

# Opioid Prescribing Distribution

What if it's not just a few bad apples?

Jonathan H. Chen MD PhD



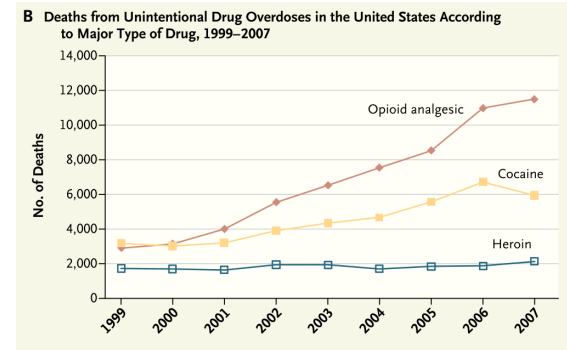
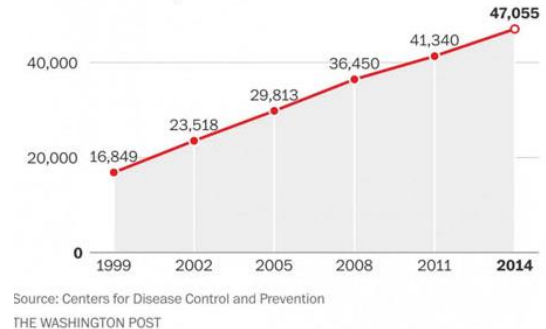
General Medical Disciplines,  
Department of Medicine,  
Stanford University

ClickWell Care,  
Hospitalist Group



# Background / Motivation

- Leading cause of accidental death
  - Drug overdose (>40K/year)<sup>1,2</sup>
- *Prescription* opioid overdose deaths
  - Exceed cocaine and heroin combined<sup>1</sup>
- Opioid prescription volume
  - Increased 10X from 1990 to 2010<sup>1</sup>



1. Okie, S. A flood of opioids, a rising tide of deaths. *N. Engl. J. Med.* **363**, 1981–5 (2010)  
2. Jones, C. M., Mack, K. A. & Paulozzi, L. J. Pharmaceutical Overdose Deaths, United States, 2010. *JAMA* **309**, 657–659 (2013)

# Who's Prescribing the Opioids?



## The NEW ENGLAND JOURNAL of MEDICINE Abusive Prescribing of Controlled Substances — A Pharmacy View

Mitch Betses, R.Ph., and Troyen Brennan, M.D., M.P.H

## Doctor convicted of murder for patients' drug overdoses gets 30 years to life in prison



Los Angeles Times

STAT | Reporting from the frontiers  
of health and medicine

POLITICS

## Florida crackdown on pill mills drives down opioid overdose deaths



- “Pill mills” and “bogus pain clinics?”<sup>3,4</sup>
- California Worker’s Compensation:
  - ~80% of opioids from 10% of prescribers<sup>5</sup>
- Is the problem just a few outliers?
  - Implies general use is safe and effective?

3. Rosenau, A. M. Guidelines for opioid prescription: The devil is in the details. *Ann. Intern. Med.* **158**, 843–844 (2013).
4. Betses, M. & Brennan, T. Abusive prescribing of controlled substances--a pharmacy view. *N. Engl. J. Med.* **369**, 989–91 (2013)
5. Ireland, J. & Johnson, G. Prescribing Patterns of Schedule II Opioids in California Workers’ Compensation. (2011)

# Medicare Prescription Data

- >55 million Americans >65 or disabled
- ~2/3 with Part D Prescription Coverage
- Public data at individual prescriber level
  - Prescriber, Specialty and Location
  - Drug, Quantity and Cost

| Medicare Claims 2013    | Prescribers | Claims        | Cost             |
|-------------------------|-------------|---------------|------------------|
| All Drugs               | 808,020     | 1,188,393,892 | \$80,941,763,731 |
| Opioids inc Hydrocodone | 381,575     | 56,516,854    | \$2,812,243,687  |
| Opioids exc Hydrocodone | 199,925     | 22,830,450    | \$2,246,942,747  |

