

# Data source choice matters for ascertaining mental illness, substance use disorder, and dual diagnosis prevalence among people in custody.

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#### Acknowledgement of Country



• Iacknowledge the Jagera and the Turrbal people as the Traditional Custodians of the lands on which we are located today. I pay my respects to Jagera and Turrbal Elders past, present. I want to extend that respect to all Aboriginal and Torres Strait Islander people here today, and to those who participated in the current study

#### Aim s/Overvie w



- In a sample of both non-Indigenous and Aboriginal and Torres Strait Islander people in prison, we aimed to:
  - 1. assess the concordance between three sources of data on mental illness, substance use disorder, and dual diagnoses
  - 2. examine the potential for multiple data sources to improve estimates of mental illness, substance use disorder, and dual diagnosis prevalences in prisons
- Data sources:
  - Survey responses
  - Prison medical records
  - Inpatient and emergency department hospital data

#### Why?



- Why people in custody?
  - Disproportionate rates of mental illness and substance use
  - Higher rates of health service use after release
  - Frequently underdiagnosed and undertreated
- Why dualdiagnosis?
  - Different crim in a l and health backgrounds and trajectories
  - Growing cohort
  - Unique health needs
- Why do we want accurate prevalence estimates?
  - Identify health needs
  - Allocate resources
  - Release planning
  - Inform health services in prison and post-release

#### What's currently being done?



- What's currently being done?
  - AIHW "The Health of Australia's Prisoners" reports
  - ABS "National Study of Mental Health and Wellbeing"
  - Academic papers/reports



## The health of people in Australia's prisons

2022

#### Mental health condition

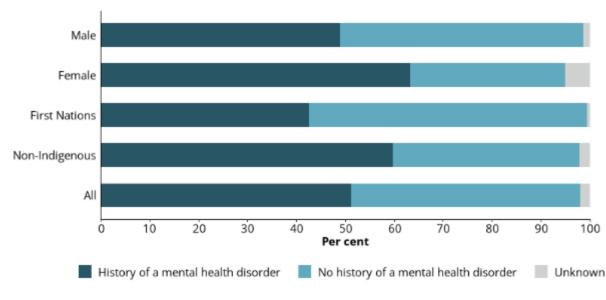
Prison entrants reporting a mental health or behavioural condition

During the data collection period, prison entrants were asked if they:

- had ever been told they had a mental health or behavioural condition (including drug and alcohol abuse) by a doctor, psychiatrist, psychologist or nurse
- were currently taking medication for a mental health condition, including those relating to alcohol and other drug use.



Figure 5.1: Prison entrants who had ever been told they had a mental health condition, by sex and Indigenous identity, 2022



#### Notes

- Proportions are representative of this data collection only, and not the entire prison population.
- Excludes Victoria, which did not provide data for this item.

Source: Entrants form, 2022 NPHDC.

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- What's currently being done?
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  - ABS "National Study of Mental Health and Wellbeing"
  - Academic papers/reports



On this page

Crisis support services

and physical conditions

Use of services

Self-harm

Endnotes

state and territory

Mental health resources

Prevalence of mental disorders

Comorbidity of mental disorders

Mental health-related medications

Prevalence of mental disorders by

Lived experience of suicide

Key statistics

**Statistics** 

Census

Participating in a survey

**About** 





Home > Statistics > Health > Mental health > National Study of Mental Health and Wellbeing > 2020-2022





Table 4 Persons 16-85 years, 12-month mental disorder(a) groups by selected household and population characteristics: Proportion

#### National Study of Mental Health and Wellbeing

Australian Bureau of Statistics

Summary statistics on key mental health issues including national and state and territory estimates of prevalence of mental disorders

Reference period 2020-2022

Latest release

Released 5/10/2023

Australian Bureau of Statistics

#### **Key statistics**

National Study of Mental Health and Wellbeing: Summary Results, 2020-2022

- 12 9% of poople 2god 16 0E
- 38.8% of people as

•	42.9% of people aged 16-85
•	21.5% of people had a 12-mo
	people aged 16–85 years)

