

Displaying Health Data

Cases, Techniques, Solutions

Colloquium + Live-Webcast + Recording
Medical Sciences Building (MBS) 160
University of Victoria
November 28 – 30 , 1 – 3 pm PST



University
of Victoria



INSTITUTE ON AGING
& LIFELONG HEALTH



island health



IALSA



UNIVERSITY OF
CENTRAL FLORIDA



Displaying Health Data

Cases, Techniques, Solutions



Health Data

DAY 1

2018-11-28
Wednesday

13:00 Transactional data of Island Health: How patients vote with their feet
Dr. Ken Moselle (Island Health) and Dr. Andriy Koval (BC Observatory, UCF)

14:00 Visualizing logistic regression with the “coloring book” technique:
A study in ggplot2
Dr. Andriy Koval (BC Observatory for Population and Public Health, UCF)

Substance Use

DAY 2

2018-11-29
Thursday

13:00 Nuances of information sharing and data display in a mobile application for students with substance use disorder

Dr. Barbara (Basia) Andraka-Christou (University of Central Florida)

14:00 Optimizing public health surveillance through reproducible reporting:
Response to opioid crisis on Vancouver Island
Shannon Tracey (University of Victoria) and Maritia Gully (Island Health)

Pipelines & Dashboards

DAY 3

2018-11-30
Friday

13:00 Building pipelines and dashboards for practitioners: Mobilizing knowledge with reproducible reporting

Dr. Will Beasley (University of Oklahoma Health Sciences Center)

14:00 Constructing workflows for reproducible analytics: Suppressing small counts for provincial chronic disease dashboard
Dr. Andriy Koval (BC Observatory, UCF) and Anthony Leamon (Island Health)

Transactional Data of Island Health

How patients vote with their feet



Andriy
Koval



Ken
Moselle



4 years ago...

- Colloquium on methods and applications for aging research
- <http://ialsa.github.io/COAG-colloquium-2014F/>
- Ended with a talk on visualizing statistical models

Dialects of data expression



Tabular

id	time	attend	model
1	0	1	2.788
1	1	6	2.732
1	2	2	2.675
1	3	1	2.618
1	4	1	2.562
1	5	1	2.505
1	6	1	2.449
1	7	1	2.392
1	8	1	2.335
1	9	1	2.279
1	10	1	2.222
1	11	1	2.166
4	0	2	2.788
4	1	1	2.732

Algebraic

$$y_{it} = \beta_0 + \beta_1 time_t + \varepsilon_{it}$$

$$\beta_0 = \gamma_{00}$$

$$\beta_1 = \gamma_{10}$$

Semantic

In 2000 respondents attended church less than once a month (2.79) and gradually declined in their attendance since (.06 per year).

Syntactic

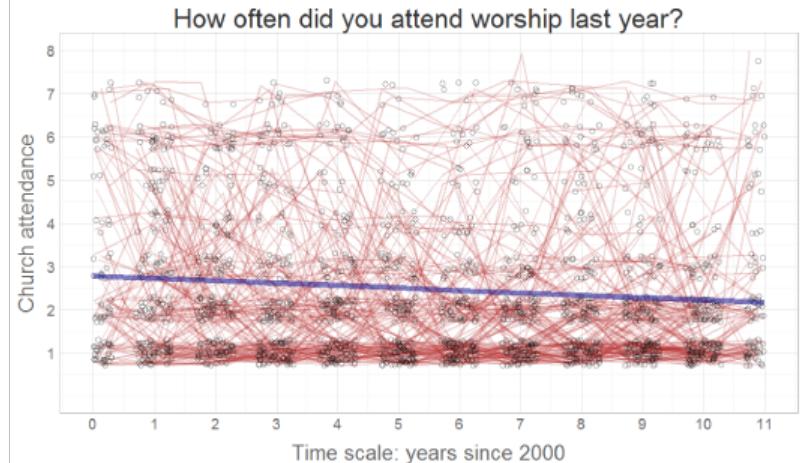
```
nlme::gls(attend ~ 1 + time, data=dsM)
```

Numeric

Coefficients:

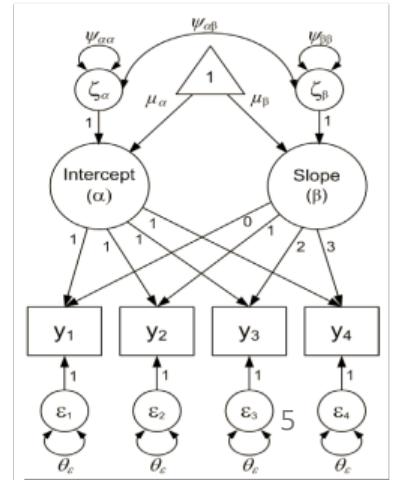
	Value	Std. Error	t-value	p-value
(Intercept)	2.7882	0.07774	35.86	0
time	-0.0566	0.01197	-4.73	0

Graphical



	modelB
logLik	-3719
deviance	7438
AIC	7444
BIC	7461
df.resid	1858
N	1860
p	2
ids	155

Schematic



Today

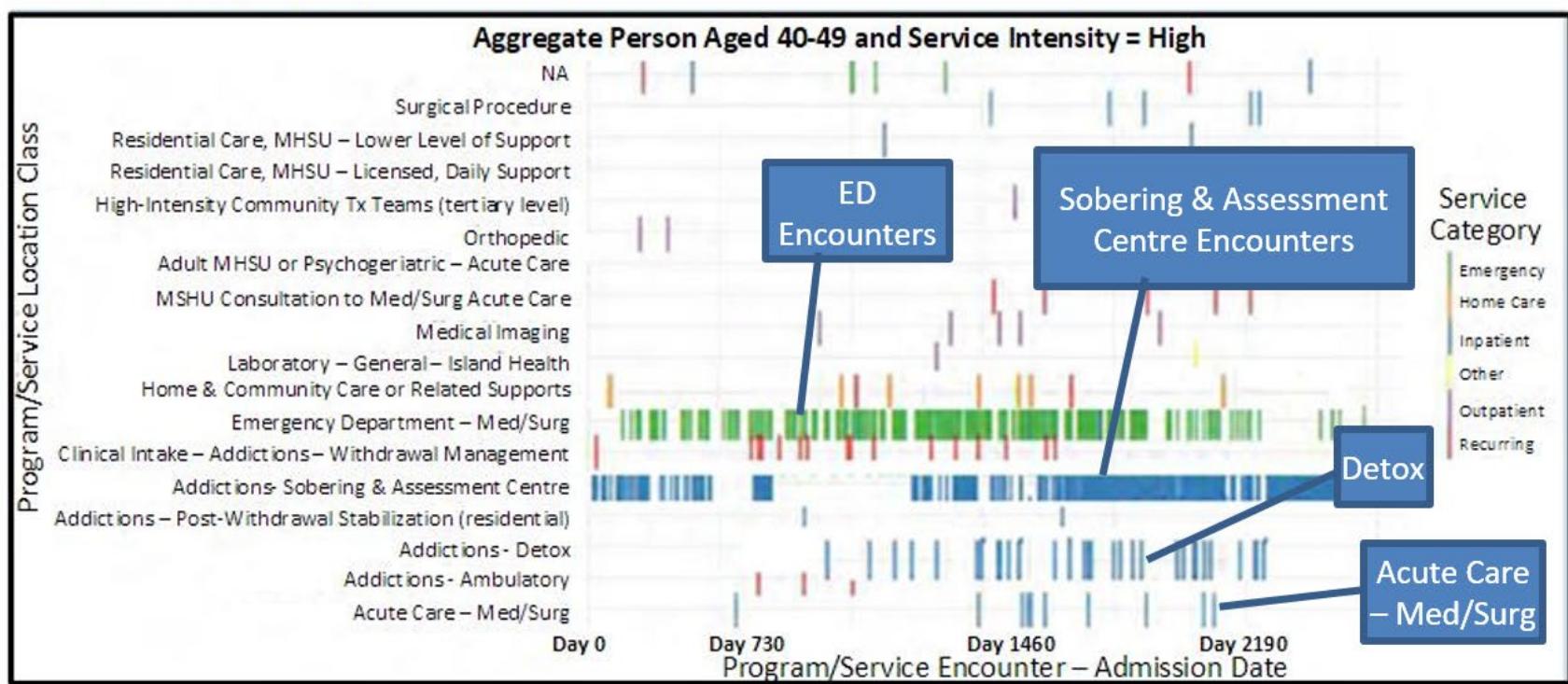
- How do patients vote with their feet?
- We will demonstrate 2 solutions to:
 - 1) How to represent a journey of one patient?
 - Clinical Context Coding Scheme
 - 2) How to summarize a collective experience?
 - Sequence of alluvia/sankey plots (as an e.g.)



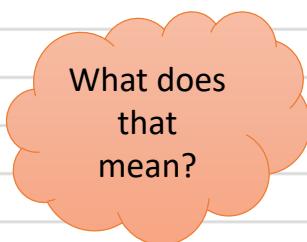
M

Figure 1. Sample withi-person-over-time trajectory (de- identified)²—cross-continuum encounter data

Cohort – Severe Addiction



1	Unit_Name
110	Respiratory Therapy-CDH
111	Respiratory Therapy
112	Respiratory Therapy Clinic-CVH
113	Respiratory Therapy Clinic-CRG
114	RJH - ROYAL BLOCK EXT 3 RESPIRATORY (old S3)
115	RJH - ROYAL BLOCK EXT 4 RESPIRATORY (old S3)
129	House 1
130	Mt. Doug Apts
131	House 2
132	A Wing-Cowichan
133	House 3
134	House 1
135	House 2
136	House 3
137	House 4
138	House 4
139	A Wing-Cowichan
140	A Wing
141	Sandringham Community Residential



location_class_code	location_class_description
78	ED - Med-Surg
148	Medical Imaging
146	Lab - Island Health - General
57	H&CC Services
66	Acute Care - Med-Surg - Mixed Ages
34	Clinical Intake - Adult MHSU
140	Surgery - Same Day - Mixed Ages
145	Electrodiagnostics
142	Surgery - Post - Acute Care
135	Med-Surg - Ambulatory Mixed Episodic - Chronic - Mixed Ages
91	Endoscopy
138	Surgery - Prep - Recovery - Mixed Ages
37	Clerical Intake - Older Adults
43	Psychiatric [only] Clinic Services - Adults
16	Time-limited Ambulatory Treatment Services - Mental Health - Adults (secondary level)

This is more meaningful!

