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90 91		Table of Contents	
92	Abstract		
93	1. Introduction/Background		
94	2. Objectives		
95	3. Selection of Clinics and Subjects		
96	4. Registration Procedures		
97	5. Treatment Plan		
98	6. Measurement of Effect		
99	7. Study Parameters		
100	8. Statistical Considerations		
101	9. Records to be Kept		
102	10. References		

103

104 <u>Abstract</u>

The proposed study uses a sequential, multiple assignment randomized trial (SMART)^{1,2} to test an adaptive version of systems consultation³ consisting of academic detailing, practice facilitation, and physician peer coaching to increase the uptake of safer opioid prescribing practices at three levels of primary care (health system, clinic, prescriber). Academic detailing will be provided to all clinics and prescribers to inform prescribers on the goals of the study, the importance of improving opioid prescribing in primary care, and a review of the latest standards of prescribing guidelines. After three months, clinics will be randomized to receive nothing or receive practice facilitation where clinics will get an in-person or online visit and proceed with monthly teleconferences to improve clinic workflow related to opioid prescribing. Six months later, clinics will receive physician peer coaching that will employ two experienced addiction specialists who will provide guidance to prescribers dealing with tough patient panels. Additionally, this study aims to capture and analyze contextual factors that influence implementation in order to create a simple tool that will guide guality improvement in opioid prescribing. This SMART will deliver these three strategies to 40 primary care clinics from three health systems to compare the effect on average morphine milligram dose of an adaptive systems consultation implementation strategy compared to academic detailing alone over a 21 month time period. To our knowledge, this study would be the first to randomize at two levels to test the efficacy of the implementation of system consultation to improve opioid prescribing in primary care.

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IRB 2018-1276 Version 11, 8/31/2020 136 **<u>1. Background & Signifi</u>cance**

137 Importance of improving prescribing practices in primary care

Opioids are commonly prescribed in primary care to relieve chronic pain. Although potentially 138 effective for this purpose, accompanying burdens have become clear and widespread. In 2017, drug 139 overdose was the leading cause of accidental death in the United States. Although the volume of 140 opioids prescribed in the US declined each year from 2010 to 2015, about 3 times more opioids were 141 prescribed per person in 2015 as in 1999, and prescribing rates still vary greatly, with the highest-142 prescribing counties prescribing 6 times more opioids per person than the lowest-prescribing 143 counties.⁴ In 2015, 63.1% of drug-overdose deaths involved an opioid.⁵ and approximately half of 144 opioid-related deaths involved prescription opioids.⁶ About half of opioid prescriptions are written in 145 primary care.^{7,8} Clinical guidelines for opioid prescribing in primary care have been advanced, most 146 notably the guidelines issued by the Centers for Disease Control and Prevention in 2016.⁸ Clinical 147 guidelines have established consensus around a few basic ideas: (1) Physicians should discuss the 148 risks and benefits of opioid therapy with patients by reviewing and signing formal treatment 149 agreements before initiating the first opioid dose and throughout treatment.⁸ (2) Clinicians should 150 avoid prescribing opioids in doses higher than 90-100 morphine milligram equivalent (MME) daily; 151 evidence shows that patients with a dose of 100 MME or greater are 11 times more likely to die from 152 overdose than patients taking doses less than 20 MME.⁹⁻¹¹ (3) patients at increased risk for misuse 153 (i.e., those with mental health or substance use disorders) are more likely to receive opioid 154 prescriptions and higher doses; thus, screening for mental health and substance use disorders should 155 be in place.^{9,12-14} (4) Opioid-benzodiazepine co-prescribing in any combination of doses should be 156 avoided to reduce the risk of overdose.¹⁵ (5) Monitoring via urine drug testing should be instituted to 157 ensure appropriate use of opioid medications.¹⁶ 158

