Estimating the Impact of Prescribing Limits on Prolonged Opioid Use Following Surgery

Jessica C. Young, MSPH, PhD ICPE All Access 2020



Disclosures

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- Co-authors:
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 - MJF receives consulting fees via UNC from GlaxoSmithKline.





Opioids for Surgical Pain

Opioids play an important role in management of postsurgical pain





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Clinical challenge of striking the balance between safe and adequate pain management





Older Adults: An Understudied Population

- Increasing number of surgeries in older adults
- High prevalence of comorbidity, polypharmacy, cognitive impairment, physiologic changes
- More likely to receive higher dosages than recommended
- Minimal research conducted in vulnerable older population

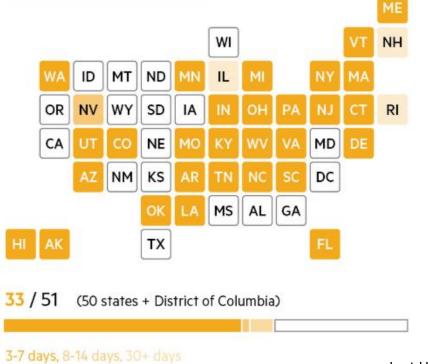




Day Supply Prescribing Limits



Day supply limits to written prescriptions for opioids and/or schedule II drugs unrelated to extenuating circumstances



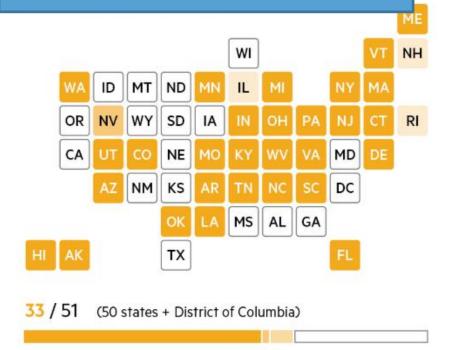


Last Updated: April 2019

https://www.athenahealth.com/insight/infographic-opioid-regulations-state-by-state

Day Supply Prescribing Limits

- Policies vary state by state
- Little evidence informing limits





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Objectives

Among a broad cohort of opioid-naïve surgical patients in the US, estimate the:

1) Risk of prolonged opioid use associated with initial number of days supplied

2) Impact of hypothetical prescribing limits on prolonged opioid use







Data Source: Medicare Claims, 2007-2016, 20% Sample





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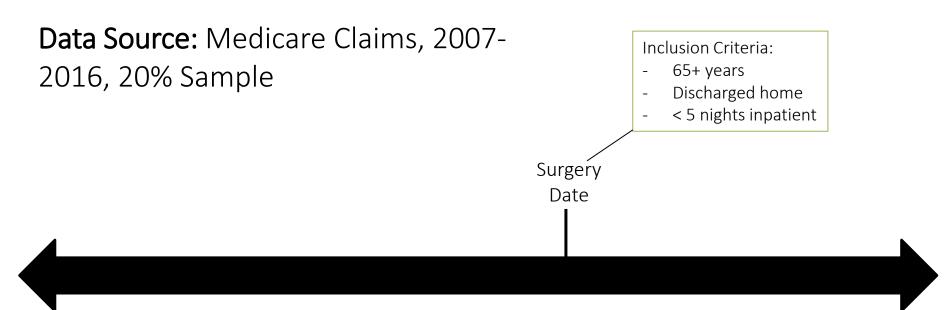
Study Population: Invasive Surgery (Agency for Healthcare Research and Quality)

Surgery Date

- Identified using Current Procedural Terminology (CPT) codes
- Required CPT for General Anesthesia