# Example Data

Previous queries

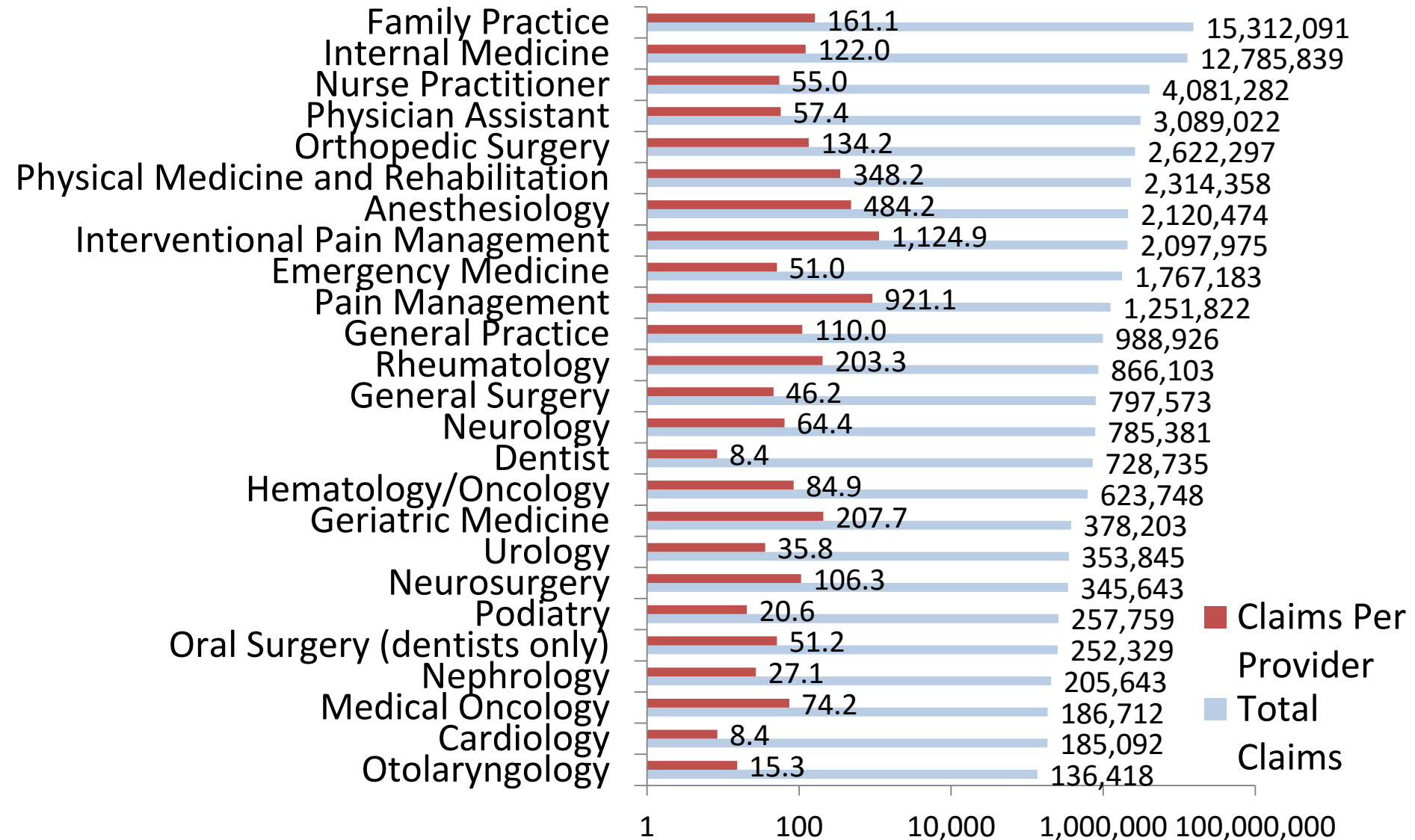
```
select npi, npes_provider_city, npes_provider_state, specialty_desc, generic_name, total_claim_count, total_drug_cost
from partd_prescriber
where specialty_desc = 'Addiction Medicine'
limit 100
```