159 Strategies for implementing evidence-based practices

Despite the promotion of evidence-based practices (EBPs) related to opioid prescribing (and many 160 other conditions), the healthcare system is notoriously slow in adopting EBPs.¹⁷ Lau et al. conducted 161 a 2015 review¹⁸ of 91 studies aimed at determining the effectiveness of strategies for implementation 162 of complex interventions in primary care settings. The most commonly used strategies were targeted 163 at individual providers, generally demonstrating small to modest effects, with considerable variability 164 between studies. The authors found little use of implementation strategies targeted at organizations 165 or a wider context (e.g., health systems). Finally, the review found very limited data on the costs and 166 cost-effectiveness of different implementation strategies should be used under what conditions, and 167 that future research should study implementation strategies targeted at levels more broadly defined 168 than individual providers. According to a systematic review focused specifically on the role of external 169 change agents (e.g., coaches, facilitators, academic detailers, etc.) in primary care settings, the more 170 successful implementation strategies tended to be those that offered regular, context-specific follow-171 up.¹⁹ 172

173 Systems consultation

174 Systems consultation is a theoretically and empirically grounded,³ blended implementation

- strategy^{20,21} consisting of a bundle of 3 discrete strategies: (1) Academic detailing, in which an
- experienced physician provides recommendations and advice on how to improve clinical practice; (2)
- 177 Practice facilitation, a team-based advising approach designed to tailor implementation to specific

Version 11, 8/31/2020

- clinical contexts; and (3) Physician peer coaching, in which an experienced physician provides one-
- on-one clinical advice on managing patient panels to other physicians (who may be less experienced
 with the selected clinical issue). Several other discrete strategies are also integrated into the systems
- consultation model, as categorized by Powell et al.'s (2015)²⁰ taxonomy of implementation strategies,
- 182 including: use of community-academic partnership, where leaders from an academic medical center
- 183 work with community- based care clinics to improve the health of their communities; audit and
- 184 feedback, which consists of providing performance feedback to clinics; conducting local assessments
- to determine the need for implementation; and tailoring implementation strategies to address potential
- 186 barriers and facilitators.

187 Adapting implementation strategies to specific contexts

Primary care clinics vary in their opioid prescribing practices and in their capacity to carry out 188 implementation efforts. Clinics and prescribers are influenced by factors such as funding, regulations, 189 geography, and policies. These considerations suggest that strategies for implementing EBPs will 190 work differently in different clinics; moreover, different strategies might work best for different 191 prescribers, depending on the prescriber's patient panel, experience in prescribing opioids, and other 192 influences. Previous implementation research²² suggests that implementation strategies tailored to 193 specific clinics are the most effective, although evidence also suggests that the effect of tailoring 194 varies, and tends to be small to moderate.²³ The literature does not specify the most effective 195 approaches to adaptation or the cost-effectiveness of tailored strategies (compared with non-tailored 196 strategies).^{18,23} 197

198 2. Study Objectives

This study aims to understand the optimal sequencing and combination of implementation strategies 199 that specific types of clinics and prescribers need to adopt clinical guidelines for opioid prescribing. 200 The pragmatic goal is to give health systems a tool they can use to predict which clinics and 201 prescribers will benefit most from which sequence and combination of implementation strategies. The 202 bundle of strategies systems consultation consists of include academic detailing, practice facilitation, 203 and physician peer coaching. We propose to recruit 40 clinics and 152 prescribers from 2 health 204 systems for a sequential, multiple assignment randomized trial to receive academic detailing only, 205 academic detailing + practice facilitation, academic detailing + practice facilitation + physician peer 206 coaching, or academic detailing + physician peer coaching. We will use guantitative and gualitative 207 analyses to compare outcomes of sequences and combinations with data collected every 3 months 208 209 over the 21-month intervention period.

210 **Primary Aim:**

Compare the effect of an adaptive systems consultation implementation strategy vs. academic detailing alone on average morphine milligram equivalent dose over 21 months.

213 Secondary Aims:

• Develop an assessment of contextual factors that influence the effectiveness of different implementation strategies.