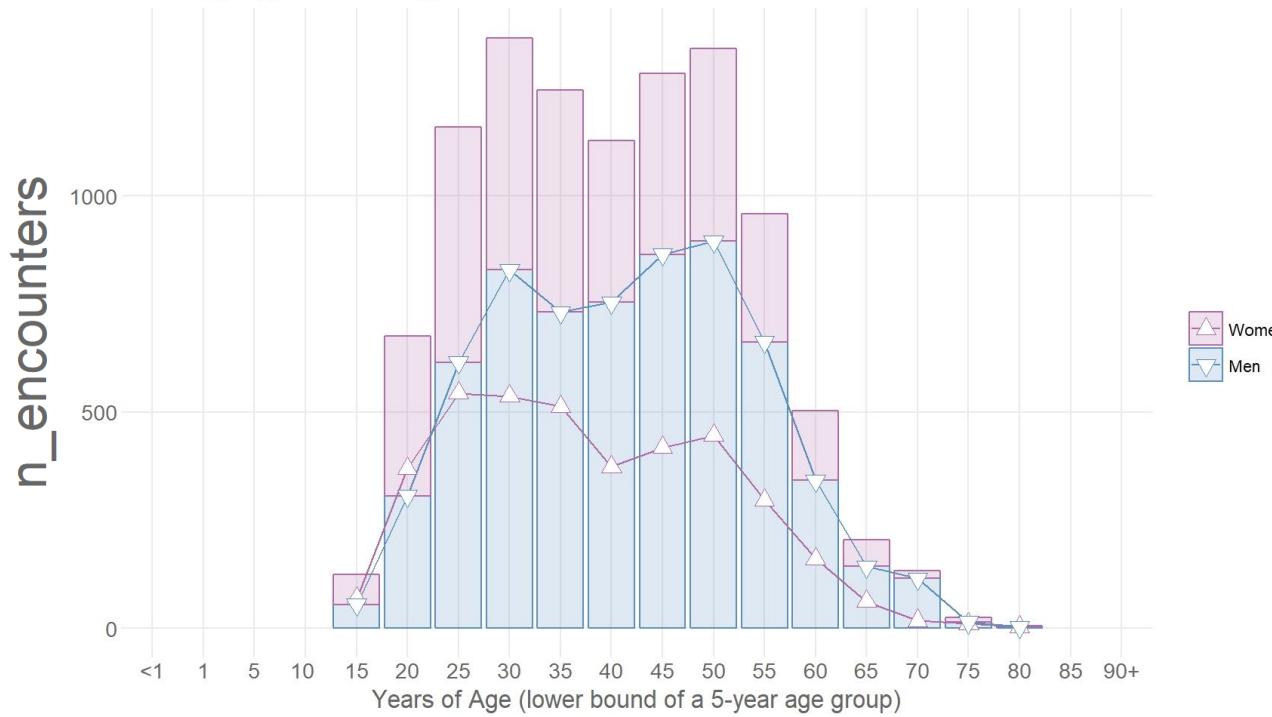
Health Programs
 $N = 1700+$



Service Classes
 $N = 150+$

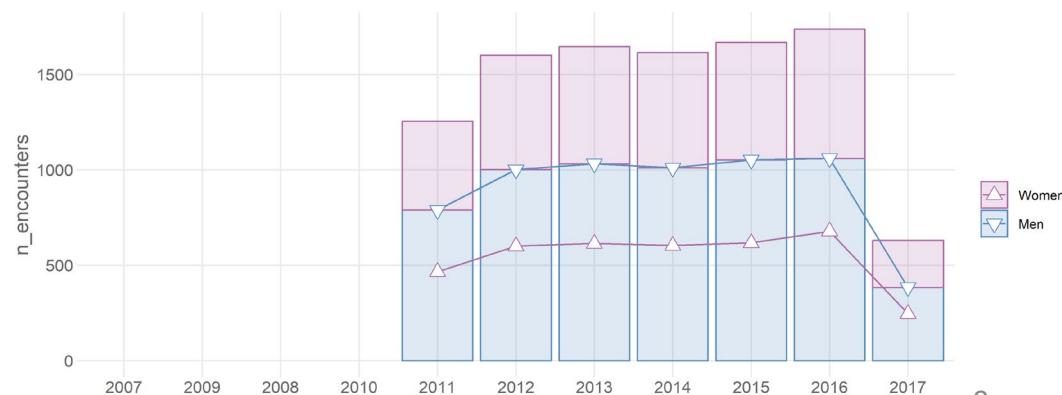
24 - Detox Facility

Service class - [24] - Addictions - Detox (2ary)
 Clinical Focus - MHSU-Addictions
 Intensity Type - ED, Urgent Care, Acute



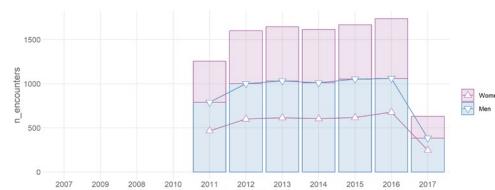
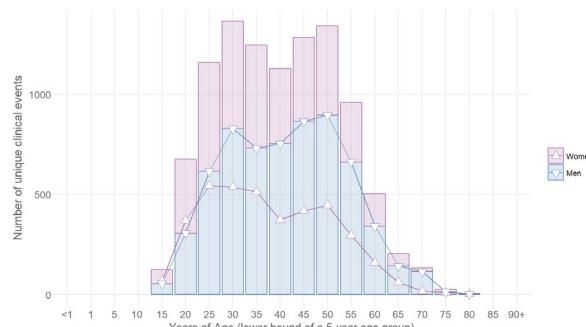
— Clinical Context Coding Scheme (CCCS) Coordinate —

compressor	value
location_class_code	24
location_class_description	Addictions - Detox (2ary)
intensity_type	ED, Urgent Care, Acute
intensity_severity_risk	Acute Care
clinical_focus	MHSU-Addictions
service_type	Detox-MHSU
service_location	Detox Facility
population_age	Adults, some adols, older adults



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CERNER

VIHA EDW

CERNER EHR + VIHA EDW —

location_map_id	facility_name	building_name	unit_name	location_category	location_grouping	location_type
313	Mental Health & Addictions Service NI - Community Care	Lilli House	Lilli House Detox - Comox Valley	Inpatient-Residential	Inpatient-Residential	Inpt-ResCare-MHAS
1035	MHSU - Residential - Detox	Clearview Detox, Nanaimo - MHSU	Clearview Detox	Inpatient-Residential	NA	Inpt-ResCare-MHAS
1237	Mental Health & Addictions Service CI - Residential Care	Clearview Detox, Nanaimo - MHAS	Clearview Detox	Inpatient-Residential	Inpatient-Residential	Inpt-ResCare-MHAS
1748	MHSU - Residential - Stabilization / Supportive Recovery	Royal Jubilee Eric Martin Pavilion	EMP 5A - Detox Unit-RJH	Inpatient-Residential	NA	Inpt-ResCare-MHAS
1866	MHSU - Residential - Mt Waddington	New Beginnings	Mount Waddington Outpatient Detox	Community-MHAS	Mental Health Community Care Services	Community-MHAS
2116	Mental Health & Addictions Services Community Care	Eric Martin Pavilion	EMP 5A - Medical Detox	Inpatient-Residential	Inpatient-Residential	Inpt-ResCare-MHAS
2238	Mental Health & Addictions Services - Residential Care	Eric Martin Pavilion	EMP 5A - Detox Unit	Inpatient-Residential	Inpatient-Residential	Inpt-ResCare-MHAS

Intensity Type

14 groupings

— Clinical Context Coding Scheme (CCCS) Coordinate —

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clinical_focus	MHSU-Addictions
service_type	Detox-MHSU
service_location	Detox Facility
population_age	Adults, some adols, older adults

intensity_type	Totals
Administrative	2
Ambulatory-Chronic	110
Ambulatory-Episodic	314
Ambulatory-Mixed	116
Community Support	89
ED, Urgent Care, Acute	325
Intake, Assessment	31
Laboratory	114
Medical Imaging	50
Morgue	20
Pharmacy	10
Primary Care	6
Residential Care	230
Surgery	136
Totals	1,553

of service programs in the grouping

1553 unique service programs engaged by this cohort

Intensity, Severity, Risk

36 groupings

— Clinical Context Coding Scheme (CCCS) Coordinate —

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population_age	Adults, some adols, older adults