0	
ad a 12-m	
5 years)	Marri
s years,	Sepa
ged 16-24	Neve
_	



Has not ever been incarcerated

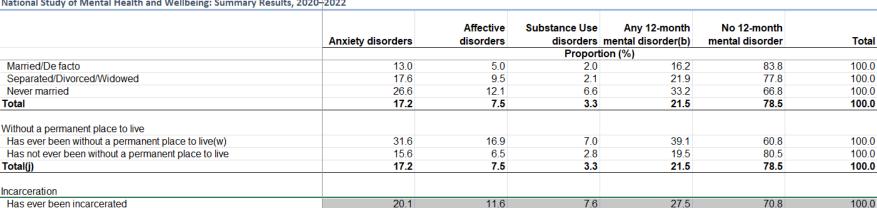
Australian Defence Force service

Has ever served(x)

Has never served

Total(j)

Total



7.5

7.5

7.7

7.5

7.5

3.2

3.3

2.4

3.3

3.3

21.3

21.5

17.4

21.6

21.5

78.7

78.5

82.0

78.4

78.5

100.0

100.0

100.0

100.0

100.0

17.1

17.2

13.6

17.3

17.2



#### What's currently being done?



- What's currently being done?
  - AIHW "The Health of Australia's Prisoners" reports
  - ABS "National Study of Mental Health and Wellbeing"
  - Academic papers/reports
    - Butler et a l. (2006; 2011) (dia gnostic interviews)
    - Browne et al. (2023) (self-reports)
    - Stewart et al. (2020) (administrative data)





Data source	Limitations	Advantages
Surveys (self-report/diagnostic interviews)	<ul> <li>Cost</li> <li>Population coverage infeasible</li> <li>Lay interviewers may over-estimate true prevalence</li> <li>Possible inaccuracies due to: <ul> <li>Desirability bias</li> <li>Cultural factors</li> <li>Deliberate concealment/minimisation</li> <li>Memory</li> </ul> </li> </ul>	<ul> <li>Questions can cover lifetime diagnoses</li> <li>No restrictions on geographic location, timing, and source of diagnosis</li> </ul>
In-prison medical records	<ul> <li>Limited to periods of incarceration</li> <li>Not often amenable to efficient data extraction</li> </ul>	Diagnosed by health/medical professionals
Administrative data	<ul> <li>Limited to departments/organisations that collect and share information</li> <li>Restricted to what data organisations routinely collect</li> <li>Restricted to the timeframe of collection</li> </ul>	<ul> <li>Routinely collected</li> <li>Data extraction relatively quick</li> <li>Whole populations</li> </ul>

#### Current study



- Health After Release from Prison (HARP)
  - Face-to-face interviews with people within 6 weeks of release from Qld and WAprisons
  - >2,700 partic ip ants
  - Survey data linked with prison medical records and corrections and health administrative datasets
- Sample period
  - Queensland: August 2008 July 2010
  - Western Australia: May 2013 August 2016

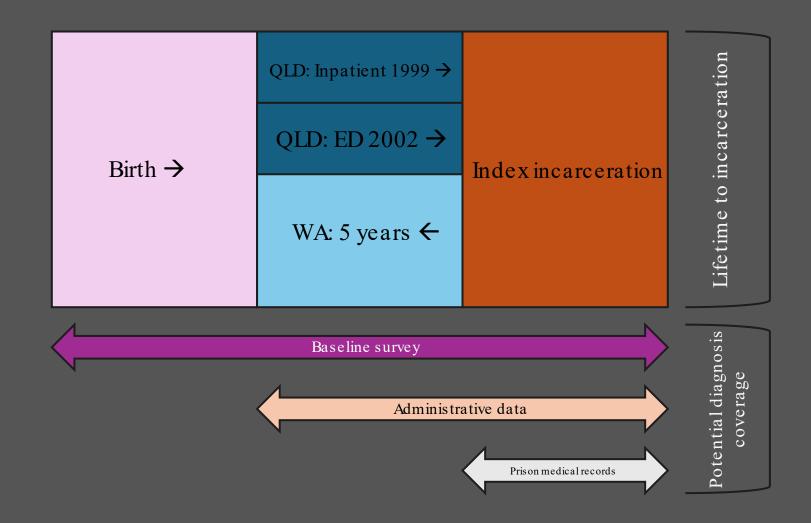
#### Dia gnoses



- Constructed exclusive measures of mental illness only, substance use disorder only, or dual diagnosis using:
  - Baseline survey:
    - "Have you ever been told by a doctor, psychologist or psychia trist that you have a mental illness?"
    - "If yes, what type/s of mental illness have you ever been diagnosed with?"
  - Prison medical records:
    - ICPC-2 codes
  - Inpatient/emergency department:
    - ICD-10-AM codes