<

Output pane

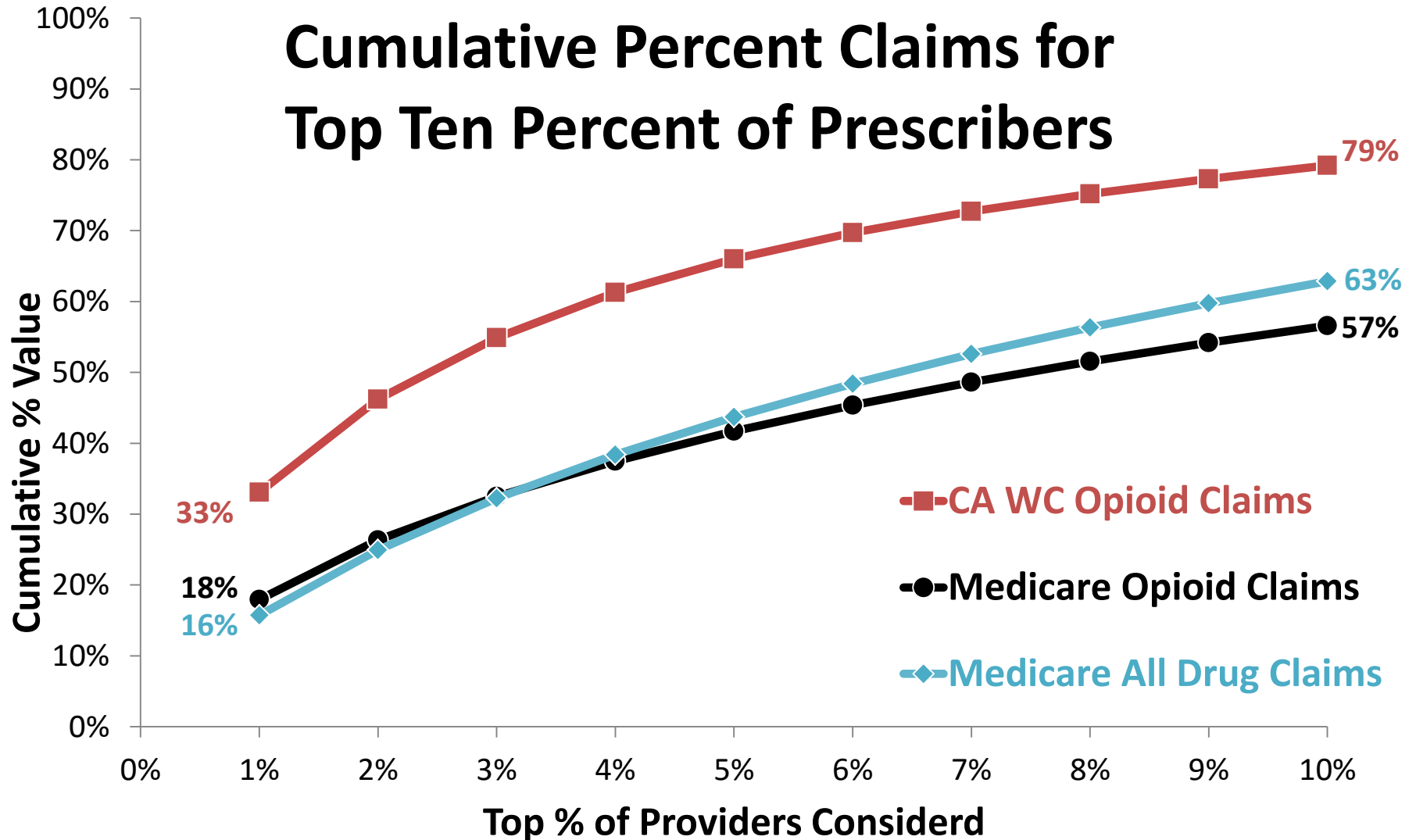
| Data Output | Explain       | Messages              | History                     |                        |                                |                              |                         |
|-------------|---------------|-----------------------|-----------------------------|------------------------|--------------------------------|------------------------------|-------------------------|
|             | npi<br>bigint | npes_provider<br>text | npes_provider_state<br>text | specialty_desc<br>text | generic_name<br>text           | total_claim_count<br>integer | total_drug_cost<br>real |
| 1           | 1598772485    | VERO BCH              | FL                          | Addiction Medicine     | CLONAZEPAM                     | 39                           | 480.95                  |
| 2           | 1598772485    | VERO BCH              | FL                          | Addiction Medicine     | DULOXETINE HCL                 | 22                           | 9363.55                 |
| 3           | 1598772485    | VERO BCH              | FL                          | Addiction Medicine     | GABAPENTIN                     | 13                           | 779.24                  |
| 4           | 1598772485    | VERO BCH              | FL                          | Addiction Medicine     | LEVOTHYROXINE SODIUM           | 12                           | 90.11                   |
| 5           | 1598772485    | VERO BCH              | FL                          | Addiction Medicine     | LORAZEPAM                      | 12                           | 505.9                   |
| 6           | 1598772485    | VERO BCH              | FL                          | Addiction Medicine     | BUPRENORPHINE HCL/NALOXONE HCL | 11                           | 2715.99                 |
| 7           | 1598772485    | VERO BCH              | FL                          | Addiction Medicine     | TRAZODONE HCL                  | 15                           | 58.96                   |
| 8           | 1578637294    | TOWSON                | MD                          | Addiction Medicine     | AMLODIPINE BESYLATE            | 29                           | 184.5                   |
| 9           | 1578637294    | TOWSON                | MD                          | Addiction Medicine     | ATORVASTATIN CALCIUM           | 28                           | 832                     |
| 10          | 1578637294    | TOWSON                | MD                          | Addiction Medicine     | CARVEDILOL                     | 21                           | 169.09                  |
| 11          | 1578637294    | TOWSON                | MD                          | Addiction Medicine     | CLOPIDOGREL BISULFATE          | 45                           | 756.99                  |
| 12          | 1578637294    | TOWSON                | MD                          | Addiction Medicine     | HYDROCHLOROTHIAZIDE            | 30                           | 154.37                  |
