## **APPENDICES**

**Supplemental Table 1**: Provider specialty codes and healthcare provider taxonomy codes.

Type of provider	Medicare Specialty code	Label
Primary Care physician	01, 08, 11, 38	General practice, Family practice, Internal Medicine, Geriatric Medicine
Primary Care Nurse Practitioner	50 exclude	Nurse practitioner
	363LA2100X	Nurse practitioner/acute care
	363LC0200X	Nurse practitioner/critical care medicine
	363LN0000X	Nurse practitioner/neonatal
	363LN0005X	Nurse practitioner/neonatal critical care
	363LX0001X	Nurse practitioner/obstetrics & gynecology
	363LX0106X	Nurse practitioner/occupational health
	363LP0200X	Nurse practitioner/pediatrics
	363LP0222X	Nurse practitioner/pediatrics critical care
	363LP1700X	Nurse practitioner/perinatal
	363LP0808X	Nurse practitioner/psychiatric & mental health
	363LS0200X	Nurse practitioner/school
Primary Care Physician Assistant	97	Physician Assistant
	exclude	•
	363AS0400X	Physician assistant/surgical

Supplemental Table 2: Flow chart for study cohorts

Denominator	Provider type							
Primary care providers	Primary	Care MD		NP	PA			
	N % of previous step		N	% of previous step	N	% of previous step		
1.Unique NPI numbers in 2015 Part D file from 20% Medicare sample	244,862		121,949		82,383			
2. Limited to primary care by taxonomy codes			108,995	89.4	74,428	90.3		
3. Those in 50 States and DC	241,674	98.7	108,885	99.9	74,324	99.9		
4. Those wrote at least 50 prescriptions in a year <sup>a</sup>	177,666	73.5	56,848	52.2	34,820	46.8		
5. Exclude those without any E&M services	162,412	91.4	45,435	79.9	26,933	77.3		
6. Those with <50% E&M service for ED	159,631	98.3	44,006	96.9	24,275	90.1		
7. Those with at least 10 patients**	156,161	97.8	42,655	96.9	23,873	98.3		
8. Those with at least 10 patients with completed Part D enrollment and survived after 4/1/2015**	155,335	97.3	42,309	96.1	23,754	97.9		

a Using this cutoff, about 98% of providers prescribed medications to at least 10 Medicare patients in the study year.

MD: medical doctor; NP: nurse practitioner; PA: physician assistant; E&M evaluation and management; ER:

emergency department; MME: morphine milligram equivalents.

<sup>\*\*</sup> Assessing the percent of patients receiving high dose opioid prescriptions

<sup>\*\*\*</sup> Assessing the percent of patients receiving prolong opioid prescriptions

Supplemental Table 3: Nurse Practitioner and Physician Assistant prescriptive authority<sup>21-23</sup> requirements for controlled substance (Schedule II-V) prescribing in 2015

Nurse practitioner	Legal requirements	Schedule II prescribing allowed	Schedule III-V Prescribing allowed	Can obtain DEA number
Alabama	Collaborating physician for professional oversight and direction	No	Yes	No
Arkansas	Collaborating physician for professional oversight and direction	Limited to hydrocodone-containing products (with authorization from collaborating MD)	Yes	Yes
Florida	N/A	No	No	No
Georgia	Practice under a Nurse Protocol Agreement and prescribe as delegated by a physician or protocol	No	Yes	No
Missouri	Collaborating physician for professional oversight and direction	Limited to hydrocodone-containing products (with authorization from collaborating MD)	Yes	Yes <sup>a</sup>
Oklahoma	Physician supervision required for prescriptive authority	No	Yes, 30-day supply	Yes
South Carolina	May prescribe according to practice agreement/protocol in place	No	Yes	No
West Virginia	Collaborating physician for professional oversight and direction	No	Yes	Yes
Physician assistant				
Alabama	Must practice with a supervising physician	Additional permit required	Yes	Yes
Arkansas	Must practice with a supervising physician	Limited to hydrocodone-containing products (with authorization from supervising MD)	Yes	Yes
Florida	Must practice with a supervising physician	No	Yes	Yes
Georgia	Must practice with a supervising physician	No	Yes	Yes
Iowa	Must practice with a supervising physician	May not prescribe depressants <sup>b</sup>	Yes	Yes
Kentucky	N/A	No	No	No
Missouri	Must practice with a supervising physician	Limited to hydrocodone-containing products (with authorization from supervising MD	Yes	Yes
West Virginia	Must practice with a supervising physician	No	Yes, 30-day supply	Yes

a Prescriptions must include name of collaborating physician

**Supplemental Table 4.** Opioid prescribing pattern of primary care providers in the 559 primary care services areas, stratified by whether NP/PA were affiliated with primary care practices identified by social network analysis\*\*