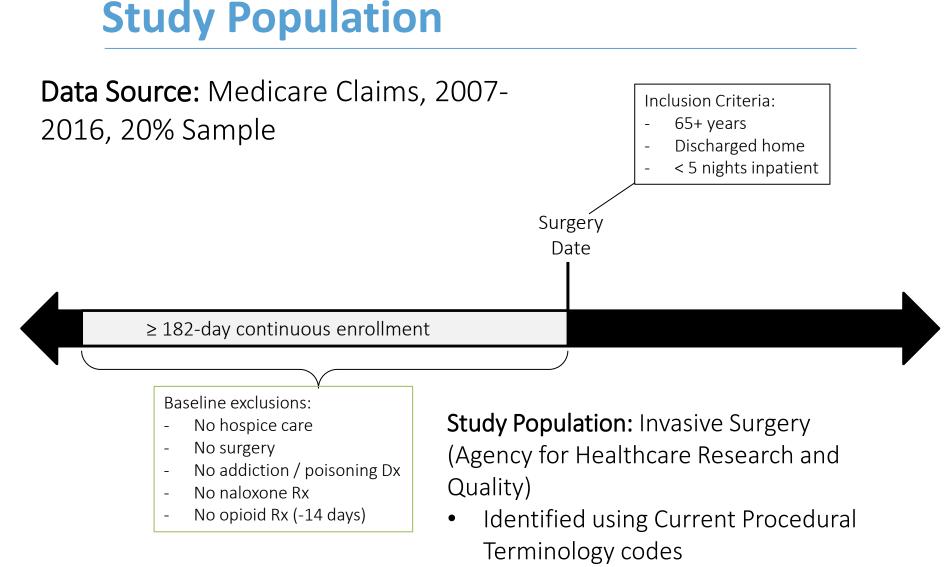




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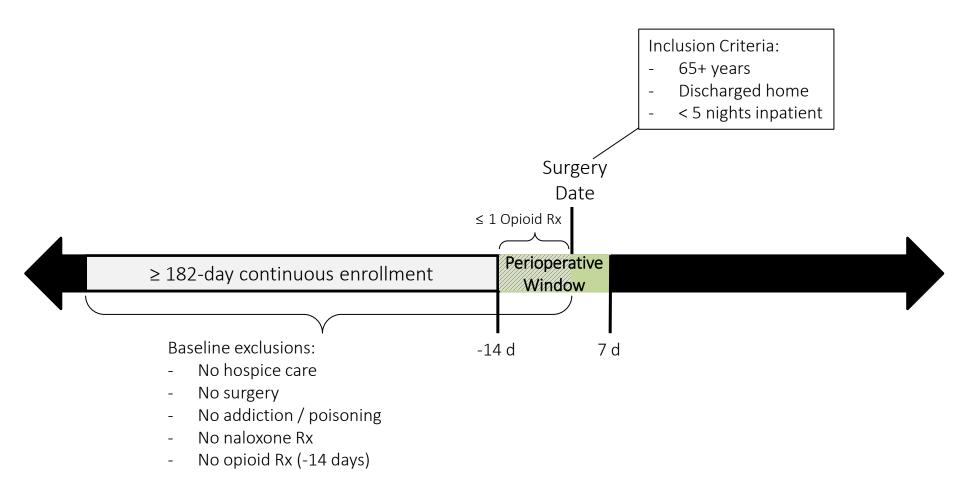