Medium Intensity Res Care - Bridging, Crisis	10
Medium-Intensity Community Tx & Support	75
Morgue	20
Pharmacy	10
Primary Care-IH Clinic	6
Rental Supplement	13
Surgery-Anaesthesia	7
Surgery-Day Procedure	16
Surgery-Proceure-Same Day	21
Surgery-Procedure-Acute Admission	13
Surgical-Care, Support	44
Surgical-Post-Acute Care	35
Tertiary Acute	4
Totals	1,553

intensity_severity_risk	Totals
Acute Care	191
Administrative	2
Ambulatory Chronic Care-High Intensity	27
Ambulatory Chronic Care-Moderate Intensity	83
Ambulatory Episodic-High Intensity	38
Ambulatory Episodic-Low Intensity	28
Ambulatory Episodic-Moderate Intensity	227
Ambulatory Mixed-Moderate Intensity	116
Clerical Intake	5
Emergent-Community	12
Emergent-Hospital	84
High Intensity Community Tx & Support	14
High Intensity Res Care	7
High-Intensity Assessment, Intake, Referral	21
Intensive Care	23
Lab-General	109
Lab-Genetics	5
Licensed Residential Care	133
Lower Intensity Res Care	7
Lower-Intensity Assessment, Intake, Referral	26
Lower-Intensity, Time-Delimited	11
Medical Imaging	50
Medium Intensity Res Care	60

Clinical Focus

46 groupings

— Clinical Context Coding Scheme (CCCS) Coordinate —

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service_location	Detox Facility
population_age	Adults, some adols, older adults

Med-Surg	178
Medical Imaging	50
Medical-Intensive	19
Misc	13
Morgue	20
Neurological	22
Nutrition	13
Oncology	27
Ophthalmology	7
Orthopedic	20
Pain	5
Pharmacy	10
Physical or Functional Issues	59
Primary Care	6
Psychogeriatrics	6
Respiratory	11
Sleep	2
Surgical	120
Thoracic	7
Urological	18
Wound Care	6
	Totals 1,553

clinical_focus	Totals
Administrative	2
Brain Injury or Intellectual Disability	1
Breast Health	2
Cardiovascular	23
Developmental - Phys,Cog	19
Developmental - Phys,Cog,Psych	3
Diabetes	10
Digestive System	16
ENT	4
Early Childhood Care and Development	1
Electrodiagnostics	12
Emergency Response	79
End of Life	13
Endocrine	1
Female Reproductive	7
Frailty, Non-Specific or Mixed	172
Frailty-Mainly ADL	48
Frailty-Neurocog, Psychiatric	8
Genetics	5
Kidneys	23
Lab	114
Liver	6
MHSU	277
MHSU-Addictions	56
Maternity, Perinatal	32

Service Type

54 groupings

— Clinical Context Coding Scheme (CCCS) Coordinate —

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clinical_focus	MHSU-Addictions
service_type	Detox-MHSU
service_location	Detox Facility
population_age	Adults, some adols, older adults

Laboratory	114
Maternity	20
Medical Imaging	50
Morgue	20
Multi-Service	6
Outreach-MHSU	12
Palliative, End of Life	13
Pharmacy	10
Primary Care	6
Rehab-MHSU	12
Rehab-Phys-or-Cog(Therapies)	87
Rental Supplement-MHSU	13
Res Care - MHSU - Supported Independent Living	7
Res Care-MHSU-Crisis	16
Res Care-MHSU-Family Care Home	1
Res Care-MHSU-Group Home, Apartment Cluster	11
Res Care-MHSU-Licensed	7
Res Care-MHSU-Post Detox	10
Residential Care-CHS-Assisted Living	38
Residential Care-CHS-Brain Injury, Int-Dis	1
Residential Care-CHS-Licensed	126
Specialist Consultation	2
Surgery-Ambulatory Prep, Procedure	18
Surgery-Day Procedure	22
Surgery-Prep, Recovery	32
Surgery-Procedure	13
Surgical-Post-Acute Care	35
Totals	1,553

service_type	Totals
Acute Care	142
Acute Care-Adjunct Therapies	18
Acute Care-Tertiary	4
Administrative	2
Ambulatory-Chronic	76
Ambulatory-Clinical Psychology	8
Ambulatory-Episodic	150
Ambulatory-Intensive	11
Ambulatory-Mixed	114
Ambulatory-Mixed-Group	2
Assertive Community Treatment (ACT)-MHSU	9
Assessment-Intensive	26
Case Management-MHSU	33
Case Management-SARIN	4
Crisis Response-Community	12
Detox-MHSU	5
Diagnostics	61
Dialysis	19
ECT	2
ED-Medical	79
ED-PES or Psychiatric Bed	5
EPI Protocol	4
H&CC Nursing, Support	10
Intake-Clerical	5
Intake-Clinical	26
Intensive Care	19
Intensive Case Management (MHSU)	5

Service Location

14 groupings

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service_type	Detox-MHSU
service_location	Detox Facility
population_age	Adults, some adols, older adults

service_location	Totals
Administrative	2
Ambulatory Clinic	513
Community	107
Community Facility	220
Detox Facility	5
Family Care Home	1
Home	42
Hospital	411
Hospital-ED	9
IH Lab	114
Medical Imaging	50
Morgue	20
Pharmacy	10
Telehealth	49
Totals	1,553

Population Age

7 groupings

population_age	Totals
Administrative	2
Adults, some adols, older adults	303
Children, Adolescents	51
Mixed Ages	936
Mother-Baby	34
Older Adults Targeted	226
Young Children	1
Totals	1,553

— Clinical Context Coding Scheme (CCCS) Coordinate —

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intensity_severity_risk	Acute Care
clinical_focus	MHSU-Addictions
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All possible combination
of compressors' levels

=

154 service classes

Health Programs
 $N = 1700+$

CCCS → Service Classes
 $N = 150+$

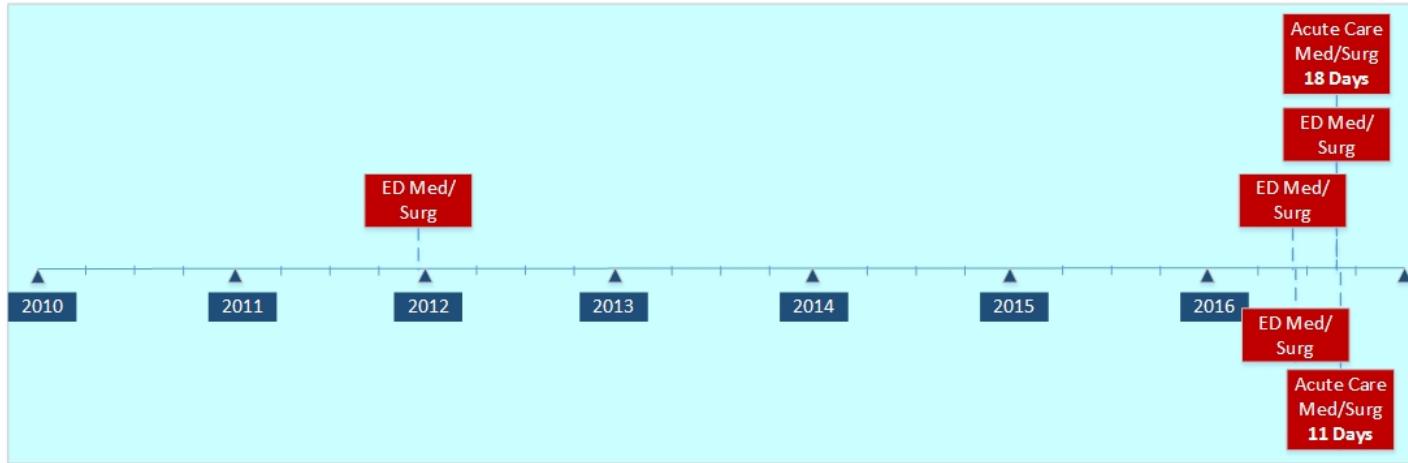
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34	Clinical Intake - Adult MHSU
140	Surgery - Same Day - Mixed Ages
145	Electrodiagnostics
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135	Med-Surg - Ambulatory Mixed Episodic - Chronic - Mixed Ages
91	Endoscopy
138	Surgery - Prep - Recovery - Mixed Ages
37	Clerical Intake - Older Adults
43	Psychiatric [only] Clinic Services - Adults
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But, do we *really* need non-primary care data?

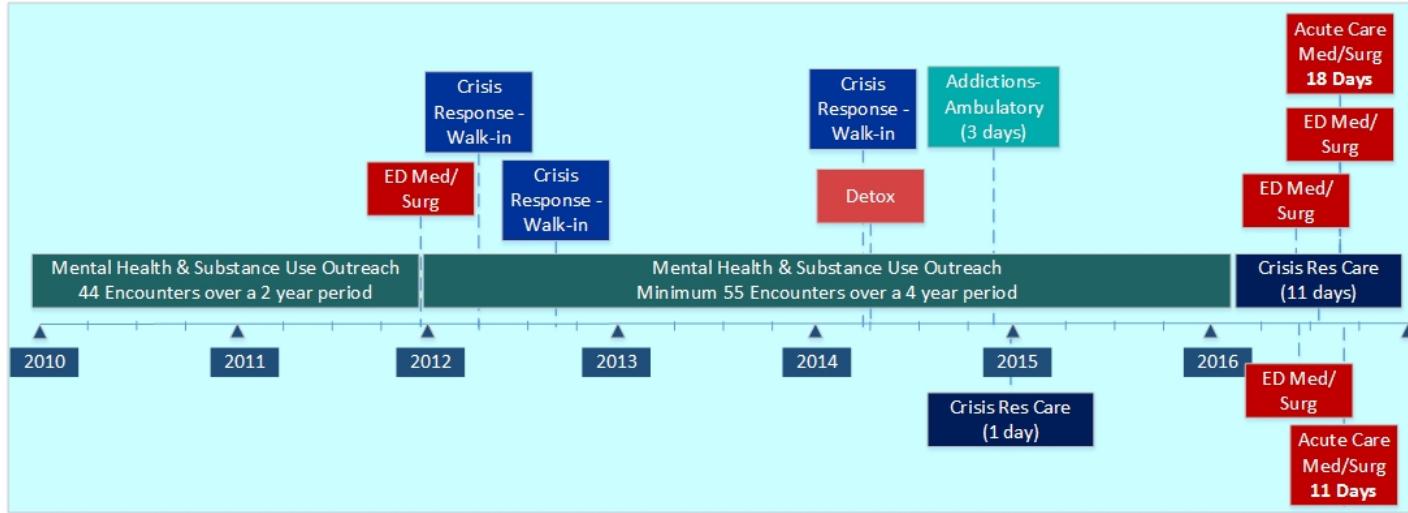


N

View based on CDC study/administrative data



View based on administrative plus transactional/clinical encounter data (3Ts data)