	Primary care MD						Primary care PA			
	Primary care practice				Primary ca	are practice	Primary care practice			
	Total	Yes	No <sup>a</sup>	Total	Yes	No <sup>b</sup>	Total	Yes	No <sup>b</sup>	
% of patients who received any opioid	N = 31,147	N = 11,172	N = 19,975	N =9,175	N = 3,303	N = 5,872	N = 4,983	N = 1,728	N = 3,255	
$Mean \pm STD$	$16.21 \pm 11.22$	$16.90 \pm 10.22$	$15.82 \pm 11.72$	$14.20 \pm 18.03$	17.09 ±19.58	$12.57 \pm 16.87$	15.63 ± 19.91	$14.88 \pm 18.15$	16.03 ±20.77	
Median (Q1 – Q3)	14.63 (8.33 – 22.03)	15.63 (9.76 – 22.24)	$14.0 \\ (7.69 - 21.74)$	8.33 $(0-20.0)$	10.87 (2.63 -23.81)	6.90 $(0-18.52)$	9.32 $(0-20.72)$	10.00 (2.44 – 19.35)	9.09 (0 – 21.67)	
>50%	1.07%	0.74%	1.25%	5.21%	7.54%	3.90%	7.59%	5.96%	8.45%	
% of patients who received <b>high dose opioids</b> <sup>c</sup>	N = 31,147	N = 11,172	N = 19,975	N = 9,175	N = 3,303	N = 5,872	N = 4,983	N = 1,728	N = 3,255	
Mean $\pm$ STD	$0.83 \pm 2.66$	$0.82 \pm 2.00$	$0.83 \pm 2.96$	$0.99 \pm 3.51$	$1.13 \pm 3.40$	$0.91 \pm 3.57$	$1.21 \pm 4.72$	$1.28 \pm 5.12$	$1.17 \pm 4.50$	
Median $(Q1 - Q3)$	0 (0 - 0.48)	0(0-1.04)	0 (0 - 0)	0(0-0)	0(0-0)	0(0-0)	0(0-0)	0(0-0)	0(0-0)	
>10%	0.92%	0.52%	1.14%	2.32%	2.36%	2.30%	3.03%	2.95%	3.07%	
% of patients who received long-term opioids <sup>d</sup>	N = 30,939	N = 11,160	N = 19,779	N = 9,062	N = 3,294	N = 5,768	N = 4,941	N = 1,726	N = 3,215	
Mean $\pm$ STD	$4.43 \pm 6.33$	$4.88 \pm 5.32$	$4.18 \pm 6.83$	$3.16 \pm 7.79$	$3.54 \pm 8.02$	$2.94 \pm 7.65$	$2.94 \pm 8.27$	$3.25 \pm 8.89$	$2.77 \pm 7.91$	
Median	2.50 $(0-6.56)$	3.61 $(0-7.14)$	1.47 $(0-6.06)$	0 (0 – 3.23)	0 (0 – 3.70)	0 (0 – 2.86)	0 (0 – 2.44)	0(0-2.78)	0 (0 – 2.08)	
>20%	2.61%	1.82%	3.05%	3.41%	4.01%	3.07%	3.22%	3.59%	3.02%	

<sup>45 471 &</sup>lt;sup>a</sup>Based on Social Network Analysis, these primary care physicians were not affiliated with primary care practices. They may be primary care solo practitioners.

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bBased on Social Network Analysis, these NPs/PAs were not affiliated with primary care practices. They may be either specialist NPs/PAs or primary care solo practitioners.

<sup>50 474</sup> dProviders with at least 10 patients who completed Part D enrolment and were survived after 4/1/2015 in order to measure whether they received opioids for more than 90 days.