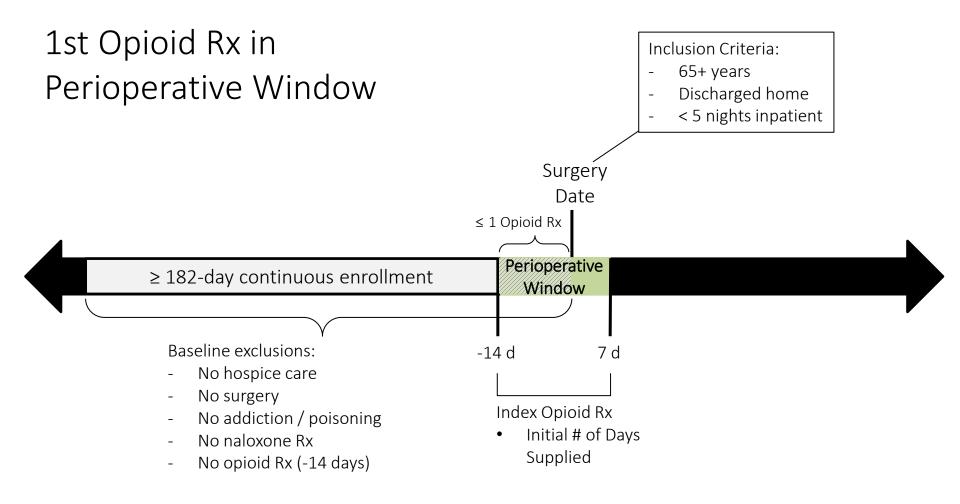
Required CPT for General Anesthesia

Exposure: Initial Perioperative Opioid Rx



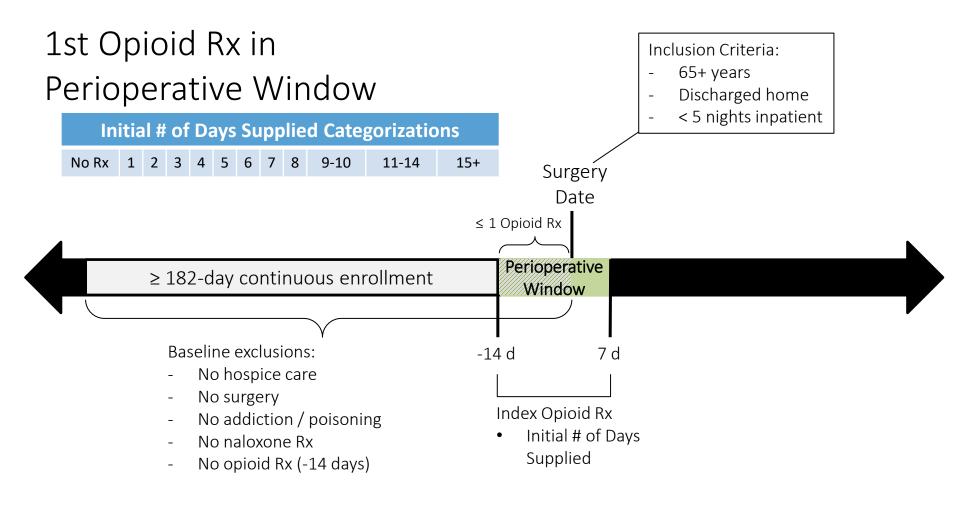


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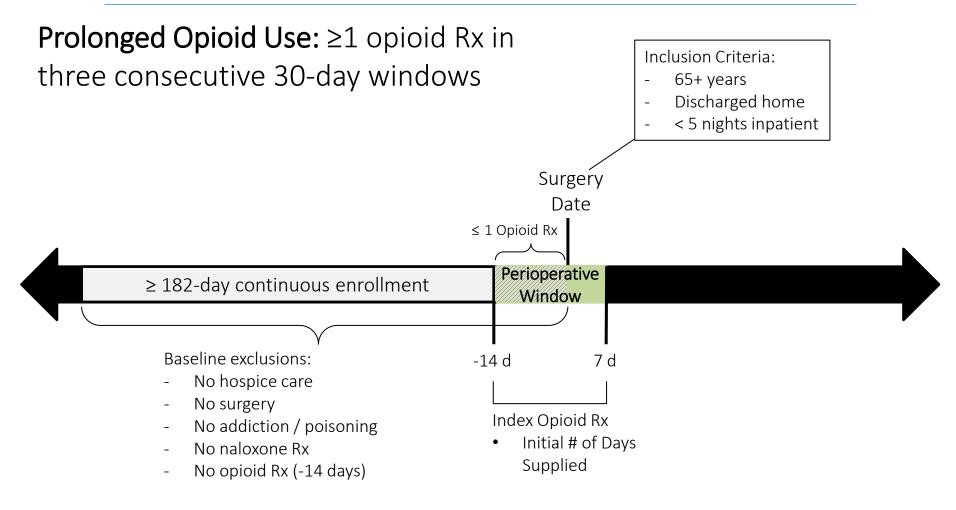