Version 11, 8/31/2020

- Test 4 moderators and assess other factors that affect implementation to use to predict which implementation strategies will be most effective in different settings.
 - Estimate the costs of delivering 4 different sequences and combinations of strategies, including the incremental cost effectiveness of adding facilitation and physician peer coaching.

220 Study Coordination

- The UW-Madison Implementation Science and Engineering Lab is the coordinating site for this study. The UW study coordinator will oversee all activities at the 40 clinics which include:
 - developing site specific recruitment and data collection processes that meet study objectives;
 - training site staff prior to the study on protocol procedures to maintain compliance with the protocol and human subjects regulation;
 - communicating with site staff via monthly correspondence to monitor progress, inform of protocol changes/distribute new version of protocol, and address unanticipated issues or challenges;
 - and manage all study data.

230231 3. Selection of Subjects

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- Patients are not the subject of the study. The subjects of study will be the clinic prescribers.
 Prescriber panel data will be aggregated to the clinic and prescriber levels. To be included in the
 aggregated, de-identified prescriber panel data, patients must:
- 236 1. have a primary care provider at the clinic;
- 2. prescriptions for opioid therapy for at least 3 consecutive months;
- 238 3. and no cancer diagnosis or reception of hospice care.
- Clinics: A total of 40 clinics will be recruited from primary care clinics of the two health systems: UW
 Health and Bellin Health. This protocol will detail the process at UW Health primary care clinics for
 which the HS IRB is the IRB of record. Bellin Health will follow similar procedures with oversight from
 the UW study coordinator.
- 243 Clinics will be eligible for the study if they:
- 1. are a primary care clinic (non-pediatric primary care, internal medicine, or family medicine);
 - 2. have not received the systems consultation intervention; and
- 3. do not explicitly prohibit initiating opioid therapy.
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- **Change team:** Up to 7 team members will be recruited and consented to participate in practice facilitation. Change teams include a change team leader (likely a clinic medical director or other clinician) and supporting clinic staff such as nurse practitioners, physician assistants, registered nurses, lab technicians, and medical assistants.
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- Prescribers: de-identified patient data will be aggregated at the level of the prescriber and clinic. In this context, prescribers will be known to the study team only by the code number assigned to them by HIP. Data will be obtained only from those clinicians who:
- 1. are primary care physicians or other providers with prescribing privileges;
- 2. are not temporary providers who do not manage stable panels or patients;

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259 4. Registration Procedures

260 Clinic Recruitment

The study team will discuss the study with health system leaders who gave letters of support and 261 identify clinics that may be interested in participating. The study team will present the study to 262 clinicians at an all-provider meeting to build awareness and inform clinics that this study is available 263 to join. Health care leaders will send an email on behalf of the study team to clinic medical directors of 264 the health system. The email will notify medical directors that research is being done at clinics of their 265 health system and instruct them how to opt-out if they wish to decline participation in the study and 266 future contact from the study team. The email will instruct medical directors to direct any questions 267 268 they have to the study team.

Medical directors who choose not to opt-out of the study will be invited via email to attend the regional 269 academic detailing meetings. Medical directors will be asked to forward the email to any clinic staff 270 who may be interested in participating in the academic detailing meeting. The email will instruct 271 interested medical directors and clinic staff to call the study team if they are interested in attending or 272 have any questions. Clinics will be asked to allow medical directors and interested clinic staff to 273 attend regional academic detailing meetings on clinic time where the study team will explain the study 274 objectives and participation expectations. Medical directors and clinicians will sign consent forms and 275 will be handed information sheets after the study is explained, but before further information about 276 opioid prescribing is presented. Those attending the academic detailing meeting via webinar will be 277 sent the consent form electronically and sign and return the consent form before the meeting. All 278 signed consent forms will be sent via email, fax, or postal service to the study team. Medical directors 279 will be assured that there is no obligation to participate in the study and that their decision is 280 voluntary. The study team will explain to medical directors that the clinic and clinicians can drop out 281 from study participation at any time and that their clinical practice will in no way be affected by their 282 choice to participate or not. 283