<sup>475</sup> MD, medical doctor; NP, nurse practitioner; PA, physician assistant; STD, standard deviation; Q, quartile

<sup>\*\*</sup> We identified primary care practice within each of the 20% randomly selected primary care service area (PCSA). A PCSA is an area defined by Dartmouth Atlas Healthcare for the measurement of primary care resources, utilization, and outcomes within small standardized areas based on zip codes.<sup>35</sup> We identified pairs of primary care providers in each PCSA who shared at least 30 patients, then used the Walktrap community finding algorithm to identify clusters of providers<sup>36-38</sup> in primary care practices.<sup>24-26</sup> Only clusters (primary care practices) in PCSAs with a modularity  $\geq$  0.4, indicating a densely connected network were selected.<sup>39</sup> This methodology had positive predictive value of 84.4% for identifying MD and NP/PA pairs and good agreement in identifying primary care practices in a validation study.<sup>40</sup>

**Supplemental Table 5:** Characteristics associated with high frequency, high dose, and long-term opioid prescribing by nurse practitioners (NPs) and physician assistants (PAs) to Medicare Part D enrollees in 2015, estimated from logistic regression models

	High frequency		]	High dose	Long-term		
		OR	95% CI	OR	95% CI	OR	95% CI
	No	1.00		1.00		1.00	
Regulations allow Schedule II prescription <sup>a</sup>	Yes	28.20	19.67-40.44	70.09	29.13-168.61	46.87	25.84-84.99
Patient Characteristic (every 10% increase)							
% Age older than 80 years		1.26	1.23-1.29	1.18	1.13-1.23	1.49	1.43-1.54
% Female		1.12	1.10-1.15	1.06	1.02-1.09	1.18	1.14-1.23
% Minority		0.86	0.84-0.88	0.84	0.81-0.86	0.87	0.85-0.90
% Original entitlement as disabled		1.62	1.58-1.66	1.98	1.91-2.06	2.54	2.44-2.63
% Medicaid eligible		0.95	0.93-0.97	0.81	0.79-0.84	0.83	0.80-0.85
% HMO enrollee		0.97	0.96-0.99	0.97	0.95-1.00	1.01	0.98-1.03
Rurality (1-unit increase)		0.82	0.80-0.83	0.79	0.77-0.82	0.94	0.92-0.97
PCP available per 10,000		1.01	1.01-1.02	1.02	1.01-1.03	0.98	0.97-0.99

<sup>&</sup>lt;sup>a</sup>States that do not allow NPs to prescribe Schedule II opioids: Alabama, Arkansas, Florida, Georgia, Missouri, Oklahoma, South Carolina, West Virginia

HMO: health maintenance organization; PCP: primary care physician

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States that do not allow PAs to prescribe Schedule II opioids: Alabama, Arkansas, Florida, Georgia, Iowa, Kentucky, Missouri, West Virginia.

**Supplemental Table 6**. Opioid prescription pattern by primary care providers, stratified by state regulation of NP/PA schedule II prescription authority (only for their patients who had Part A and B without HMO enrollment in 2014)