| 13          | 1578637294    | TOWSON                | MD                          | Addiction Medicine     | ISOSORBIDE MONONITRATE         | 19                           | 121.56                  |
| 14          | 1578637294    | TOWSON                | MD                          | Addiction Medicine     | INSULIN GLARGINE,HUM.REC.ANLOG | 18                           | 3784.61                 |
| 15          | 1578637294    | TOWSON                | MD                          | Addiction Medicine     | LISINOPRIL                     | 20                           | 194.13                  |
| 16          | 1578637294    | TOWSON                | MD                          | Addiction Medicine     | LISINOPRIL/HYDROCHLOROTHIAZIDE | 11                           | 133.58                  |
| 17          | 1578637294    | TOWSON                | MD                          | Addiction Medicine     | PRAVASTATIN SODIUM             | 20                           | 180.33                  |
| 18          | 1578637294    | TOWSON                | MD                          | Addiction Medicine     | SIMVASTATIN                    | 20                           | 137.29                  |
| 19          | 1578637294    | TOWSON                | MD                          | Addiction Medicine     | TRANOLAPRIL                    | 11                           | 120.32                  |
| 20          | 1811948615    | CULLMAN               | AL                          | Addiction Medicine     | ARIPIRAZOLE                    | 56                           | 50496.9                 |
| 21          | 1811948615    | CULLMAN               | AL                          | Addiction Medicine     | ALPRAZOLAM                     | 11                           | 129.89                  |
| 22          | 1811948615    | CULLMAN               | AL                          | Addiction Medicine     | AMANTADINE HCL                 | 11                           | 997.22                  |
| 23          | 1811948615    | CULLMAN               | AL                          | Addiction Medicine     | BENZTROPINE MESYLATE           | 170                          | 1316.73                 |
| 24          | 1811948615    | CULLMAN               | AL                          | Addiction Medicine     | BUPROPION HCL                  | 20                           | 587.73                  |
| 25          | 1811948615    | CULLMAN               | AL                          | Addiction Medicine     | BUPROPION HCL                  | 21                           | 687.42                  |
| 26          | 1811948615    | CULLMAN               | AL                          | Addiction Medicine     | BUSPIRONE HCL                  | 18                           | 229.28                  |
| 27          | 1811948615    | CULLMAN               | AL                          | Addiction Medicine     | CARBAMAZEPINE                  | 11                           | 125.16                  |
| 28          | 1811948615    | CULLMAN               | AL                          | Addiction Medicine     | CHLORPROMAZINE HCL             | 15                           | 1632.02                 |