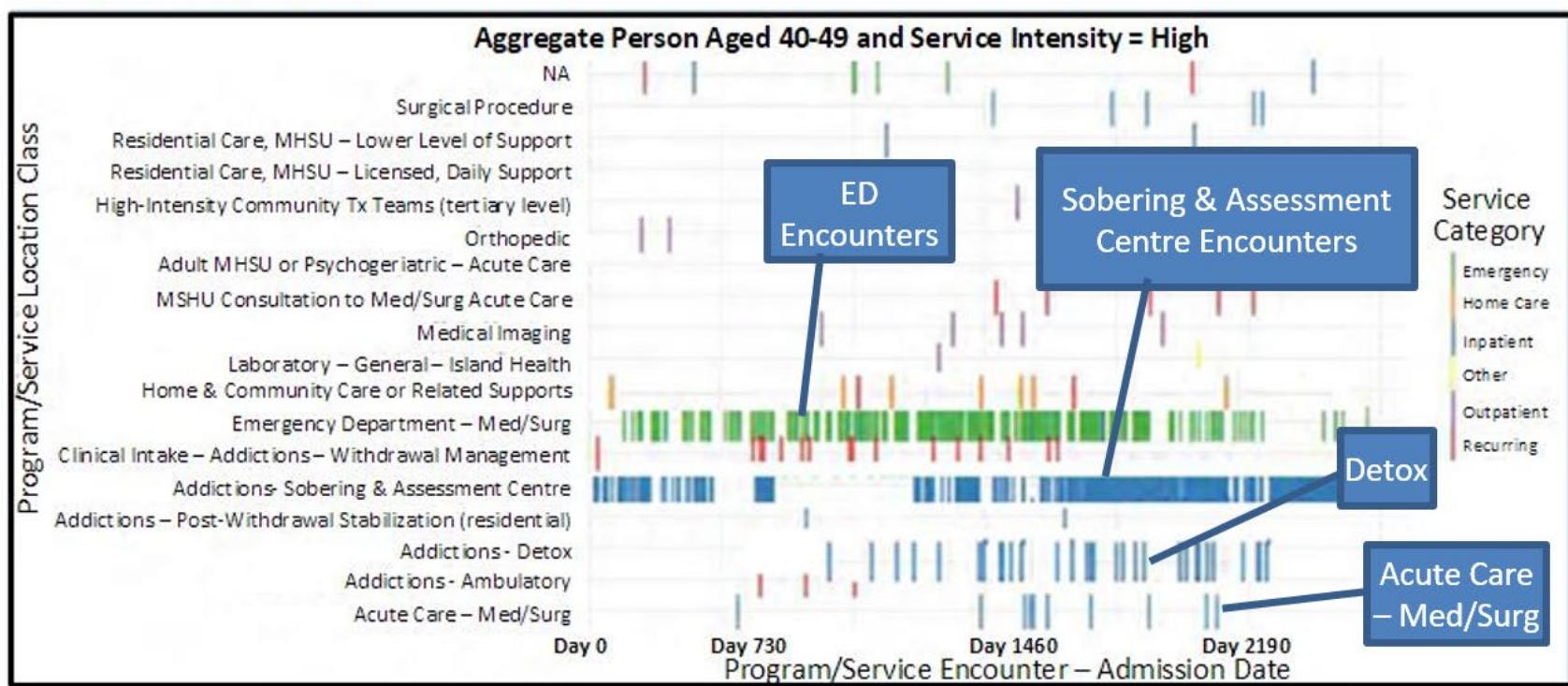


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M M M
M M M

Figure 1. Sample withi-person-over-time trajectory (de- identified)²—cross-continuum encounter data

Cohort – Severe Addiction



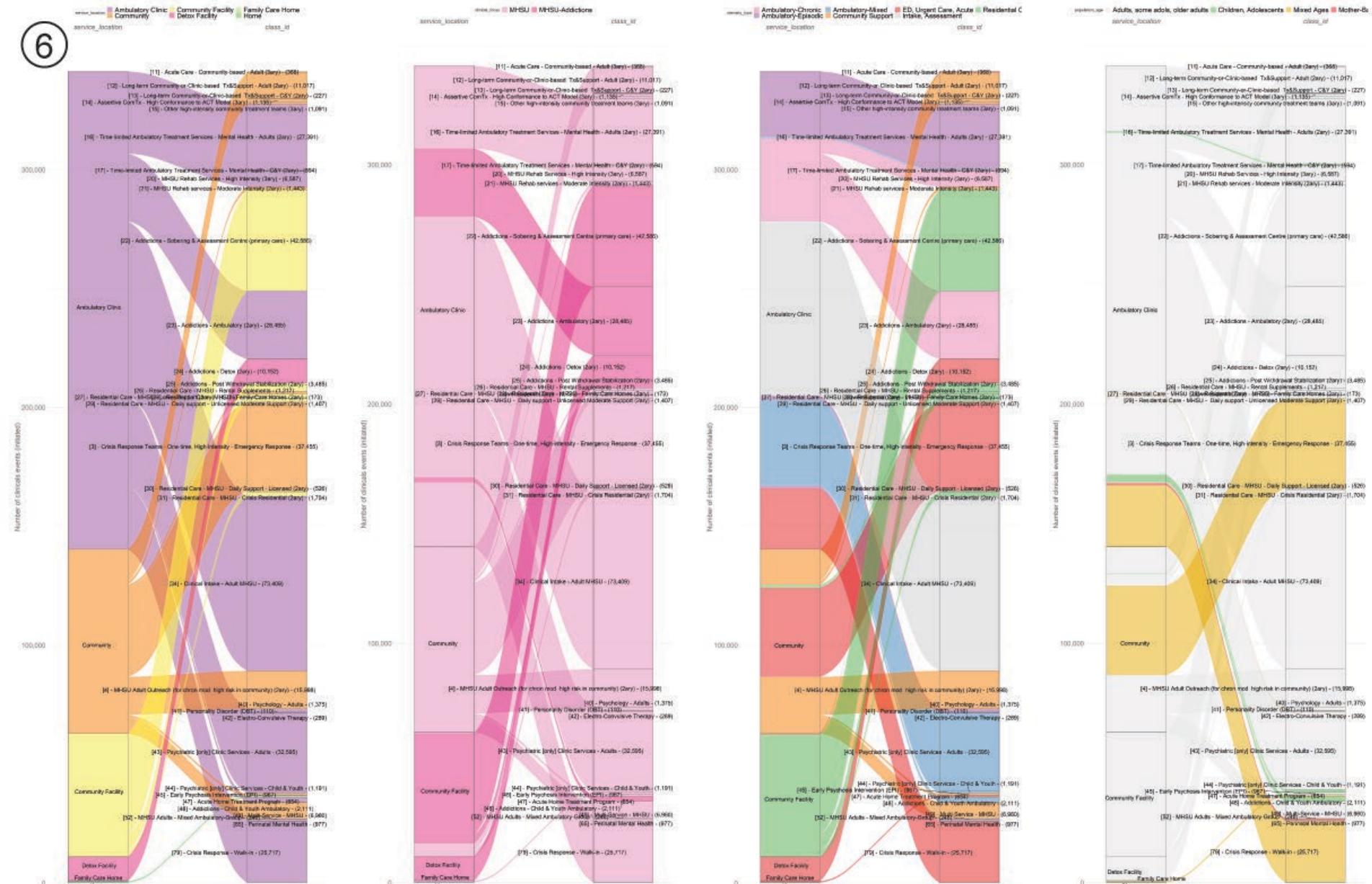
Define “group”

Research Cohort is defined as anybody who

- had contact with any **Mental Health & Substance Use (MHSU) program**
AND/OR
- had contact with any acute care service (**acute care admission**)
 - with an **MHSU discharge diagnosis** established AND/OR
 - had an **MHSU procedure** performed

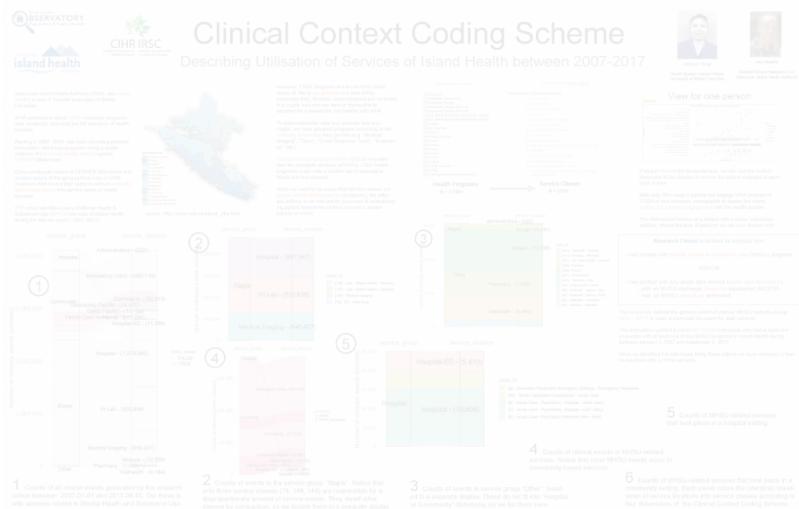
This formulation yielded a cohort of
170,533 individuals who had at least one
encounter with at least one of any
MHSU programs in Island Health
between 2007 and 2017

Once we identified the individuals fitting
these criteria we have retrieved **all** their
transactions with **all** VIHA services.