#### Data source coverage





### Sample



Baseline characteristics of the coh	Baseline characteristics of the cohort.											
	n	%										
Non-Indigenous (n=1667)												
Male	1392	83.50										
State												
QLD	979	58.73										
WA	688	41.27										
	Mean	SD										
Age	32.19	10.94										
	n	%										
Aboriginal and Torres Strait Islander												
(n=978)												
Male	732	74.85										
State												
QLD	336	34.36										
WA	642	65.64										
	Mean	SD										
Age	29.12	7.93										

#### Analyse s



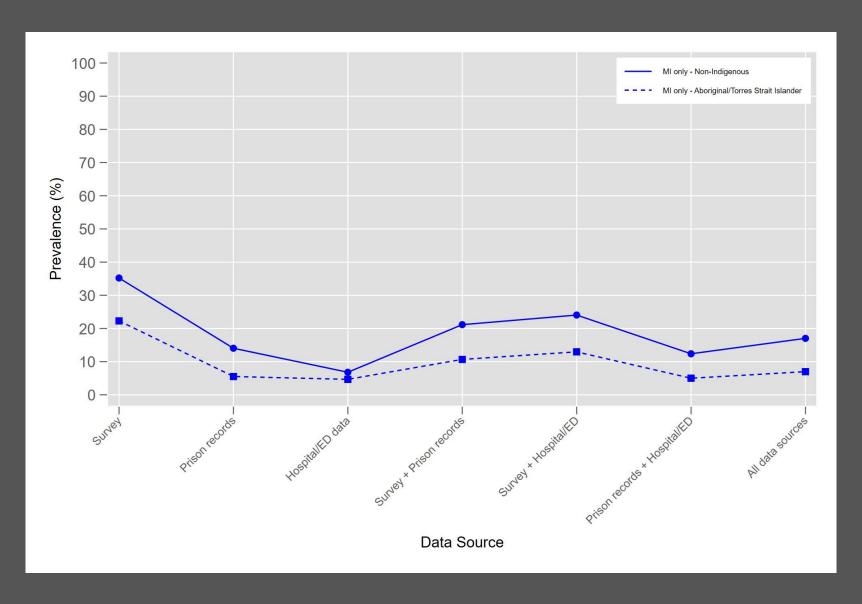
- Prevalence estimates
  - Proportion of sample with diagnosis
    - Complex survey data stratified by state, clustered by prison
    - Sample weighted based national prisoner population statistics
    - Bias-corrected bootstrapped estimates
- Data source concordance/agreement
  - Overlap of data sources
  - Inter-rater reliability coefficients
- All analyses run separately for Aboriginal and Torres Strait Islander participants and non-Indigenous participants