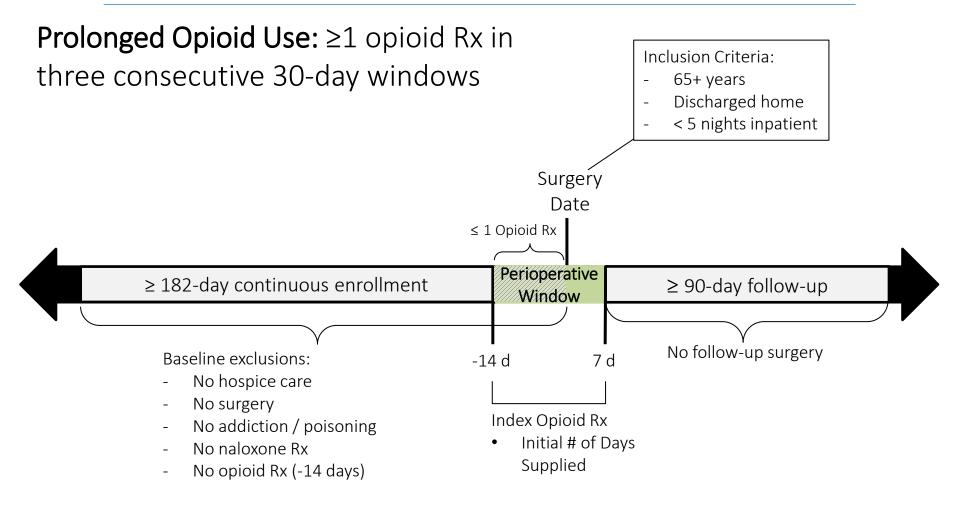
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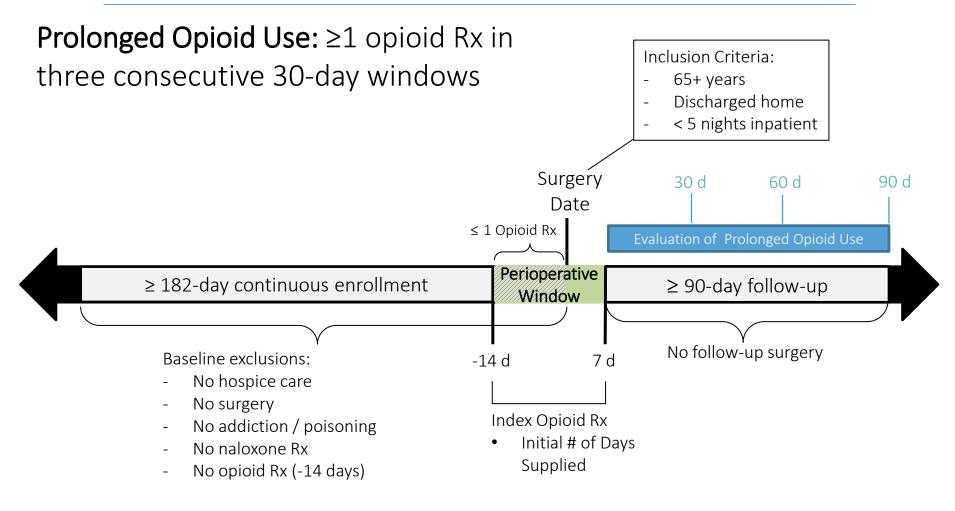




