

# Endometriosis Phenotype Development, Validation, and Characterization from Observational Health Databases

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Patrick Ryan<sup>2</sup>, Noémie Elhadad<sup>1</sup>

<sup>1</sup>Columbia University; <sup>2</sup>Janssen Pharmaceuticals

**Looking for OHDSI collaborators**

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IRVING MEDICAL CENTER

# Endometriosis

- Chronic disease in reproductive-age women
  - Endometrial cells grow outside uterus
  - Characterized through surgical findings
  - Menstrual pain and infertility as the most common characterization
- Prevalent
  - Estimated to ~10% of women in reproductive age
- Highly enigmatic
  - No known biomarker, etiology, or treatment response
  - Long lag to diagnosis (~10 years)

# Research gaps

- Incomplete characterization
  - Systemic condition with symptoms beyond dysmenorrhea and infertility
  - From onset of symptoms to after diagnosis
  - Because misdiagnoses/under-diagnosis, need to identify the patterns of endo patients prior to diagnosis towards earlier/better detection
- Lack of validated phenotype
  - Epidemiological studies rely on single high-level ICD code
  - Types of endometriosis have been proposed but focus on surgical findings and do not correlate with patient experience of disease

# Research questions

1. What is an accurate phenotype for endometriosis to identify cohorts from EHR and claims databases?
  2. What are the patterns of patients experiences before diagnosis?
    - Signs/symptoms, treatments, healthcare utilization patterns, etc.
- Additional desiderata:
    - Phenotype valid across claims and EHR databases to identify a wide range of patients
    - Open access to other OHDSI members

# Methods

1. Define and validate an endometriosis phenotype for EHRs / claims databases
2. Characterize cohorts pre-diagnosis across databases

# Relevant concepts

- **Endo diagnosis**: endometriosis diagnosis codes (including adenomyosis)
- **Endo-related procedures**: guideline-based procedures for endometriosis diagnosis and treatment (e.g., pelvic laparoscopy)
- **Endo-prevalent procedures**: procedures present >50% of patients with  $\geq 1$  endo diagnosis
- **Endo-related imaging procedures**: guidelines-based imaging procedures (e.g. pelvic MRI)

# Cohort definition experiments

Cohort	Initial Event	Inclusion Rules
A	<p><b>endo-related procedures AND endo diagnosis</b> OR <b>endo-prevalent procedures AND endo diagnosis</b></p>	Females ages 15-49
B	<p><b>endo-related procedures AND endo diagnosis</b> OR <b>endo-prevalent procedures AND endo diagnosis</b></p>	Females ages 15-49 AND 2 <b>endo diagnosis</b> after index date
C	<p><b>endo-related procedures AND endo diagnosis</b> AND <b>endo-related imaging procedures AND endo diagnosis</b> before index date</p>	Females ages 15-49
D	<p><b>endo-related procedures AND endo diagnosis</b> AND <b>endo-related imaging procedures AND endo diagnosis</b> before index date</p>	Females ages 15-49 AND 2 <b>endo diagnosis</b> after index date



# Cohort definition validation

- Manual chart review from clinical experts on EHR database (Columbia)
  - Index data between 1/1/2016 to 6/1/2018
  - Reviewed records of patients across all cohort definitions
  - Confirmed endometriosis diagnosis through histological analysis post-laparoscopy
- Gold-standard annotations of 1,406 patient records
  - Two annotators
  - Kappa on 38 records: .89\*
    - Determined N=38 provides expected confidence limits between .6 and 1

# Cohort definition validation

- **Cohort B** had highest precision/recall
  - Negative predictive value 0.84

Cohort name on OHDSI.org	Precision	Recall	Records in cohort at Columbia EHR 2016-2018*	Total records in cohort at Columbia EHR 1999-2018
Cohort D	0.84	0.26	162	1,248
Cohort C	0.78	0.28	189	1,950
<b>Cohort B</b>	<b>0.85</b>	<b>0.70</b>	<b>430</b>	<b>3,328</b>
Cohort A	0.37	1**	1,406	5,666

\* each of these cohorts was reviewed by clinical experts.

\*\* all other cohorts are a subset of this cohort so recall=1.