#### Results



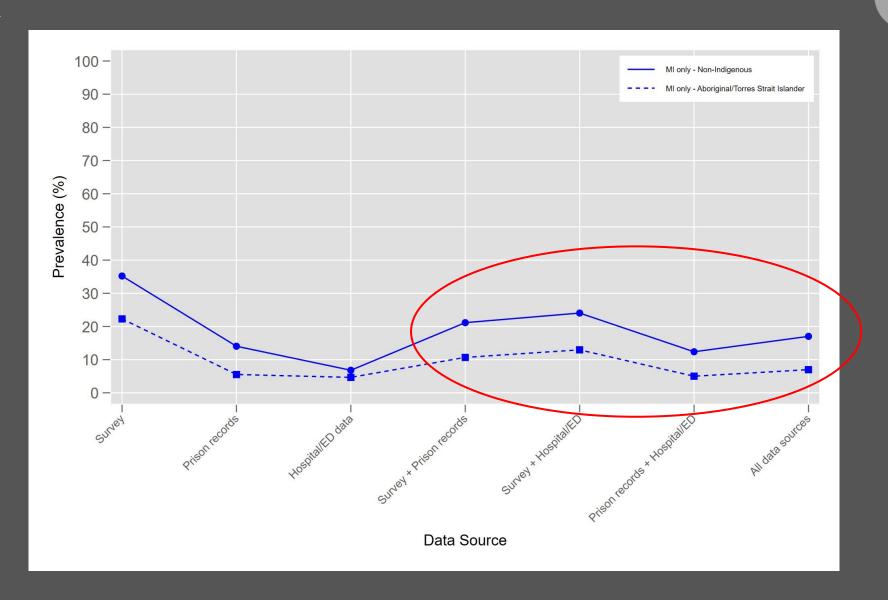
Prevalence estimates – Mentalillness

only



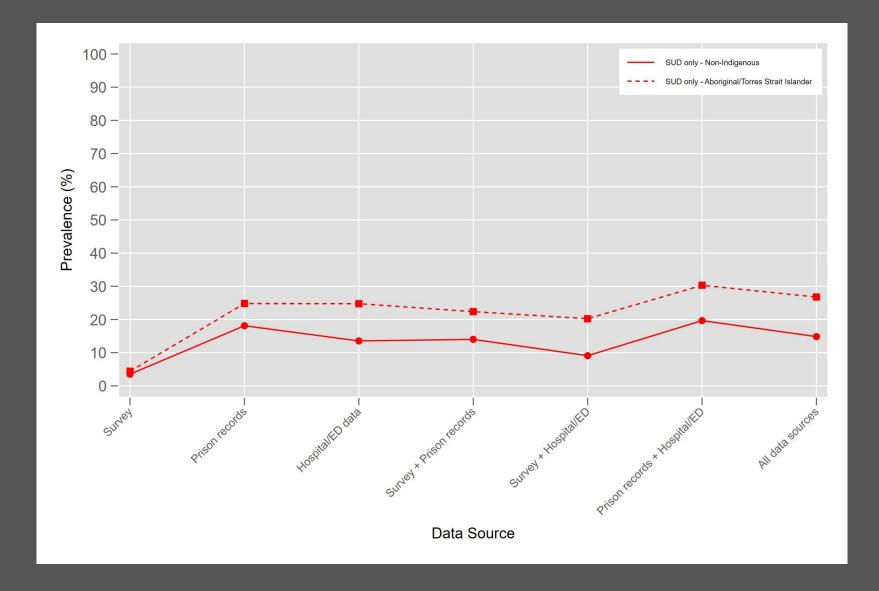
Prevalence estimates – Mentalillness

only



Prevalence estimates – Substance use disorder

only



### Prevalence estimates – Dual diagnosis

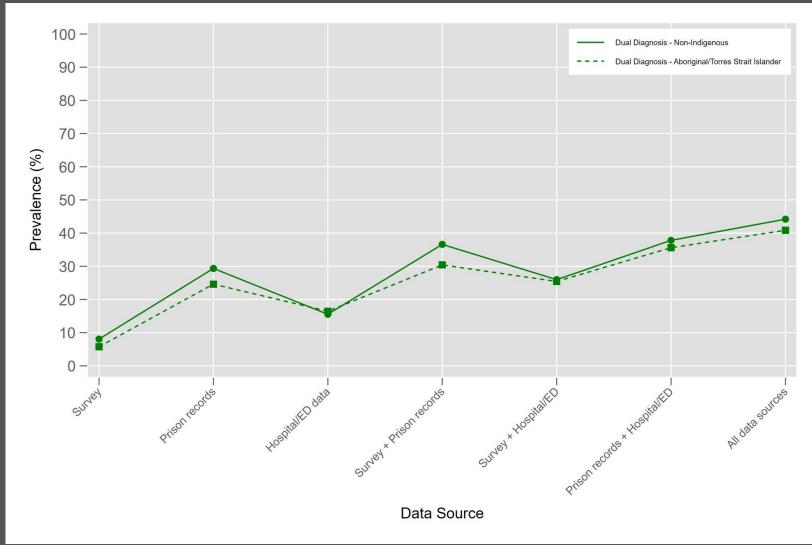




Table 2. Prevalence of mental illness, substance use disorder, and dual diagnosis using multiple data sources for Aboriginal and Torres Strait Islander and Non-Indigenous samples