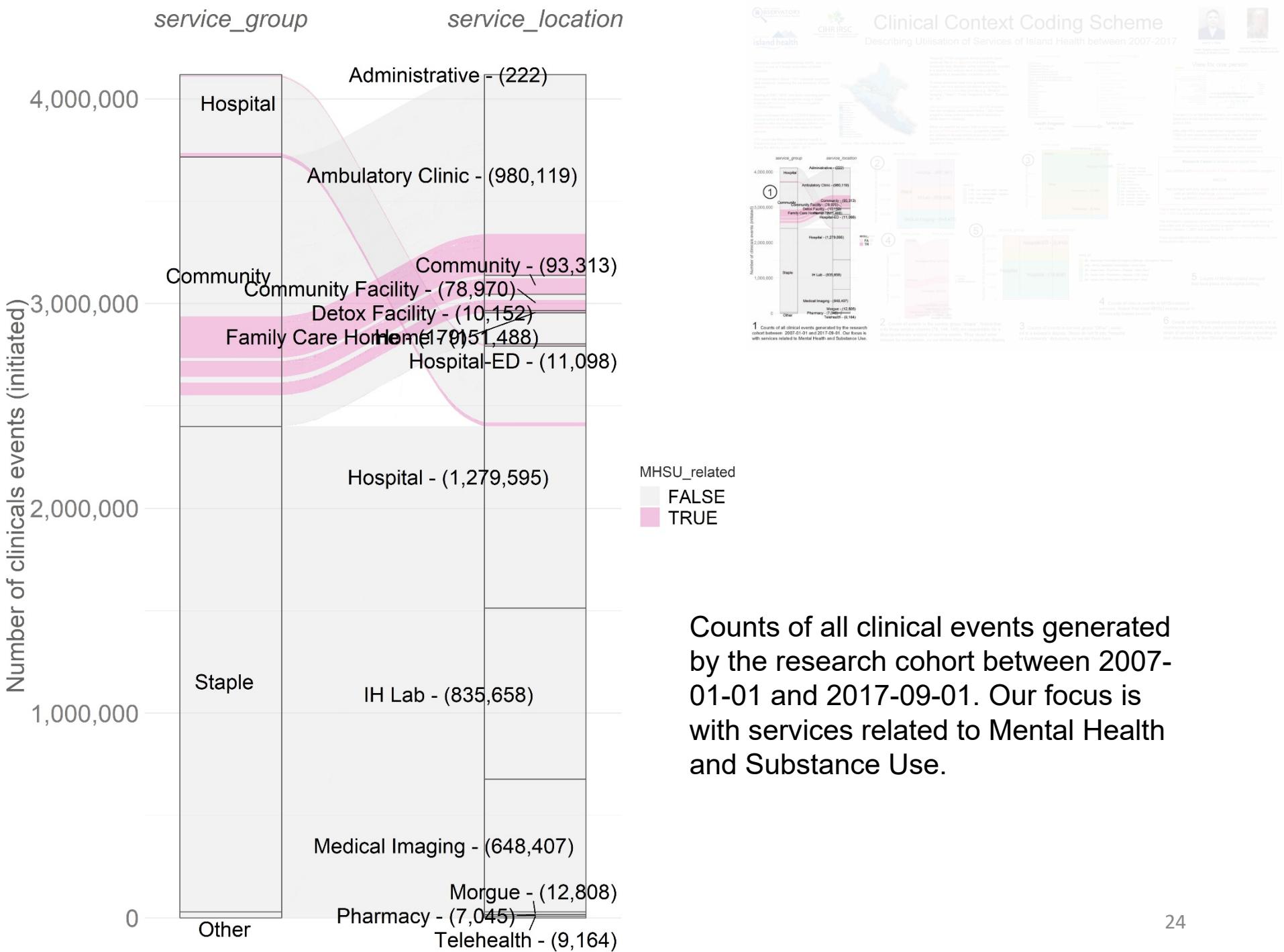
View PDF of the handout at github.com/dss-ialh/displaying-health-data

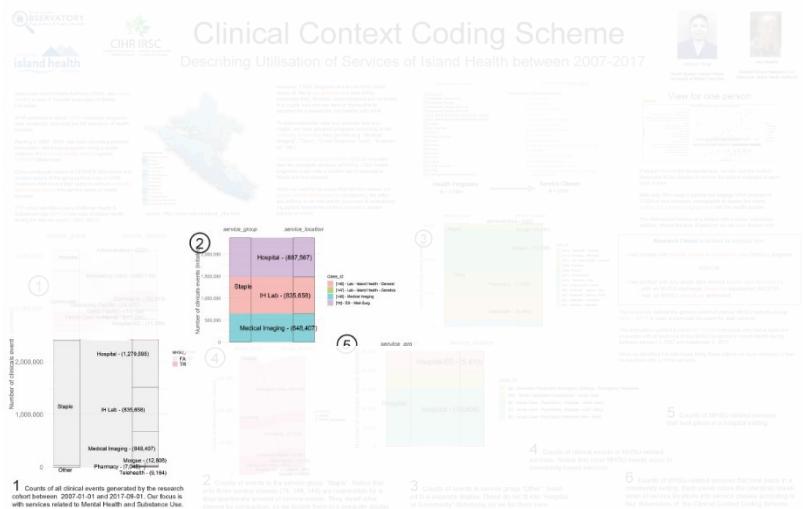
service_group	service_location
Community	Community
	Community Facility
	Detox Facility
	Family Care Home
	Home
Hospital	Hospital
	Hospital-ED
Other	Administrative
	Morgue
	Pharmacy
	Telehealth
Staple	Hospital
	IH Lab
	Medical Imaging



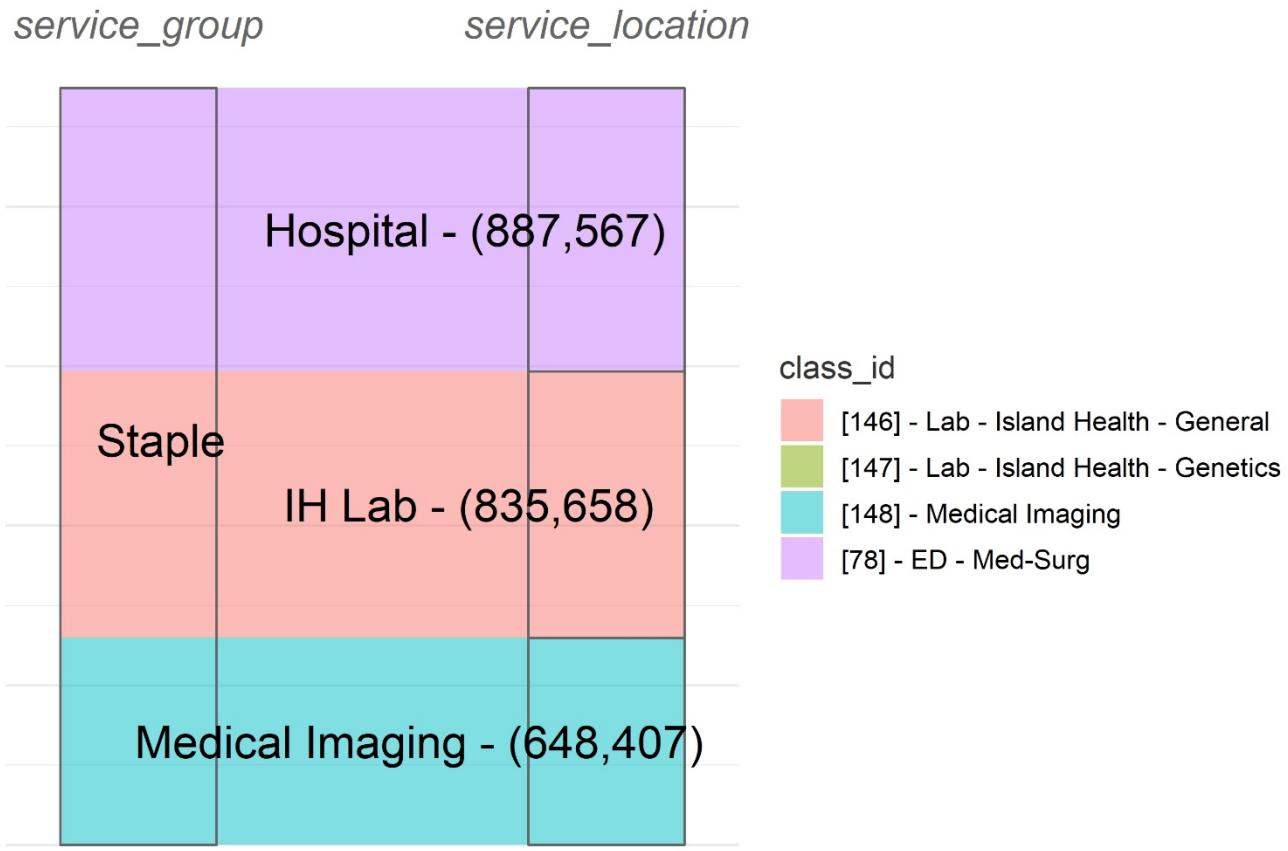
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clinical_focus	MHSU-Addictions
service_type	Detox-MHSU
service_location	Detox Facility
population_age	Adults, some adols, older adults