# Cohort definitions

Best performing cohort we  
used to characterize

## • Available at:

- <http://www.ohdsi.org/web/atlas/#/cohortdefinition/1769393>
- <http://www.ohdsi.org/web/atlas/#/cohortdefinition/1769395>
- <http://www.ohdsi.org/web/atlas/#/cohortdefinition/1769396>
- <http://www.ohdsi.org/web/atlas/#/cohortdefinition/1769397>

# Methods

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# Cohort characterization

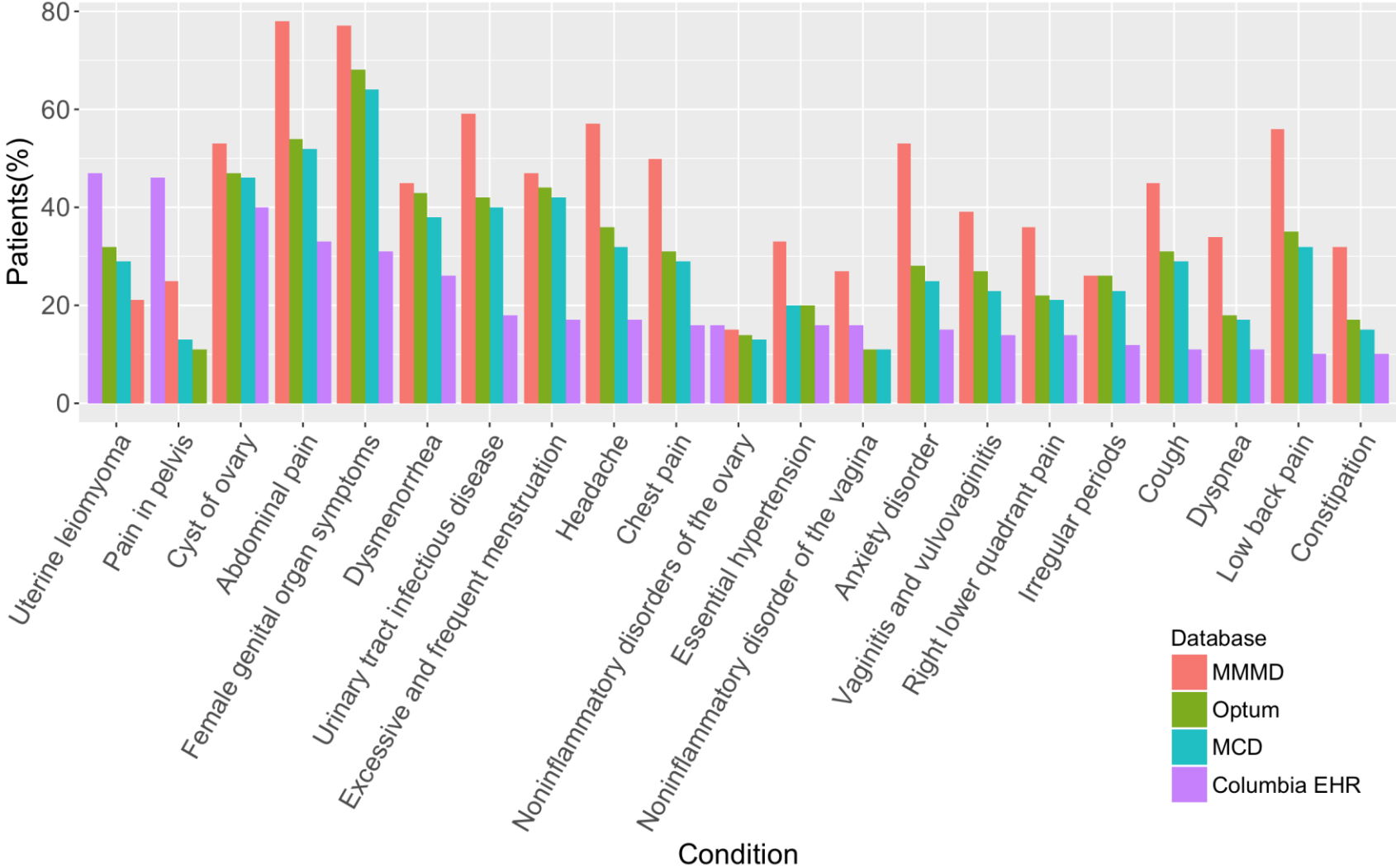
- Select best-performing cohort, Atlas characterization
- Analysis carried out on four databases
  - Columbia EHR (**Columbia EHR**)
  - Optum® Clinformatics® Extended DataMart (**Optum**)
  - IBM MarketScan® Commercial Database (**MCD**)
  - IBM MarketScan® Multi-State Medicaid Database (**MMMD**)
- Report on prevalent (>10% of patients) conditions and drugs
- For comparison, prevalence in general cohort of women of reproductive age