		Survey			Prison medical reco	ords		Hospital/ED	All	All data sources		
		%			%			%			%	
	n	[95% CI]	z-value (p)	n	[95% CI]	z-value (p)	n	[95% CI]	z-value (p)	n	[95% CI]	
Non-Indigenous												
		53.2	6.1		38.5	3.1		64.1	11.3		23.9	
No diagnosis	894	[46.2, 57.0]	(<.0001)	655	[22.8, 53.7]	(.002)	1054	[59.9, 71.0]	(<.0001)	399	[15.7, 32.4]	
		35.2	5.9		14.0	-1.4		6.8	-2.8		17.0	
Mental illness only	580	[31.5, 43.3]	(<.0001)	231	[11.3, 20.3]	(.158)	119	[5.6, 8.5]	(.005)	287	[12.0, 24.5]	
Substance use		3.5	-6.2		18.1	2.4		13.5	-1.0		14.8	
disorder only	63	[1.5, 4.6]	(<.0001)	292	[12.1, 22.9]	(.018)	233	[9.2, 15.4]	(.336)	259	[9.6, 18.1]	
		8.1	-6.8		29.4	-6.9		15.5	-6.0		44.2	
Dual diagnosis	130	[5.4, 9.8]	(<.0001)	489	[17.8, 41.6]	(<.0001)	261	[12.4, 18.0]	(<.0001)	722	[33.2, 54.7	
Aboriginal and Tor	res Strai	t Islander										
		67.6	6.8		45.0	3.4		54.1	6.4		25.4	
No diagnosis	638	[60.1, 74.7]	(<.0001)	307	[27.6, 66.2]	(.001)	480	[45.2, 63.2]	(<.0001)	166	[15.9, 36.8]	
		22.3	6.1		5.5	-0.8		4.7	-1.4		7.0	
Mental illness only	244	[16.7, 31.5]	(<.0001)	83	[2.8, 9.9]	(.444)	55	[2.4, 7.9]	(.164)	66	[4.3, 11.5]	
Substance use		4.4	-5.2		24.8	-0.3		24.8	-0.7		26.8	
disorder only	39	[2.00, 6.81]	(<.0001)	295	[14.8, 34.2]	(.733)	234	[20.4, 31.1]	(.461)	281	[18.9, 33.5]	
		5.8	-8.0		24.6	-6.9		16.5	-9.60		40.9	
Dual diagnos is	57	[3.0, 8.2]	(<.0001)	293	[14.6, 31.9]	(<.0001)	209	[10.4, 21.9]	(<.0001)	465	[30.2, 48.2]	

Note. Survey = Self-report of ever being diagnosed by a medical professional. Hospital/ED = Statewide hospital and emergency department linked administrative data. % = Bootstrapped prevalence estimates (10,000 repetitions) of subsample diagnosed using each data source and sample weighted by Australian prisoner population statistics, represented by percentage. CI = Bootstrapped bias-corrected confidence intervals. z-value = Z test comparing prevalence estimate from individual data source to prevalence estimate obtained using all data sources combined.

Non-Indigenous n = 1,667. Aboriginal and Torres Strait Islander n = 978.



l data sources
%
[95% CI]
23.9
[15.7, 32.4]
17.0
14.8
[9.6, 18.1]
44.2
25.4
7.0
[4.3, 11.5]
26.8
40.9
[30.2, 48.2]
999 87 59 22 66 81

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293



[30.2, 48.2]

Table 2. Prevalenc Indigenous sampl		tal illness, subst	ance use disor	der, and d	ual diagnosis usin	g multiple dat	a sources f	or Aboriginal and	Torres Strait Isl	lander and	Non-
	Survey			F	Prison medical reco	ords			All data sources		
					%						%
	n	[95% CI]	z-value (p)	n	[95% CI]	z-value (p)	n	[95% CI]	z-value (p)	n	[95% CI]
Non-Indigenous											
					38.5	3.1					23.
No diagnosis				655	[22.8, 53.7]	(.002)				399	[15.7, 32.4
					14.0	-1.4					17.
Mental illness only				231	[11.3, 20.3]	(.158)				287	[12.0, 24.5
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No diagnosis				307	[27.6, 66.2]	(.001)				166	[15.9, 36.8
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(<.0001)

[14.6, 31.9]