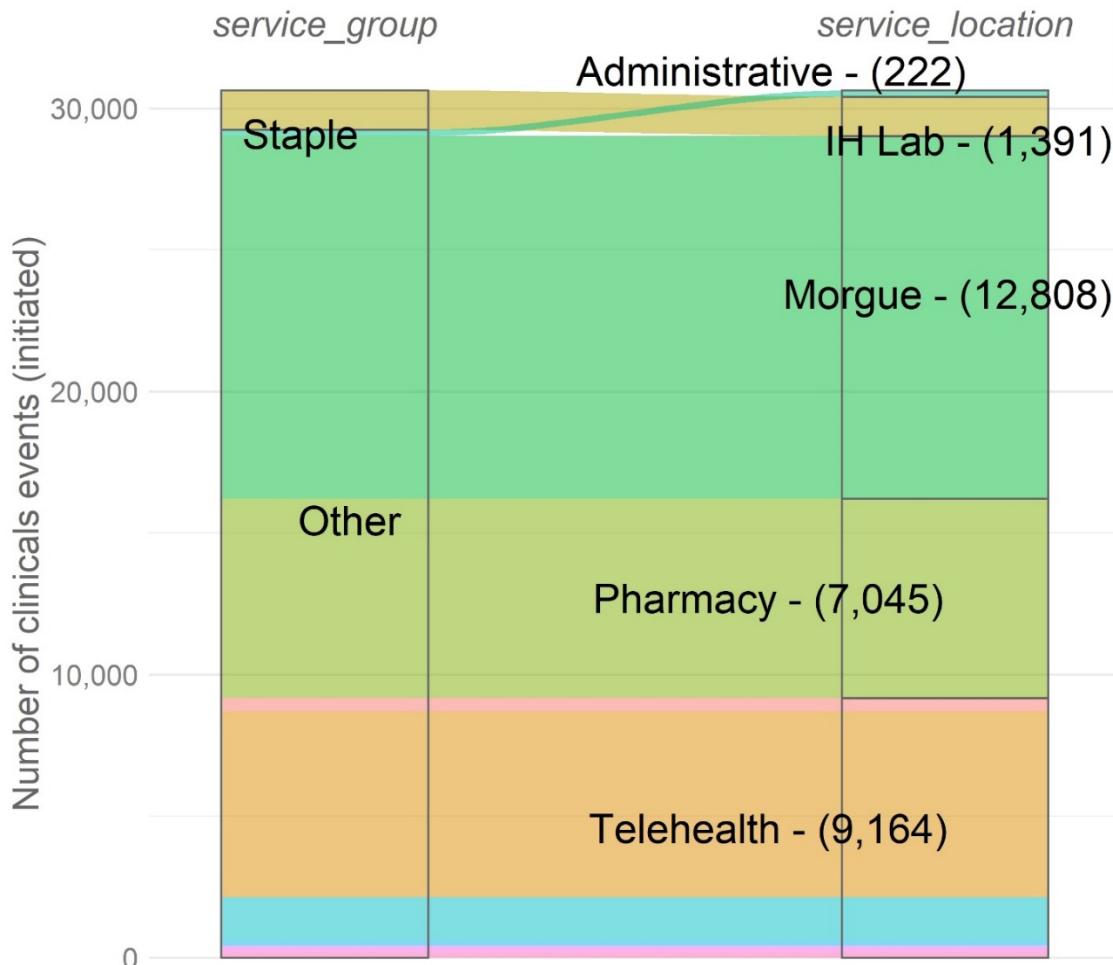
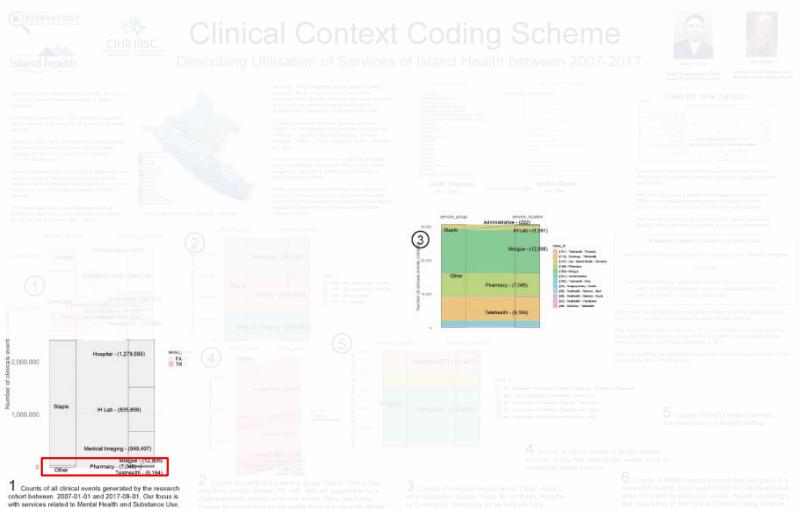




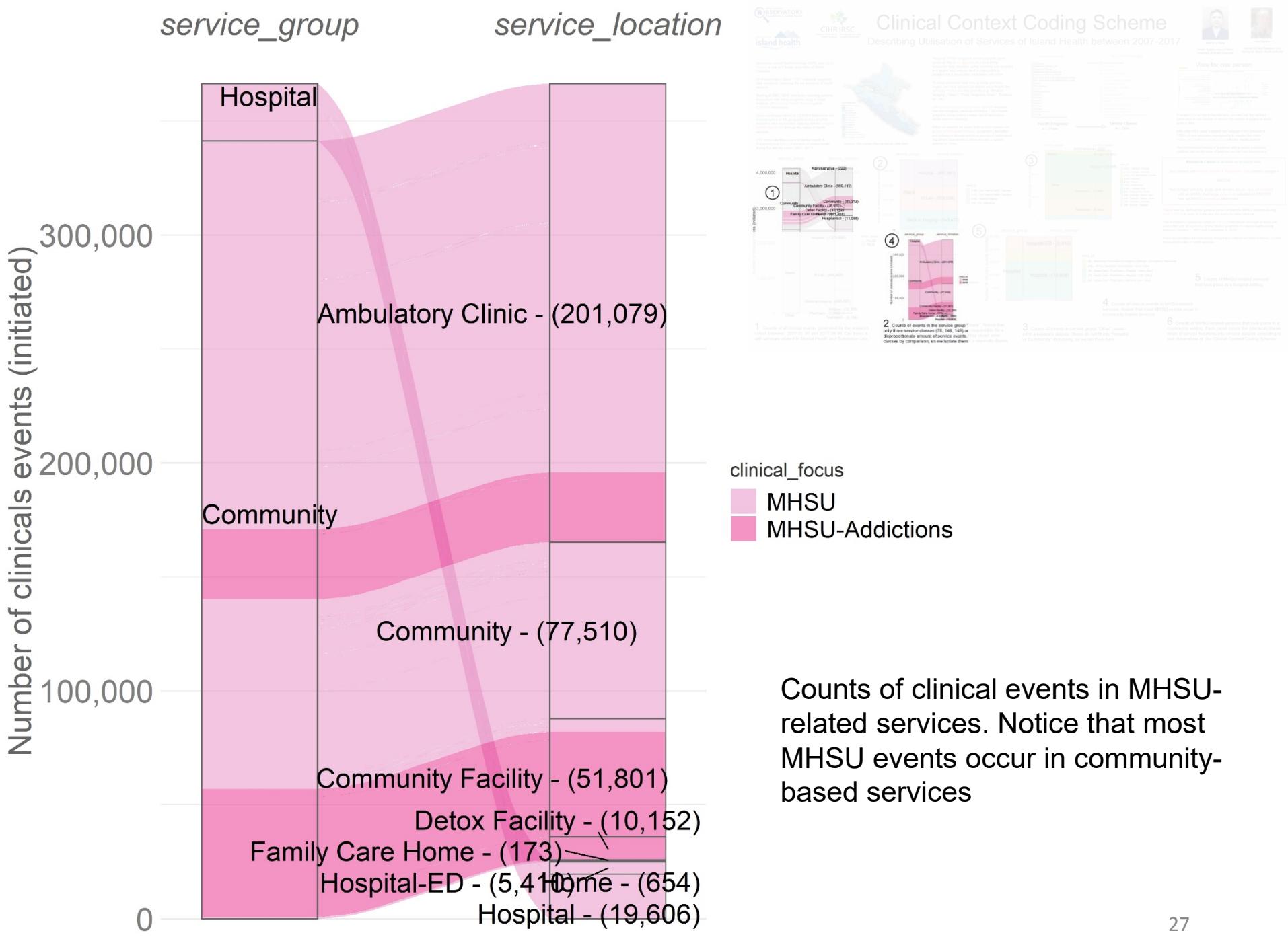
Counts of events in the service group “Staple”. Notice that only three service classes (78, 146, 148) are responsible for a disproportionate amount of service events. They dwarf other classes by comparison, so we isolate them in a separate display



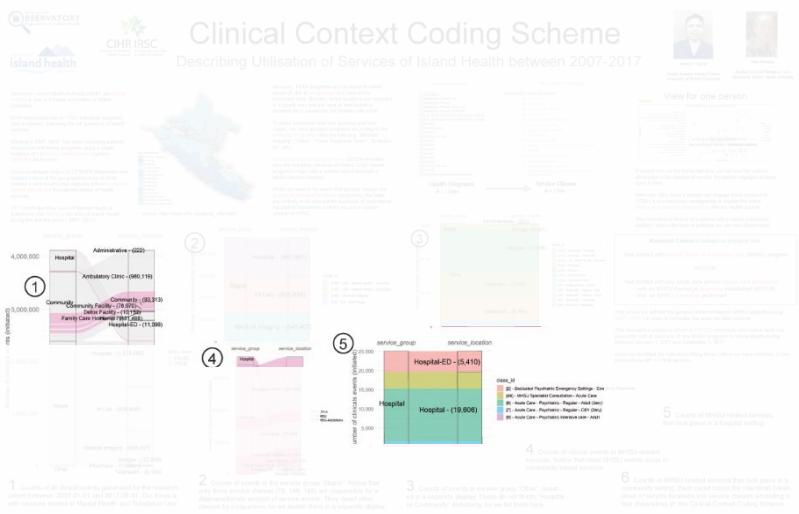
Counts of events in the service group “Other”, have been isolated in a separate display. These do not fit into “Hospital vs Community” dichotomy, so we list them here



