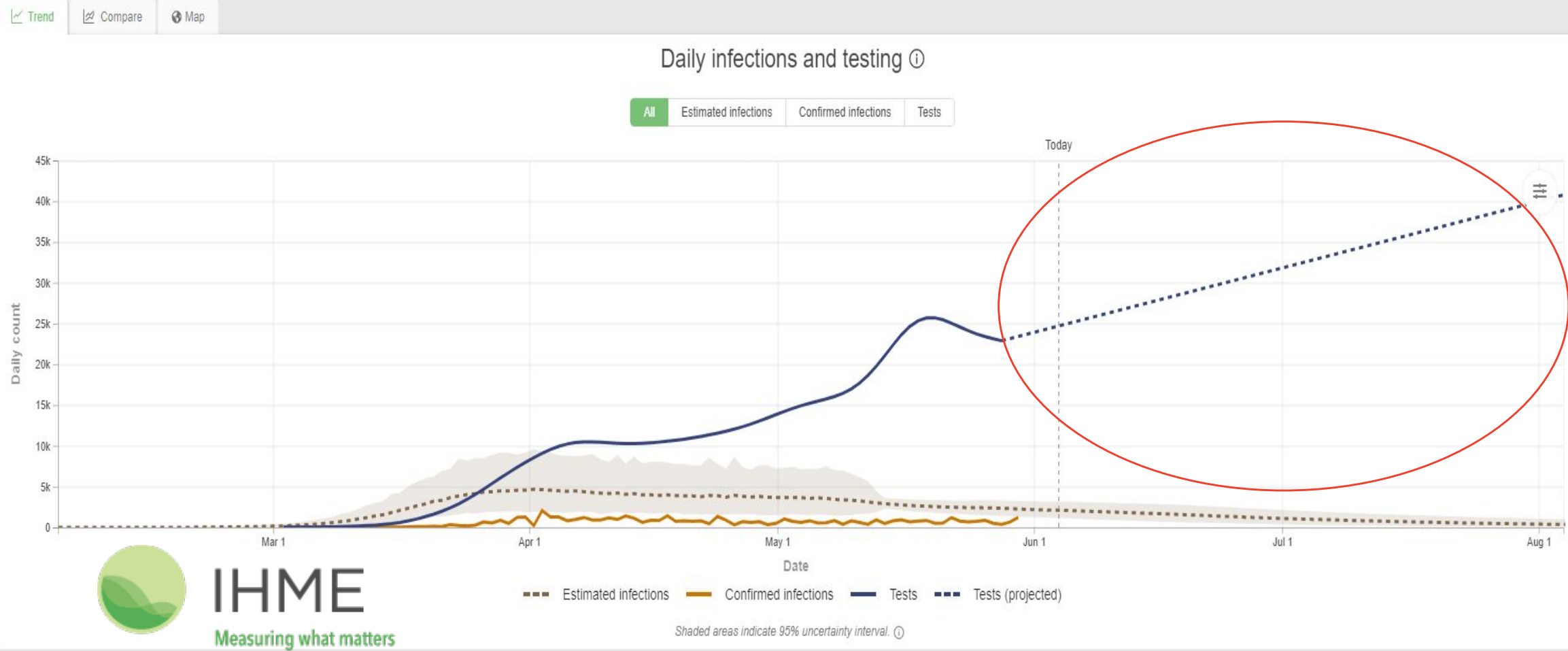
445



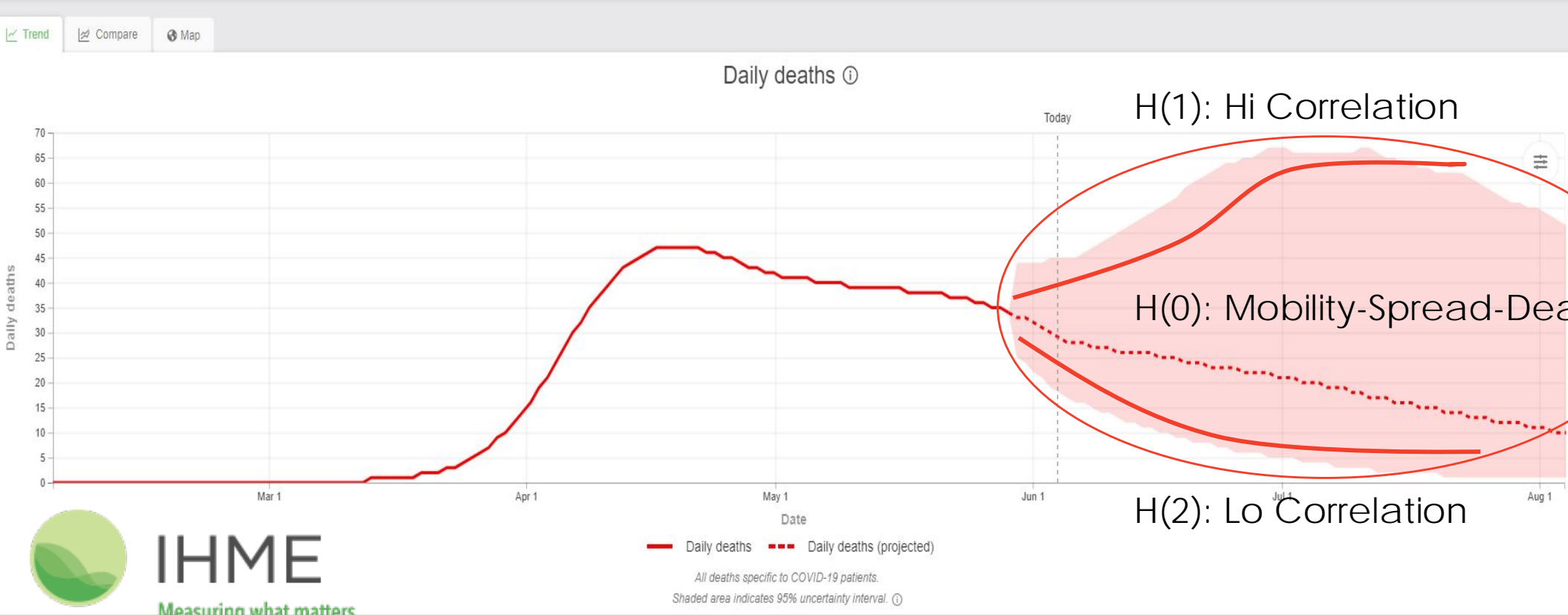
Region: Comparison of movement to admissions



State: Infections Continue to Rise w/ Movement



State: Daily Deaths Show Wide Range of Possibilities Related to Assumptions



Personal Privacy Protections

- Not tracing
 - Not individual tracking
 - Consultative support for the county
 - Leverages data supplied in accordance with comprehensive data protection laws (CCPA, GDPR)
 - Typically available anonymized movement data similar to those used in airports, traffic flow and shopping malls
 - Identifies and spatially highlights mobile movement on the aggregate
 - Compares movement to hospital bed utilization without resolution to specific individual or location
 - Perform statistical correlation analysis using data on movement and density to:
 - Probability of needed beds, PPE and key medical equipment like ventilators in hospitals
 - Where best to resource first responders to avoid resurgence of the virus
 - Response is a function of well established first responder protocols and public policy including personal confidentiality and security.
- **All data presented:**
 - Contains no personally identifiable information
 - Contains no HIPPA protected information
 - Complies with comprehensive data protection laws in 80+ countries including GDPR (EU) and CCPA (California Consumer Privacy Act)
 - Device data is Opt-In and Cleaned Daily for Opt-Out

Largest Risks to COVID Hospital Capacity

- Map Targeted Nursing/Group Home Facilities
- Conduct Targeted Daily Cluster Analysis
- Evaluate Daily Correlation Graph (by Hospital)

Data Driven