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Dual diagnosis



Indigenous sampl								Hospital/ED		All data sources		
							n	% [95% CI]	z-value (p)	n	% [95% CI]	
Non-Indigenous									* /			
								64.1	11.3		23	
No diagnosis							1054	[59.9, 71.0]	(<.0001)	399	[15.7, 32.	
								<mark>6.8</mark>	-2.8		17	
Mental illness only							119	[5.6, 8.5]		287	[12.0, 24	
Substance use								13.5			14	
disorder only							233	[9.2, 15.4]	` '	259	[9.6, 18.	
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ino diagnosis							400	43.2, 03.2	-1.4	100	[13.9, 30.	
Mental illness only							55	[2.4, 7.9]		66	[4.3, 11.	
Substance use							5.5	24.8			26	
disorder only							234	[20.4, 31.1]		281	[18.9, 33]	
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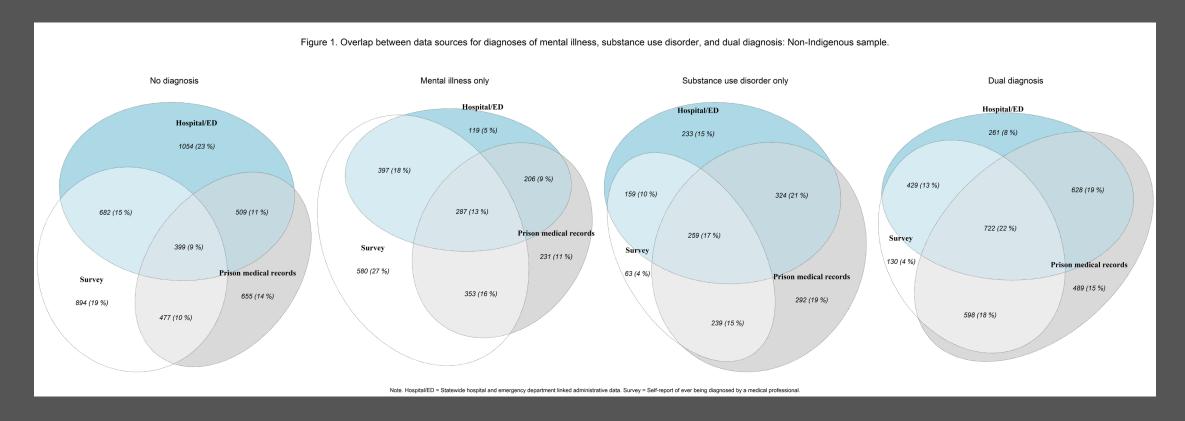
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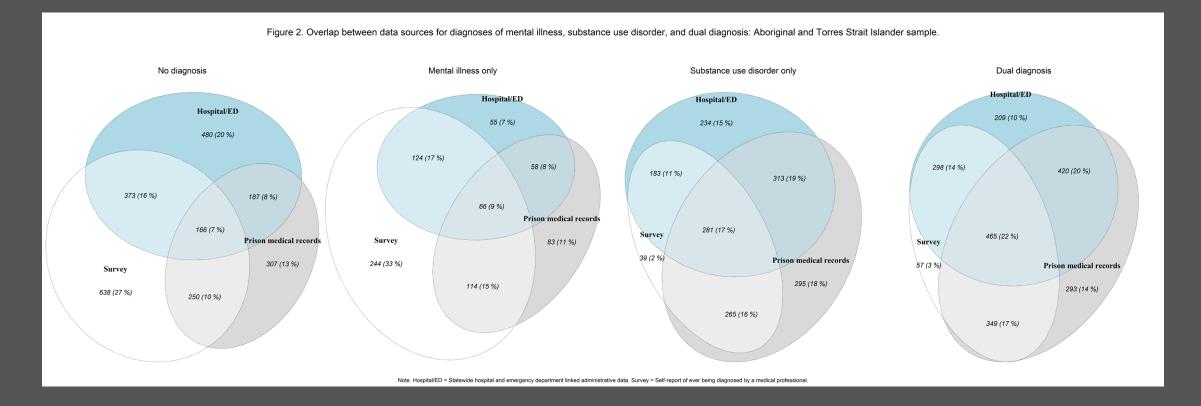