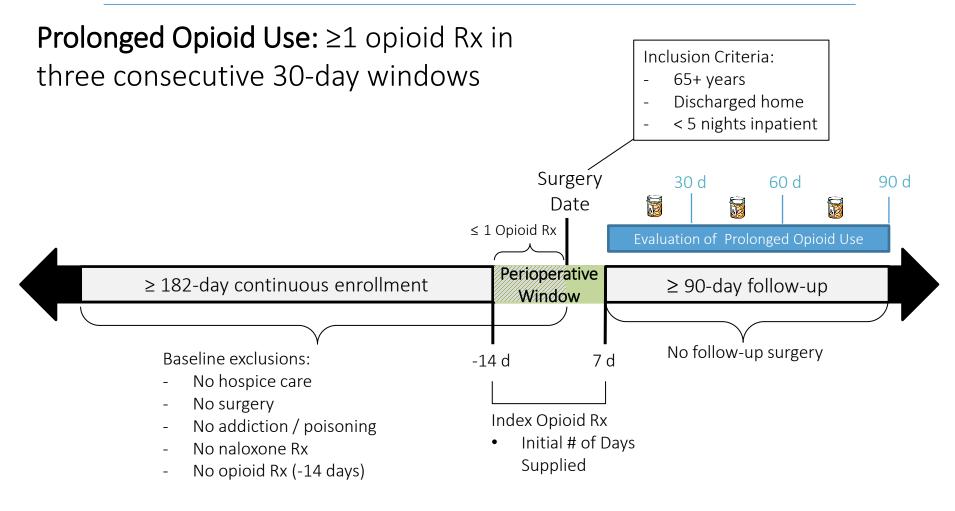






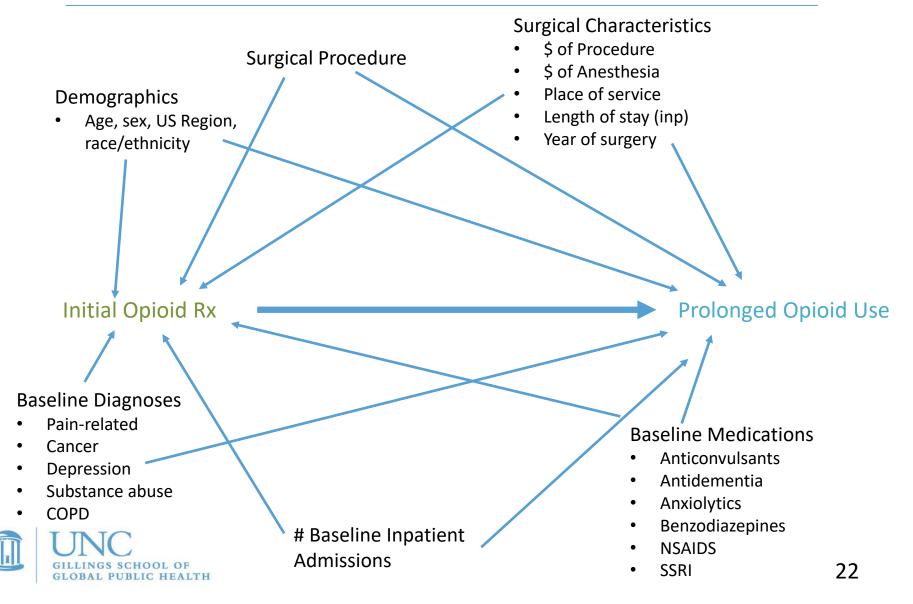








Covariates: Conceptual Model



Statistical Estimates

G-Computation

- Logistic regression predicting prolonged opioid use at varying values of initial days supply
- 95% Confidence Intervals 200 bootstraps, normal approximation

Estimate impact of varying prescribing limits based on days supply

- 9 Most Common Initial Day Supply Values

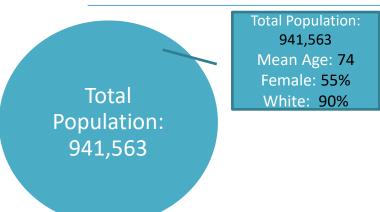
 2
 3
 4
 5
 6
 7
 8
 10
 15
- Risk difference
- Number impacted
- Number of cases avoided