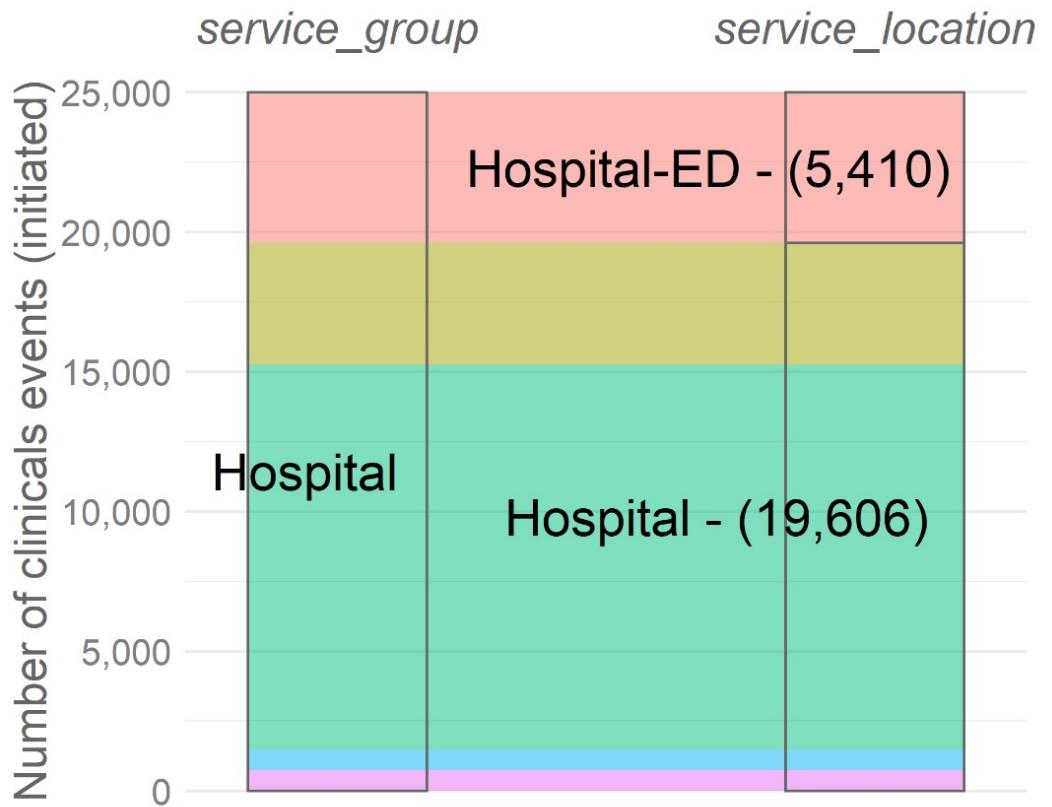
class_id	Description
[101]	- Telehealth - Thoracic
[112]	- Oncology - Telehealth
[147]	- Lab - Island Health - Genetics
[149]	- Pharmacy
[150]	- Morgue
[151]	- Administrative
[152]	- Telehealth - Misc
[33]	- Telepsychiatry - Adults
[58]	- Telehealth - Seniors - Med
[59]	- Telehealth - Seniors - Psych
[63]	- Telehealth - Homecare
[96]	- Genetics - Telehealth



Counts of clinical events in MHSU-related services. Notice that most MHSU events occur in community-based services

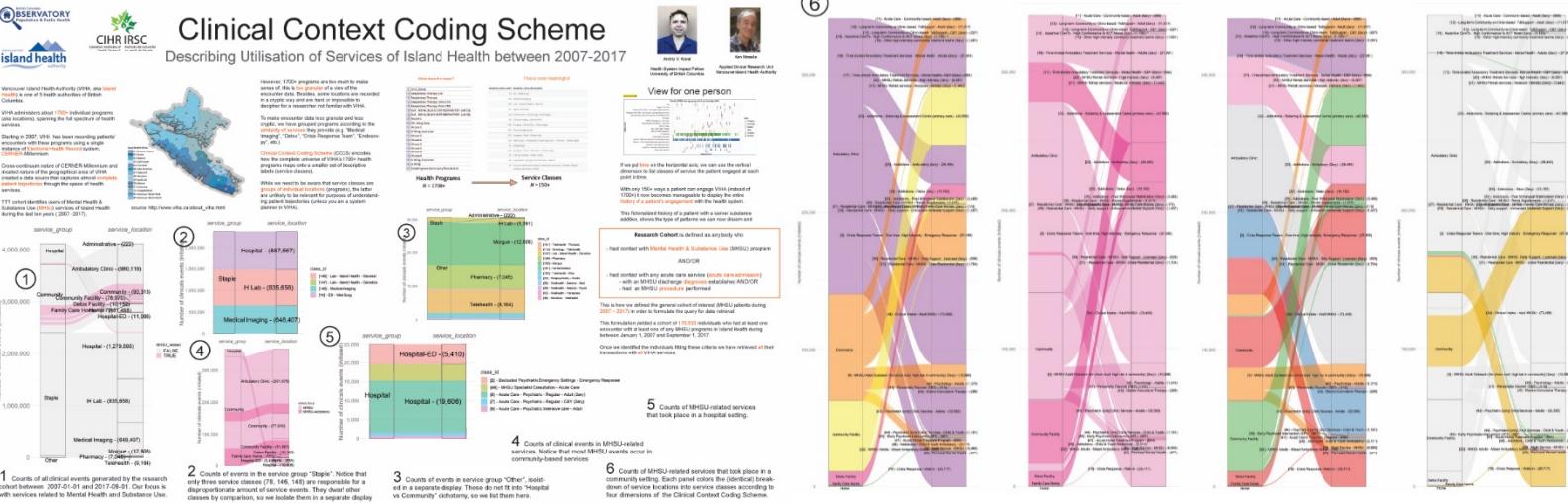


Counts of MHSU-related services that took place in a hospital setting

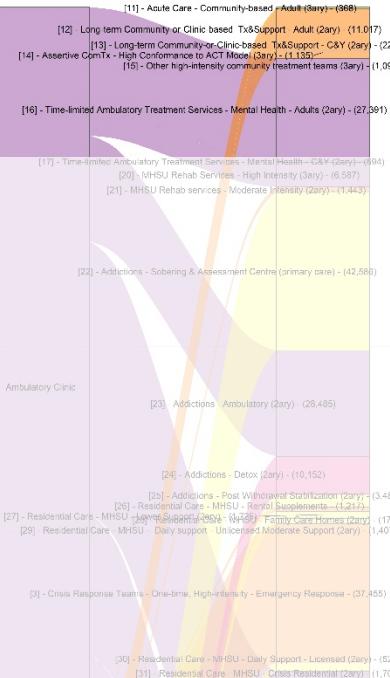


class_id

- [2] - Dedicated Psychiatric Emergency Settings - Eme
- [46] - MHSU Specialist Consultation - Acute Care
- [6] - Acute Care - Psychiatric - Regular - Adult (2ary)
- [7] - Acute Care - Psychiatric - Regular - C&Y (2ary)
- [9] - Acute Care - Psychiatric Intensive care - Adult







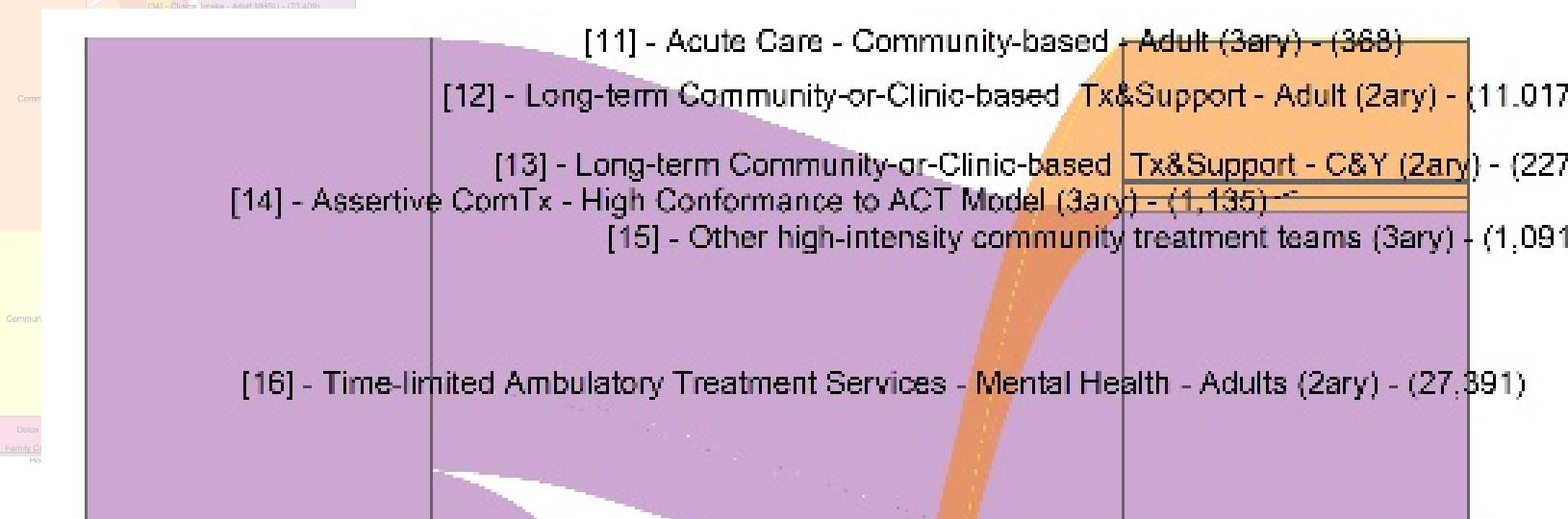
service_location



Counts of MHSU-related services that took place in a community setting. Each panel colors the (identical) breakdown of service locations into service classes according to four dimensions of the Clinical Context Coding Scheme.