Table 3. Agreement between survey, prison medical records, and combined hospital and emergency department sources for mental illness, substance use disorder, and dual diagnoses with Aboriginal and Torres Strait Islander and Non-Indigenous samples

miness, substance use disorder, and duar diagnoses with resortand fortes strait islander and from indigenous samples													
	Percent ag	greeme	ent	Cohen'	s kappa		PABAK						
	Coefficient	SE	p	Coefficient	SE	p	Coefficient	SE	p				
Non-Indigenous													
No diagnosis	.63	0.01	<.0001	.27	0.02	<.0001	.2	5 0.02	<.0001				
Mental illness only	.72	0.01	<.0001	.13	0.01	<.0001	.4	5 0.02	<.0001				
Substance use disorder only	.80	0.01	<.0001	.06	0.01	<.0001	.6	0.01	<.0001				
Dual diagnos is	.76	0.01	<.0001	.19	0.02	<.0001	.5	2 0.02	<.0001				
Aboriginal and Torres Strait Islander													
No diagnosis	.58	0.01	<.0001	.19	0.02	<.0001	.1	6 0.02	<.0001				
Mental illness only	.80	0.01	<.0001	.14	0.02	<.0001	.6	0.02	<.0001				
Substance use disorder only	.69	0.01	<.0001	.03	0.02	.0538	.3	7 0.02	<.0001				
Dual diagnos is	.73	0.01	<.0001	.16	0.02	<.0001	.4	6 0.02	<.0001				
Note. PABAK = Prevalence and bias-adju	isted kappa. Nor	n-Indige	enous $n = 1$	,667. Aboriginal a	nd Torre	s Strait Isla	nder n = 978						



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	Percent ag	greeme	nt		Cohen's			PABAK					
	Coefficient	SE	p	Co	efficient	SE	р	Coefficier	nt	SE	p		
Non-Indigenous								<u> </u>					
No diagnos is	.63	0.01	<.0001		.27	0.02	<.0001		.25	0.02	<.0001		
Mental illness only	.72	0.01	<.0001		.13	0.01	<.0001		.45	0.02	<.0001		
Substance use disorder only	.80	0.01	<.0001		.06	0.01	<.0001		.60	0.01	<.0001		
Dual diagnos is	.76	0.01	<.0001		.19	0.02	<.0001		.52	0.02	<.0001		
Aboriginal and Torres Strait Islander													
No diagnos is	.58	0.01	<.0001		.19	0.02	<.0001		.16	0.02	<.0001		
Mental illness only	.80	0.01	<.0001	\	.14	0.02	<.0001		.60	0.02	<.0001		
Substance use disorder only	.69	0.01	<.0001		.03	0.02	.0538	/	.37	0.02	<.0001		
Dual diagnos is	.73	0.01	<.0001		.16	0.02	<.0001		.46	0.02	<.0001		
Note. PABAK = Prevalence and bias-adju	ısted kappa. Nor	-Indige	enous n=	= 1,6 <mark>67</mark> . <i>I</i>	Aboriginal ai	nd Torre	s Strait Isl	ander n = 978					



Table 3. Agreement between survey, prison medical records, and combined hospital and emergency department sources for mental illness, substance use disorder, and dual diagnoses with Aboriginal and Torres Strait Islander and Non-Indigenous samples

	Percent agreement			Cohen's kappa			PABAK		
	Coefficient	SE	p	Coefficient	SE	p	Coefficient	SE	p
Non-Indigenous									
No diagnos is	.63	0.01	<.0001	.27	0.02	<.0001	.25	0.02	<.0001
Mental illness only	.72	0.01	<.0001	.13	0.01	<.0001	.45	0.02	<.0001
Substance use disorder only	.80	0.01	<.0001	.06	0.01	<.0001	.60	0.01	<.0001
Dual diagnos is	.76	0.01	<.0001	.19	0.02	<.0001	.52	0.02	<.0001
Aboriginal and Torres Strait Islander									
No diagnos is	.58	0.01	<.0001	.19	0.02	<.0001	.16	0.02	<.0001
Mental illness only	.80	0.01	<.0001	.14	0.02	<.0001	.60	0.02	<.0001
Substance use disorder only	.69	0.01	<.0001	.03	0.02	.0538	.37	0.02	<.0001
Dual diagnos is	.73	0.01	<.0001	.16	0.02	<.0001	.46	0.02	<.0001
Note. PABAK = Prevalence and bias-adjusted kappa. Non-Indigenous $n = 1,667$ . Aboriginal and Torres Strait Islander $n = 978$									