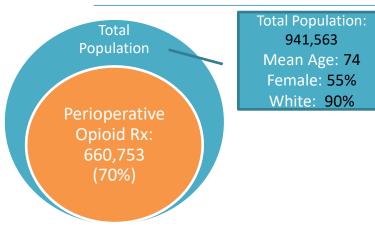


Total Population: 941,563

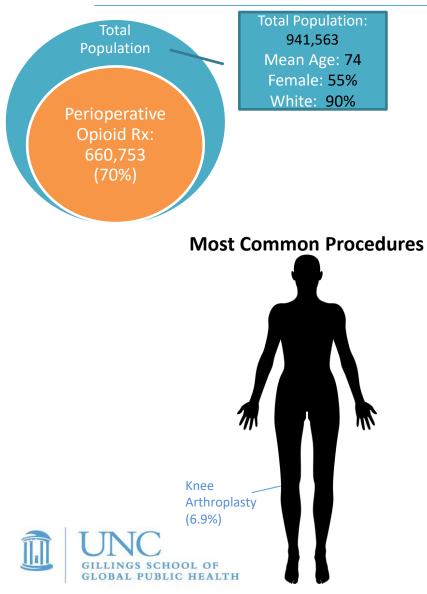


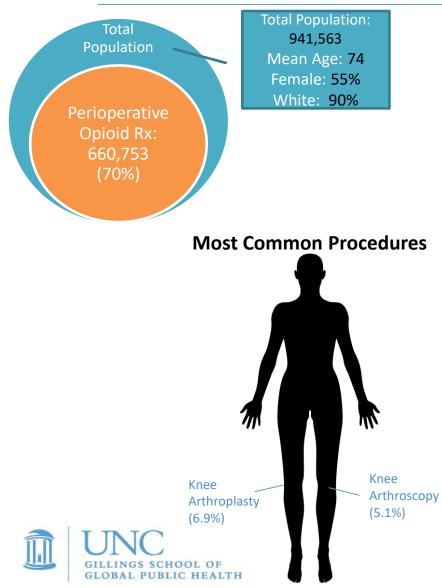


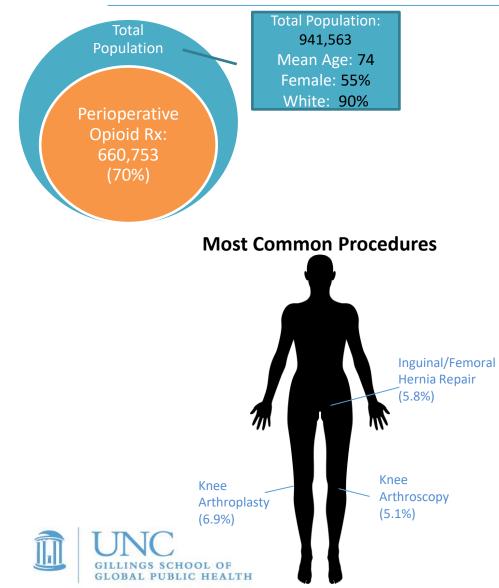


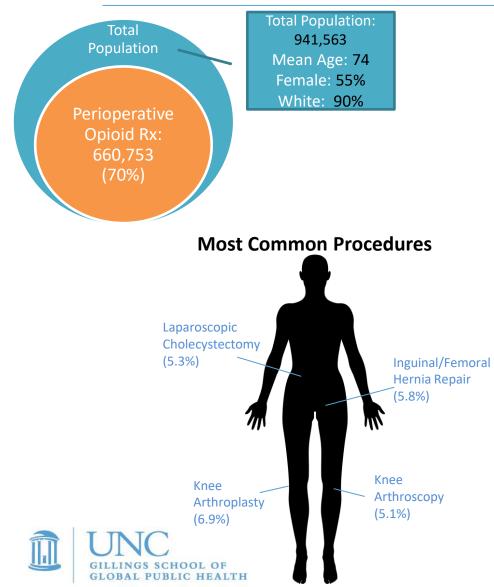


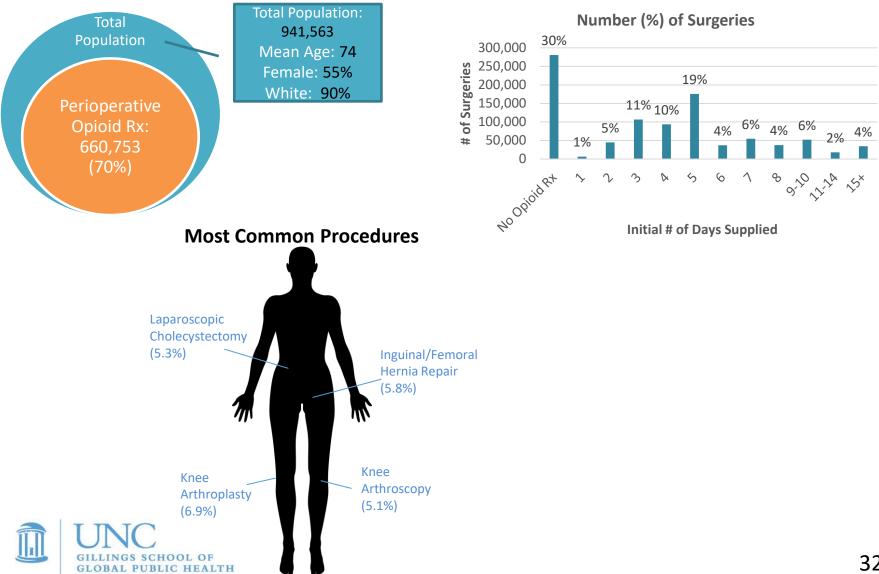


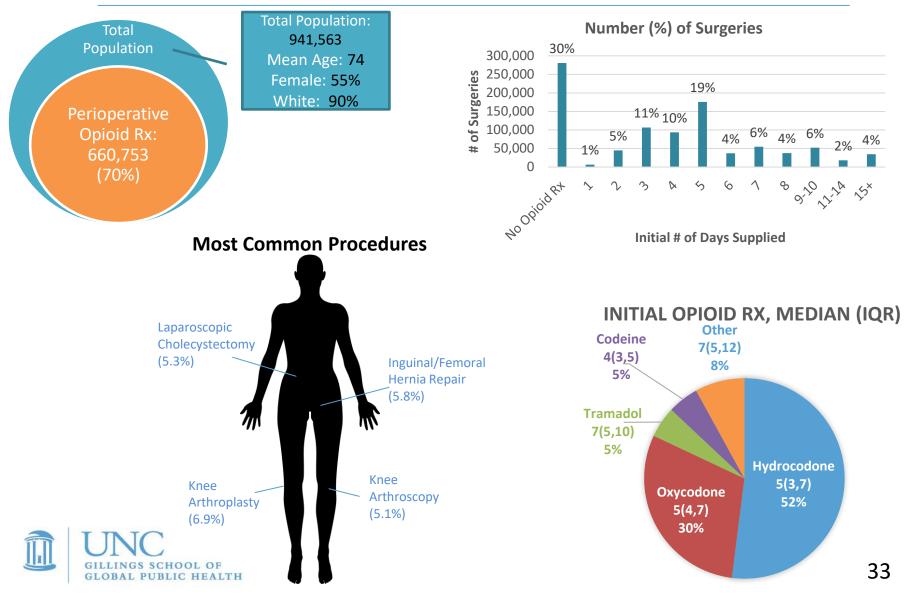




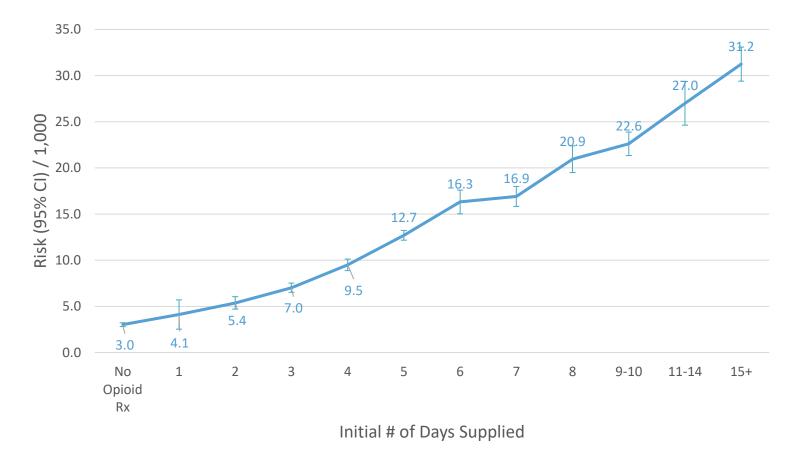








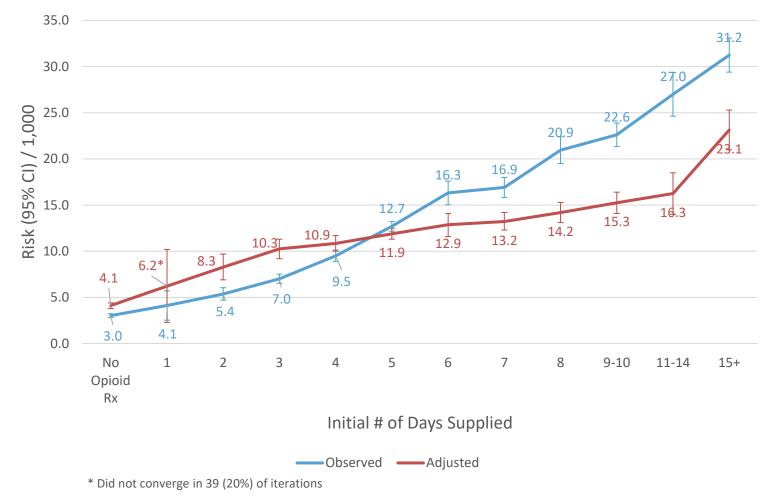
Risk of Prolonged Opioid Use



Observed



Risk of Prolonged Opioid Use





Prescribing Limits Analyses

Day Supply Prescribing Limit	Population: Initial Day Supply Exceeded	No. (%) of Surgeries above Cutoff	Observed Risk/1,000 Above Limit	Predicted Risk/1,000 At Limit ^a	Risk Difference (95% Cl)	# of Reduced Prolonged Opioid Use Cases ^b
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15	≥16 DS	21,121 (3.2%)	34.1	31.8	2.34 (-1.25,5.93)	49

