# **Interrupted Time Series of User-centered Clinical Decision Support** Implementation for Emergency Department-initiated Buprenorphine for **Opioid Use Disorder**



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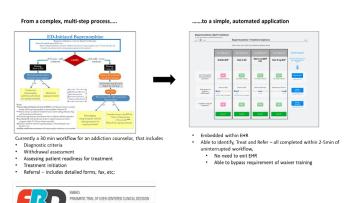
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#### **Background**

- Emergency department (ED)-initiated Buprenorphine (BUP) is safe and effective for treating for Opioid Use Disorder (OUD) patients<sup>1</sup>
- Stigma, ED clinicians' unfamiliarity and misperceptions around BUP protocol are partly to blame1
- Our team developed a user-centered, computerized clinical decision support system (CDS), called EMBED, to guide ED clinicians through process of BUP initiation in the ED<sup>2-5</sup>

# **Objective**

To assess feasibility of implementation and evaluate preliminary efficacy of the CDS intervention (EMBED) in increasing the rate of ED-initiated BUP



## **Methods**

Design & Setting: An interrupted time series study conducted in an urban, academic ED to study the preliminary efficacy of the CDS intervention.

Participants: ED patients, 18 years or older, who met criteria for a validated computable phenotype based on structured electronic health record (EHR) data including opioid-related chief complaints, past medical history, and diagnosis codes

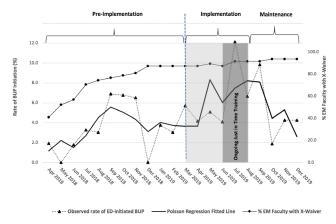
#### Intervention:

- Offers *flexible*, *optional clinical decision support* for:
- OUD identification
- Assessment of opioid withdrawal 2.
- 3. Assessment of patient readiness to start treatment
- Automated EHR activities for BUP initiation (eg. documentation, orders, prescribing, and referral)
- Brief in-person (just-in-time) training was conducted to train ED clinicians how to use the tool.
- Pre-implementation phase Apr 2018 Feb 2019
- Implementation phase Mar 2019 Aug 2019
- Maintenance phase Sep 2019 Dec 2019
- **Primary outcome:** Rate of ED-initiated BUP.
- Secondary outcomes: Rates of -
- 1. Intervention launch
- 2. Prescription for naloxone at ED discharge
- Referral for ongoing addiction treatment

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#### Results

- 141,041 unique patients presented to the ED. 906 (574 during pre-implementation and 332 during implementation)  $met\ OUD$ phenotype and inclusion criteria
- Rate of BUP initiation (i.e. BUP administered in the ED and/or prescribed on discharge) <u>increased</u> from 3.5% (20/574) in the pre-implementation phase to 6.6% (22/332) in the implementation phase (p=0.03).
- With just-in-time training, rate of BUP initiation almost doubled (7.9% vs. 4.9%, p=0.28).
- Relative risk of BUP initiation with CDS was 2.73 times higher (95% CI 0.62, 11.99; p=0.18), after adjusting for number of physician's with X-waiver and other covariates
- *Unique attendings who initiated BUP increased* from 13.0% (7/53) to 22.8% (3/57), (p=0.10). Among them, 44% launched the intervention at least once.
- 32.3% of the attendings adopted the practice of ED-initiation of BUP
- Rate of Naloxone prescription at discharge <u>increased</u> from 6.5% to 11.5%, p<0.01.
- The intervention received a System Usability Scale score of 82.0 (95% CI 76.7-87.2).



## Conclusion

- User-centered CDS to facilitate ED initiated BUP, at a single ED, was associated with increased rates of EDinitiated BUP and Naloxone prescribing among patients with OUD and a doubling of unique physicians adopting the practice.
- A larger multi-system pragmatic EMBED trial (ClinicalTrial.gov NCT03658642) is under way to assess the intervention's effectiveness, scalability, and generalizability.6

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