Primary care MD					rimary care NP		Primary care PA			
		state regulation allows NP and PA to prescribe schedule II opioid <sup>a,b</sup>			state regulation prescribe sched		state regulation allows PA to prescribe schedule II opioid <sup>b</sup>			
% of patients who received:	Total	Yes	No	Total	Yes	No	Total	Yes	No	
Any opioid	N = 127,985	N = 101,761	N = 26,224	N = 34,175	N = 28,632	N = 5,543	N = 19,569	N = 17,012	N = 2,557	
$Mean \pm STD$	17.50±12.63	$16.99 \pm 12.26$	19.49±13.81	15.05±20.0	17.20±20.91	$3.93 \pm 7.80$	$16.31 \pm 22.21$	$18.12 \pm 22.95$	$4.26\pm10.18$	
Median (Q1 – Q3)	15.79 (8.33 – 24.32)	15.38 (8.33 – 23.60)	17.50 (9.52 – 26.86)	8.33 $(0-20.83)$	10.34 (0 -23.53)	0 $(0-5.00)$	8.33 $(0-21.31)$	$10.00 \\ (0 - 23.53)$	$0 \\ (0-4.17)$	
>50%	1.68%	1.40%	2.76%	6.55%	7.79%	0.14%	9.03%	10.24%	1.00%	
High dose opioids <sup>c</sup>	N = 127,985	N = 101,761	N = 26,224	N = 34,175	N = 28,632	N = 5,543	N = 19,569	N = 17,012	N = 2,557	
$Mean \pm STD$	$0.94\pm2.94$	$0.94\pm2.86$	0.91±3.25	1.17±4.47	1.39±4.84	$0.03\pm0.52$	$1.28 \pm 4.97$	$1.45 \pm 5.30$	$0.10\pm1.04$	
Median (Q1 – Q3)	0 (0 - 0)	0 (0 - 0)	0 (0 - 0)	0 (0 – 0)	0 (0 – 0)	0(0-0)	0(0-0)	0(0-0)	0(0-0)	
>10%	1.23%	1.23%	1.24%	3.05%	3.63%	<0.20%	3.54%	4.03%	<0.43%	
Long-term opioids <sup>d</sup>	N = 127,680	N = 101,518	N = 26,162	N = 34,077	N = 28,549	N = 5,528	N = 19,531	N = 16,981	N = 2,550	
$Mean \pm STD$	5.27±7.36	5.04±6.99	6.14±8.61	3.74±9.49	4.35±10.21	$0.58\pm2.28$	$3.35 \pm 9.63$	$3.75\pm10.22$	$0.65 \pm 2.65$	
Median (Q1 – Q3)	3.03 $(0-7.94)$	2.90 (0 – 7.69)	3.45 (0 – 9.09)	0 $(0-3.57)$	0 $(0-4.76)$	$0 \\ (0-0)$	0 $(0-1.82)$	0 $(0-2.86)$	$0 \\ (0-0)$	
>20%	4.01%	3.48%	6.05%	4.50%	5.34%	<0.20%	4.20%	4.79%	<0.43%	

<sup>49 488</sup> a States which restricted NP authority to prescribe Schedule II opioids in 2015: Alabama, Arkansas, Florida, Georgia, Missouri, Oklahoma, South Carolina, West Virginia

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<sup>&</sup>lt;sup>b</sup>States which restricted PA authority to prescribe Schedule II opioids in 2015: Alabama, Arkansas, Florida, Georgia, Iowa, Kentucky, Missouri, West Virginia.

<sup>491 °</sup>Providers with at least 10 patients receiving any prescriptions in 2015.

<sup>&</sup>lt;sup>d</sup>Providers with at least 10 patients who completed Part D enrolment and were survived after 4/1/2015 in order to measure whether they received opioids for more than 90 days.

MD, medical doctor; NP, nurse practitioner; PA, physician assistant; Rx, prescriptions; STD, standard deviation; Q, quartile.

**Supplemental Table 7**: Characteristics associated with opioid overprescribing between types of provider within the same state, estimated from conditional logistic regression models (only for their patients who had Part A and B without HMO enrollment in 2014)

	High fi	equency	High dose		Long-term	
Type of provider	OR	95% CI	OR	95% CI	OR	95% CI
Primary care MD	1.00		1.00		1.00	
Primary care NP	2.26	2.11-2.41	1.29	1.17-1.41	0.51	0.48-0.55
Primary care PA	4.36	4.06-4.69	1.62	1.36-1.79	0.60	0.55-0.65
Patient Characteristic (every 10% increase)						
% Age older than 80	1.24	1.20-1.27	1.20	1.16-1.25	1.26	1.23-1.30
% Female	1.16	1.14-1.19	1.03	1.00-1.07	1.07	1.06-1.11
% Minority	0.94	0.93-0.96	0.92	0.90-0.95	0.95	0.93-0.96
% Original entitlement as disabled	1.86	1.82-1.91	2.22	2.14-2.29	2.10	2.05-2.15
% Medicaid eligible	0.94	0.92-0.96	0.78	0.76-0.80	0.92	0.90-0.94
% HMO enrollee	0.99	0.98-1.01	1.02	1.00-1.04	1.08	1.06-1.09
Rurality (1-unit increase)	0.93	0.91-0.95	0.92	0.90-0.94	1.07	1.06-1.09
PCP available per 10,000	1.01	1.00-1.01	1.02	1.01-1.02	0.98	0.97-0.98
% >=3 comorbidity	1.22	1.20-1.24	1.15	1.13-1.18	1.03	1.01-1.04

MD: medical doctor; NP: nurse practitioner; PA: physician assistant; HMO, health maintenance organization; PCP: primary care physician