# Cohort characterization

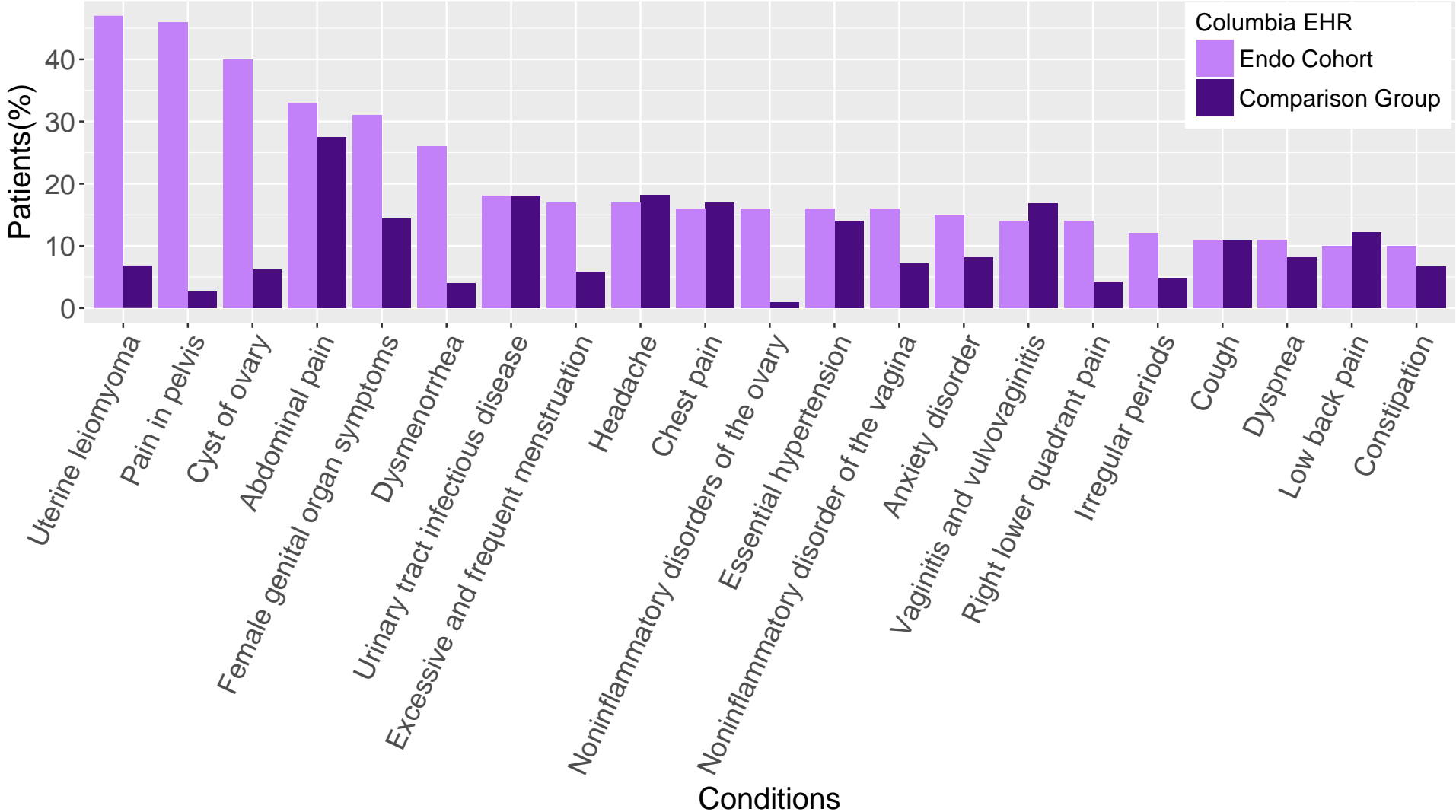
- Overall >480,000 patients in endometriosis cohort

Database	Total records in cohort
Columbia EHR	3,328
Optum	24,725
MMMD	54,609
MCD	398,015