Coefficient	Agreement interpretation				
< 0.00	Poor				
0.0020	Slight				
.2140	Fair				
.4160	Moderate				
.6180	Substantial				
.81 - 1.00	Almost perfect				

#### Sum mary of results



- Prevalence estimates vary greatly depending on data source
- When compared to self-reports, using all data sources:
  - Substantially increases substance use disorder diagnosis-only, and dual diagnosis prevalences
  - Substantially decreases no diagnoses and mental illness-only diagnosis prevalences
- Moderate agreement between data sources for most diagnoses
- Patterns of results are generally consistent across non-Indigenous and Aboriginal and Torres Strait Islander samples

#### Im p lic a tions



- Relying on any one source of data may lead to inaccurate prevalence estimates
- Current estimates using self-reports may be significantly underestimating true lifetime prevalence of SUD-only and dual diagnoses
- Implications for in-prison, transitional, and community health service resources

#### Lim ita tions



- Those with severe mental illnesses excluded
- Lim ited to two states
- Inpatient and emergency department data represents a cute/severe presentations
- No data from other community health services
- Western conceptualisations of MI, SUD and DD may not be as relevant/meaningful for Aboriginal and Torres Strait Islander cohorts

#### Sum mary of results



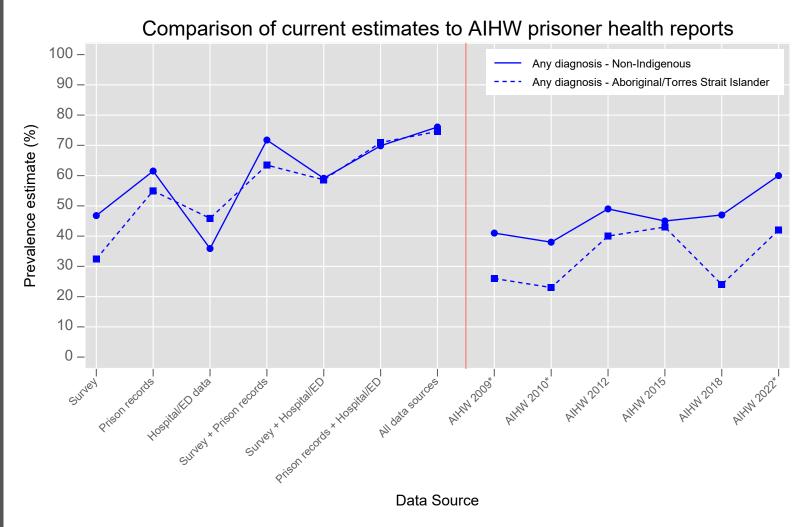
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Contact

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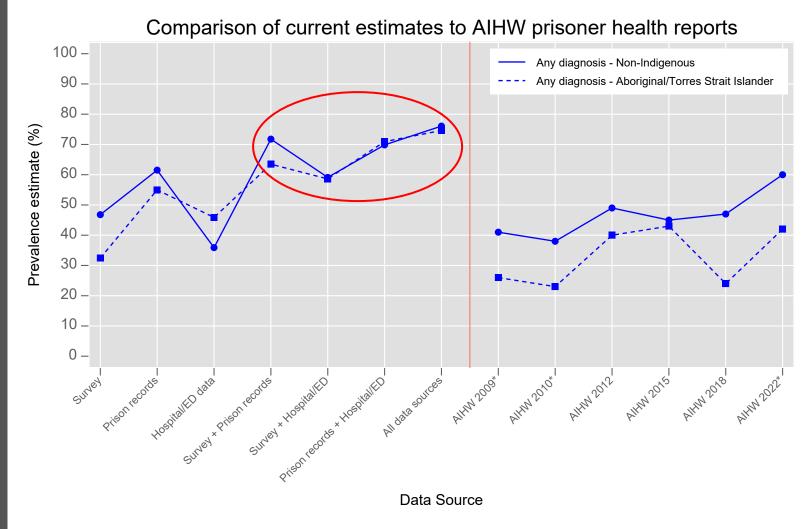
#### Im p lic a tions





#### Im plications





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