- Centralize Comprehensive Dashboard (spread, capability, outcomes)
- Explore and Test Key Parameters in the Models
- Pose Tough Questions and Find Insights in the Data

Actionable

- Create daily feeds to Coordinating Officials & EPG Access
- Deploy Mobile testing teams
- Deploy Mobile care triaging/monitoring teams

Data Science

- Automate: How and When to send alerts to key officials...
- Learn: How to use other datasets (syndromic/tracing/demographic) to improve model accuracy...

Actions Moving Forward

- Continue to increase the power and accuracy of the predictive models
- Add prescriptive modeling and generate key insights
- Generate actionable alerts for immediate response and strategic decision making

Steering Team

- Matthew Mullarkey, Ph.D., USF Muma College of Business, ISDS
- Kaushik Dutta, Ph.D., USF Muma College of Business, ISDS
- Wolfgang Jank, Ph.D., USF Muma College of Business, ISDS
- Marissa Levine, M.D., USF College of Public Health
- Lori Collins, Ph.D., USF College of Arts & Sciences, Geo Sciences
- Daniel McSkimming, Ph.D., USF College of Medicine, Bio Informatics
- Alya Limayem, Ph.D., College of Arts & Sciences, Microbiology
- Sidney Fernandes, CIO, USF
- Peter Chang, M.D., Tampa General Hospital
- Brian Hammond, CTO, Tampa General Hospital
- Mike Merrill, County Administrator, Hillsborough County
- Ramin Kouzehkanani, CIO, Hillsborough County
- Dennis Jones, Fire Chief, Hillsborough County
- Gene Early, Health, Hillsborough County



Project ASPeCT

(Anonymized, systematic, population e-
(geo-fenced) Contagion Tracking)

Geo-fenced Contagion
Tracking System

+

Comprehensive
Decision Support
Dashboard
Approach