Service Location

Class

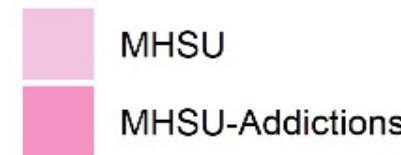




Counts of MHSU-related services that took place in a community setting. Each panel colors the (identical) breakdown of service locations into service classes according to four dimensions of the Clinical Context Coding Scheme.



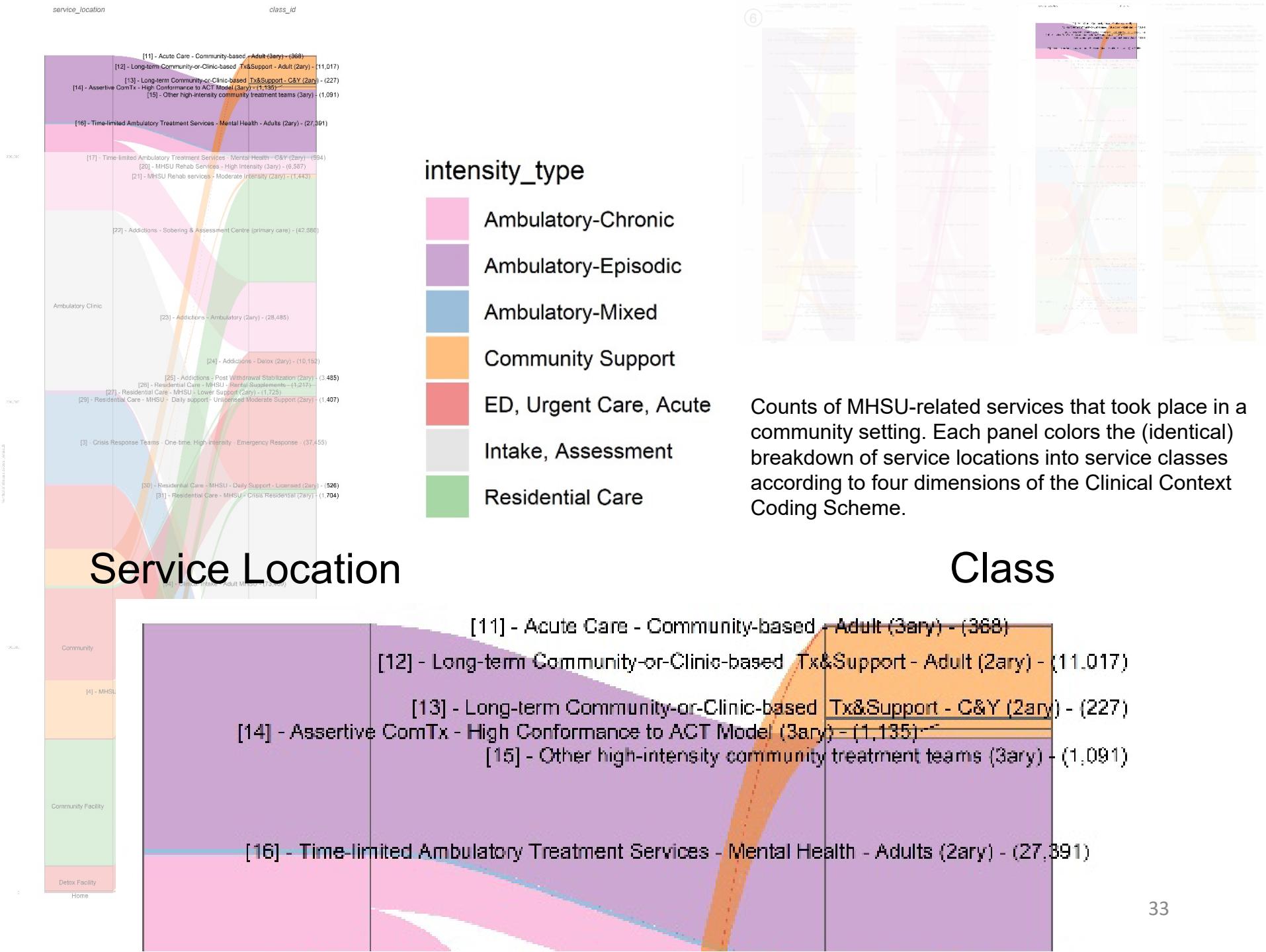
clinical_focus



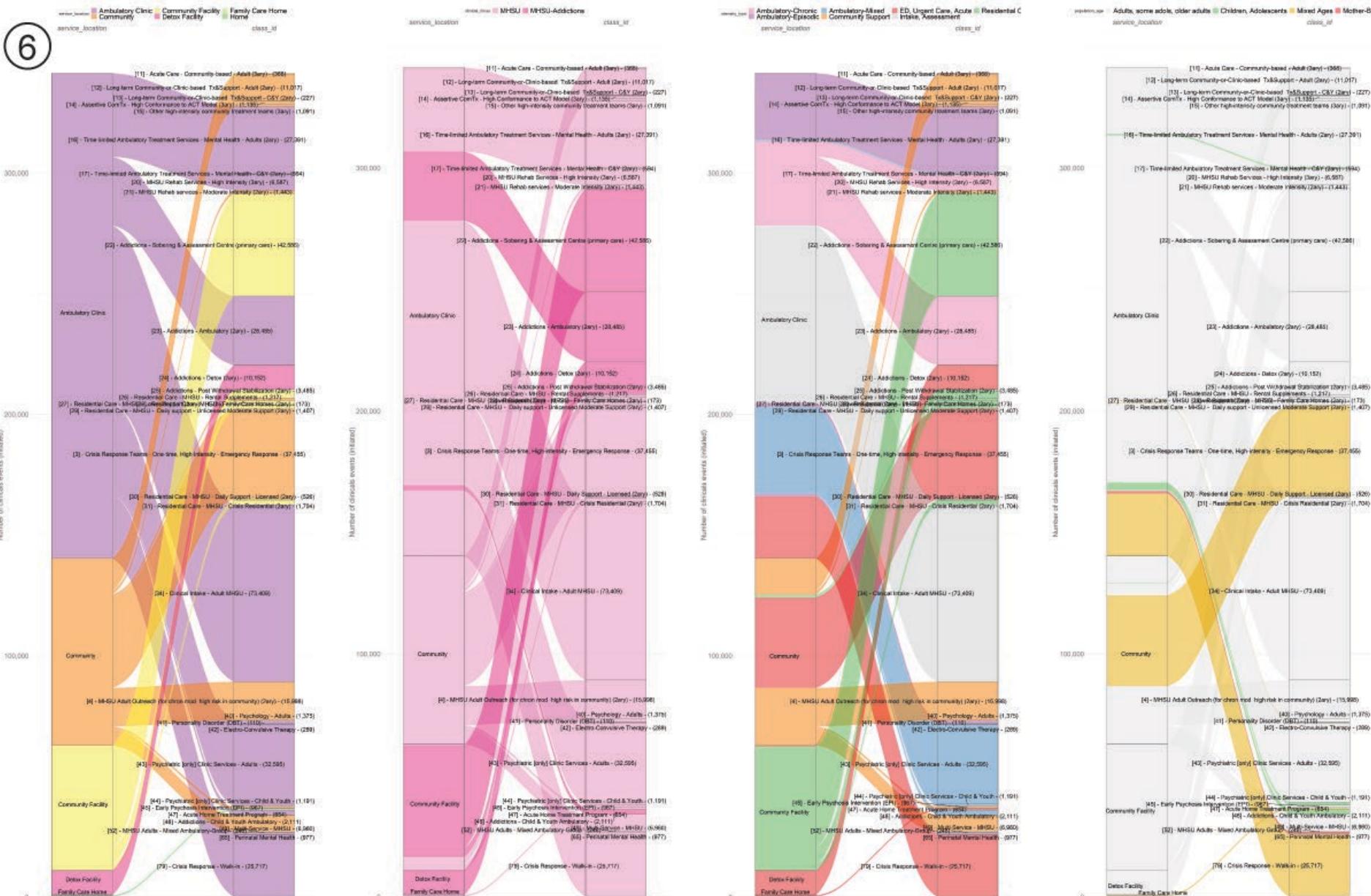
Service Location

Class

- [11] - Acute Care - Community-based - Adult (3ary) - (368)
- [12] - Long-term Community-or-Clinic-based Tx&Support - Adult (2ary) - (11,017)
- [13] - Long-term Community-or-Clinic-based Tx&Support - C&Y (2ary) - (227)
- [14] - Assertive ComTx - High Conformance to ACT Model (3ary) - (1,135)
- [15] - Other high-intensity community treatment teams (3ary) - (1,091)
- [16] - Time-limited Ambulatory Treatment Services - Mental Health - Adults (2ary) - (27,391)



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View PDF of the handout at github.com/dss-ialh/displaying-health-data

In conclusion

- We demonstrated solutions to
 - How to represent a person's journey?
 - CCCS
 - How to represent a cohort experience?
 - Sequence of alluvia plots
- Now what can we do?
 - Similarities of individual trajectories
 - Compare target group to the reference groups

Transactional Data of Island Health

How patients vote with their feet



Andriy
Koval



Ken
Moselle

Please email questions to
aging@uvic.ca



Displaying Health Data

Cases, Techniques, Solutions

Colloquium + Live-Webcast + Recording

Medical Sciences Building (MBS) 160

University of Victoria

November 28 – 30 , 1 – 3 pm PST

Please email questions to
aging@uvic.ca



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