^aRisk calculated using g-computation methods with 200 bootstrapped resamples, estimating risk of prolonged use if all patients above the limit had instead received a prescription equal to that limit. ^b# of surgeries above cutoff / NNT.



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- Common prescribing limits (7 days) may have limited impact on reduction in prolonged opioid use



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Focus on Days Supply



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No information on drug diversion (family, friends) or non-medical sources	Presentation of # of patients impacted and potential risk reduction



Future Directions

- Dosage and Quantity Dispensed
- Adequate pain management
 - Functional improvements
 - Improved quality of life
 - Refill rates
- Linkage to Electronic Health Records



- Minimizing initial prescribing may reduce risk
 - Must have a pain management plan in place



Public Heath Impact

- Minimizing initial prescribing may reduce risk
 - Must have a pain management plan in place
- Currently implemented prescribing limits
 - Alter clinical care for many
 - Have limited impact on reducing prolonged opioid use
 - Need for procedure specific guidelines



Acknowledgements

Co-Authors

- Nabarun Dasgupta
- Brook Chidgey
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- Virginia Pate
- Michael Hudgens
- Michele Jonsson Funk

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R36 NIDA

UNC Pharmacoepidemiology

Questions?

Jessica.Young@unc.edu





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Related Presentations

OR-2516: Two-stage G-computation: Estimating Effects of Treatment Policies From Observational Data when Treatment Information is Missing *Presenting Author: Tiffany Breger*

OR-3743: Electronic Medical Records Vs Insurance Claims: Comparing the Magnitude of Opioid Use Prior, During, and Following Surgery *Presenting Author: Jessica C Young*