# Schedule II Opioids by Specialty

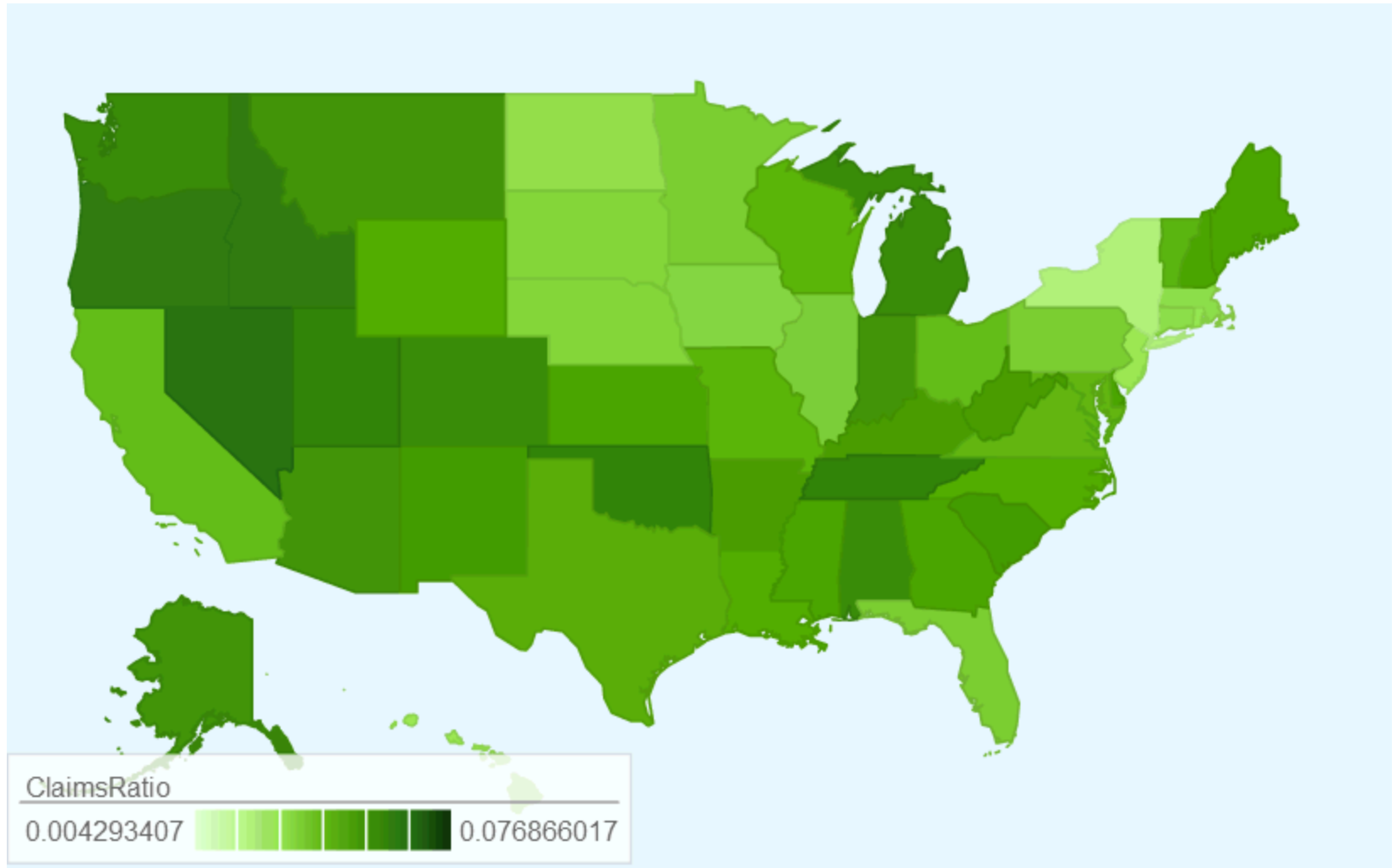


# Cumulative Drug Claims

## Cumulative Percent Claims for Top Ten Percent of Prescribers



# Opioid Regional Variation?

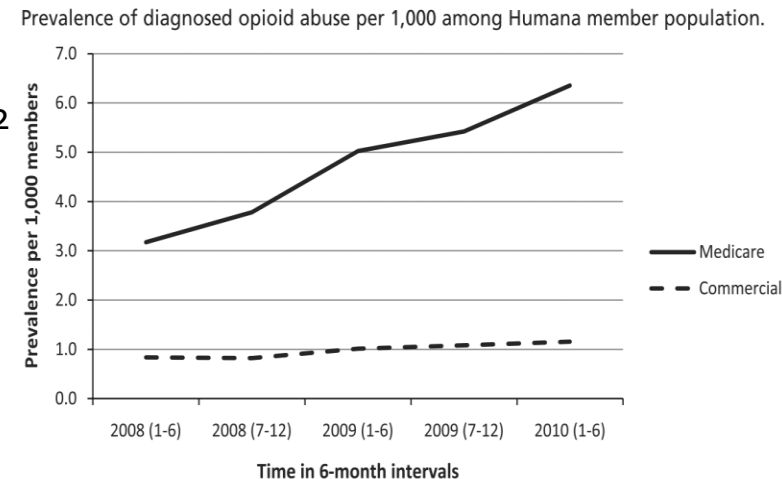


Per state, 56.6% to 57.7% of opioids from 10% of prescribers



# Why Medicare Data?

- Newly released data at individual prescriber level<sup>3</sup>
- >55 million Americans >65 or disabled
- Greater and growing rate of opioid use disorder
  - >6 per 1,000 (>330,000)<sup>1</sup>
  - Hospitalizations +10% annually<sup>2</sup>
  - Higher risk for overdose
- Comprehensive coverage
  - No churn in covered population
  - Not missing “uninsured” patients



1. Dufour R, Joshi A V, Pasquale MK, et al. The Prevalence of Diagnosed Opioid Abuse in Commercial and Medicare Managed Care Populations. *Pain Pract.* 2014
2. Owens PL, Barrett ML, Weiss AJ, Washington RE, Kronick R. Hospital Inpatient Utilization Related to Opioid Overuse Among Adults, 1993-2012. *HCUP Stat. Briefs* 2014. Available at: <https://www.hcup-us.ahrq.gov/reports/statbriefs/sb177-Hospitalizations-for-Opioid-Overuse.jsp>
3. Part D Prescriber. *Medicare Provid. Util. Paym. Data* 2015. Available at: <http://www.cms.gov/Research-Statistics-Data-and-Systems/Statistics-Trends-and-Reports/Medicare-Provider-Charge-Data/Part-D-Prescriber.html>

# Not Just a Few Bad Apples

STAT

Opioid crisis fueled by prescriptions from family doctors and internists

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## Broader Strategies Necessary To Counter Painkiller Over Prescribing, Researchers Say

By Shefali Luthra | December 14, 2015



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## How Family Doctors Contributed to America's Opioid Problem

It's not just a few bad apples.