# Conditions

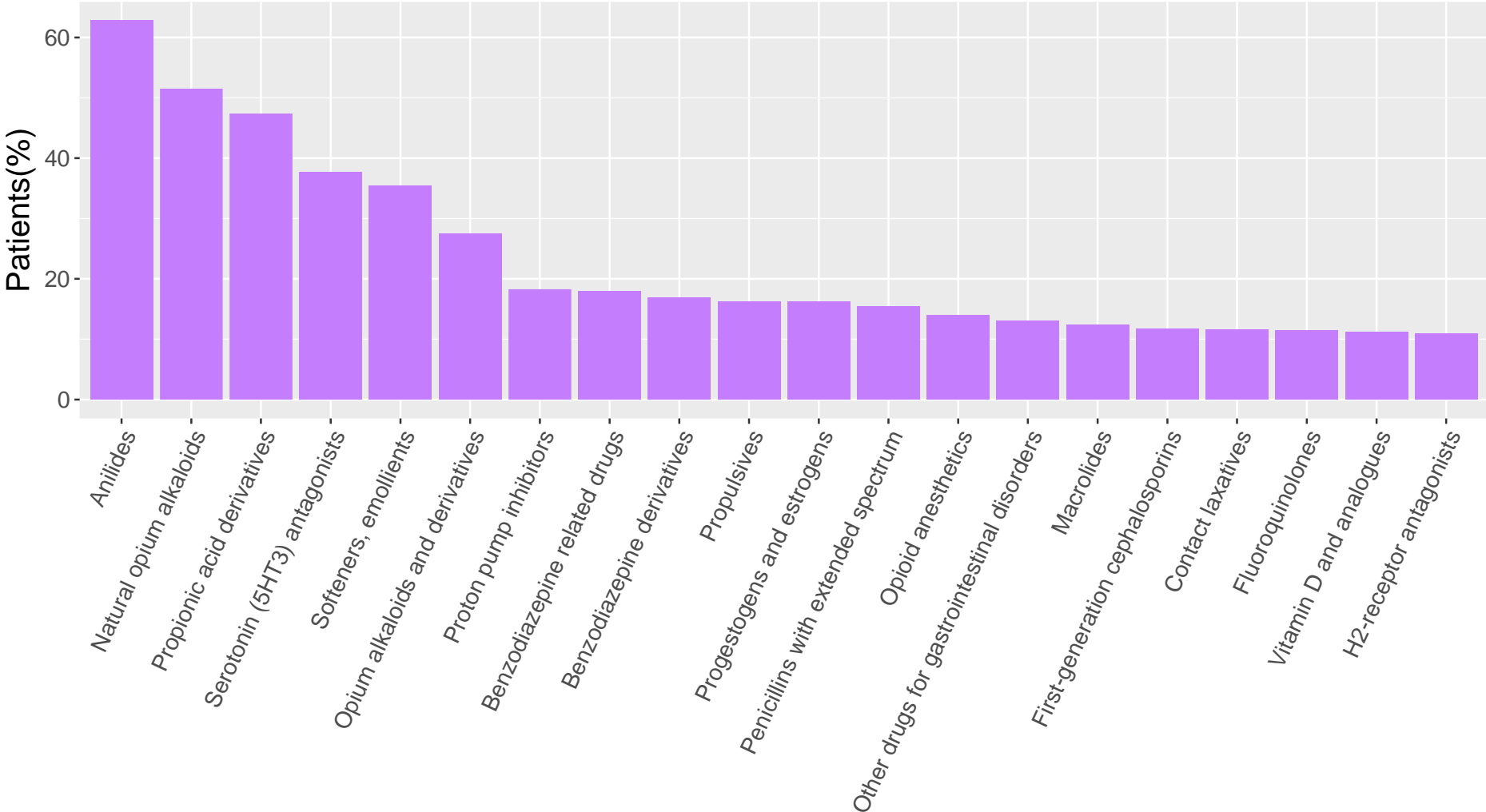


# Comparison (not control) Group Conditions





# Drugs



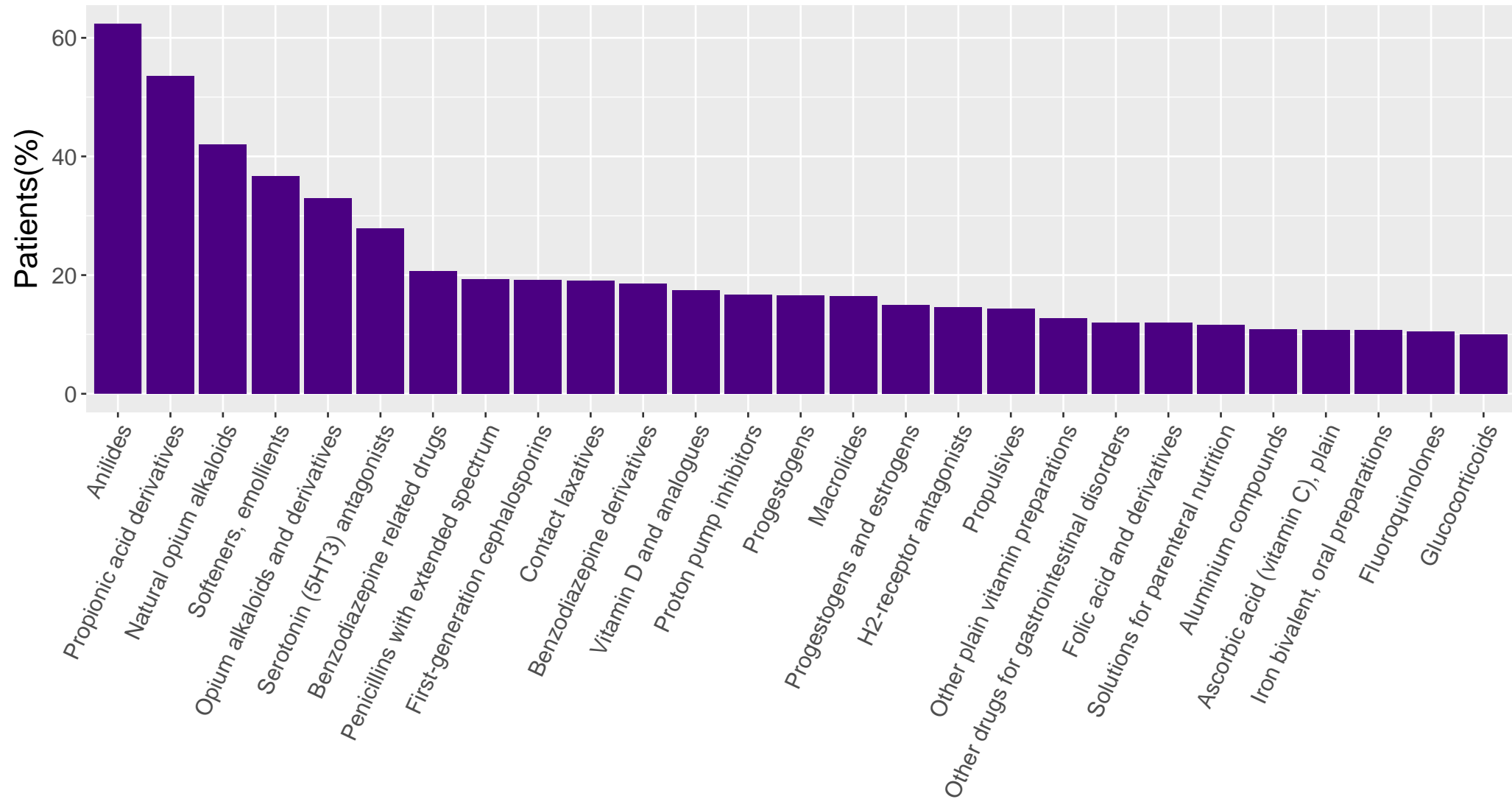
ATC Class 5

OHDSI Call – Oct 30, 2018



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# Comparison Group Drugs



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# Discussion

- First study to develop well-validated endometriosis phenotype for cohort selection
- Findings across databases consistent with ongoing endometriosis research
  - Primary symptoms present prior to diagnosis related to pelvic pain and heavy pain medication
- Results congruent with new knowledge about endometriosis
  - Beyond dysmenorrhea and pelvic pain, systemic impact of disease (i.e. anxiety, constipation)
- OHDSI essential for characterization
  - Wouldn't have started to get full picture w/o collaborators!

# Next steps

- Characterize in larger, more diverse cohort
  - Get in touch if you'd like to participate
  - All definitions available on ohdsi.org and further queries available on demand
- Use phenotype definition for patient-level prediction
  - In women in reproductive age presenting in ED with abdominal pain, who is likely to be diagnosed with endometriosis 1year+ later?
  - Using PLP modules
  - Get in touch if you'd like to participate

# Thanks, questions?

- Columbia OHDSI bootcamp participants



# Comparison (not control) Group Conditions