FRANCIE DIEP · DEC 15, 2015

[\[NY Times\]](#)

[\[Washington Post\]](#)

[\[USA Today\]](#)

[\[NBC\]](#)

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[\[Medical Daily\]](#)

[\[Pain Medicine News\]](#)

[\[Stanford Medicine\]](#)



APSTOCK

By ERIC BOODMAN @ericboodman

DECEMBER 14, 2015

# Top Down Guidelines?

The New York Times

## Patients in Pain, and a Doctor Who Must Limit Drugs

By JAN HOFFMAN MARCH 16, 2016



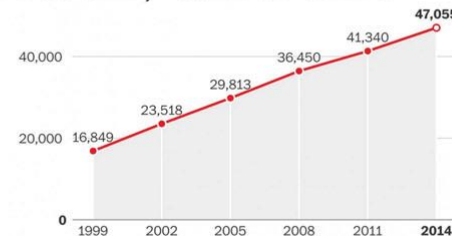
The Washington Post

## CDC urge doctors to curb opioid prescriptions: “The risks are addiction and death, and the benefits are unproven.”

By Lenny Bernstein December 14, 2015 [Follow @LennyMBernstein](#)

### Deaths from drug overdoses keep spiking

The nation saw another sharp rise in fatal overdoses last year, with prescription opioids and heroin accounting for much of the increase.



Source: Centers for Disease Control and Prevention  
THE WASHINGTON POST

[\[NY Times\]](#)

[\[Washington Post\]](#)

[\[USA Today\]](#)

[\[NBC\]](#)

[\[HuffPost Live\]](#)

[\[Medscape\]](#)

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# Evaluating Clinical Interventions

- **Stanford Primary Care Opioid Guidelines**
  - For patients on chronic opioids (>3 months) for non-cancer pain
  - Patients should be seen at least every 3 months
  - Referral to Pain Clinic, Physical Therapy, Psychiatry as appropriate
  - Routine urine toxicology screening for drugs of abuse and diversion
  - Single (primary care) opioid prescriber
  - State Prescription Drug Monitoring Database review
  - Encourage gradual attempts to reduce opioid use when appropriate
- **Assess Effect of Intervention?**
  - Set up study registry and research coordinator?
  - Manual chart review of hundreds of patients?

# Priority in Education / Training

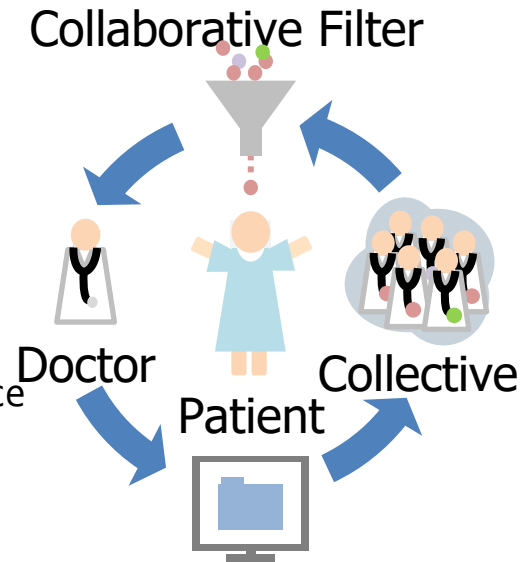


A PIECE OF MY  
MIND

- The Patient You Least Want To See
  - Is probably the one who needs you the most
- Opioid prescribing and misuse:
  - Insidiously pervasive problem
  - Lack of structured or consistent guidance
  - As important as prescribing insulin for diabetics
    - Addiction (40M), Heart Dz (27M), Cancer (19M)
  - Many topics compete for educational priority
    - But an inadequately trained medical community will routinely contribute to if not overtly cause opioid misuse

# Acknowledgements

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