284 Staff Recruitment

Following the academic detailing meeting an email will be sent out to all clinic staff by the medical 285 director of behalf of the study team. The email will inform clinic staff that research may be conducted 286 at their clinic, what the research activities they may be asked to participate in include, and that they 287 should contact the study team if they have any questions. While clinicians have the opportunity to opt-288 out of individual-level activities, they still may be involved in the research by virtue of doing their jobs 289 in a clinic where the study is occurring. In a separate email the study team will provide the clinicians 290 who could not make the academic detailing meeting with a link to a webinar. The study team will ask 291 prescribers and clinicians who may participate on the change team who are interested in participating 292 in the study to watch the webinar and sign the consent form. All signed consent forms will be sent via 293 email, fax, or postal service to the study team. 294

The study team will call medical directors of clinics that have been randomized to receive practice facilitation to schedule the online or in-person clinic visit and ask the medical director to identify individuals who might be interested in participating on a change team. The medical director will

Version 11, 8/31/2020

identify an appropriate individual who might be interested in being a change team leader, and up to 5 298 299 additional clinicians to serve as change team members. At the online or in-person clinic visit the study team will provide change team members with a virtual or hard copy information sheet about practice 300 facilitation. The information sheet will inform change team members what is required of them and that 301 their participation is voluntary. The change team will be told that there is no obligation to participate 302 and that their clinical practice will in no way be affected by their choice to participate or not. The study 303 team will assure clinicians that they can take their time to think about their participation and may 304 leave the practice facilitation at any time. While most future meetings are anticipated to be virtual, any 305 face-to-face contacts with clinician subjects will take place at the regional meeting, in the clinician 306 subject's office or in a private room in the clinic at a convenient time for the clinician subject. Virtual 307 meetings will be held securely over WebEx. Online practice facilitation sessions will be recorded to 308 review for notes and accuracy. Notes will be kept securely on Box and recorded sessions will be 309 destroyed. 310

311 Consent

A request for a waiver of informed consent will be made for health system leaders and for clinic staff 312 in clinic-level interventions. The study team will ask health system leaders to send out an email on 313 behalf of the study team, informing medical directors about the research and the ability to opt-out of 314 future communication with the study team. Medical directors who do not opt-out by a specified date 315 on the email will be invited to the academic detailing meetings and have the ability to forward the 316 email to other interested clinicians. These subjects will sign consent forms and receive a study 317 318 information sheet at the academic detailing meeting. Those attending the meeting via webinar will be asked to read, sign, and return consent forms prior to the meeting. Webinar attendees will send the 319 signed consent form to the study team via email, fax, or mail. 320

After the academic detailing meetings, the medical director will send out an email on behalf of the study team to notify clinic employees that research may be done at their clinic and that they have the option to opt-out of the study activities. The study team will consent any prescriber and clinic staff who did not attend the academic detailing meeting, but wish to participate in the study via email. Prescribers will be sent an email with a link to the webinar of the academic detailing meeting and a consent form to read and sign. Prescribers will send the signed consent form to the study team via email, fax, or mail.

If participants decide to no longer participate in the study they will contact the PI, Andrew Quanbeck,
 to rescind their consent. Data that is already collected will be retained for analyses, but no further
 data of that participant will be provided to the study team.

A waiver of signed consent will be requested for qualitative interviews. Participants will be invited over email to participate in interviews. After a week, if the participant does not respond to the email the study team will call the participant to invite them to the study. The study team will call once. If there is no answer a new invite will be sent to a different participant. Participants who agree to be interviewed will be sent information sheets to read. This consent process is supplemental from the consent process participants went through at or before the educational meeting.

337 Randomization

Version 11, 8/31/2020

- Randomization will take place at the clinic level at month 3 (practice facilitation) and month 9
- (physician peer coaching). A research team member will conduct the randomization using the urnrandomization program.
- Randomization of clinics will take place at intervention month 3 on a 1:1 ratio to assign clinics that will receive practice facilitation plus academic detailing or academic detailing only. At intervention month 9 all clinics will be randomized on a 1:1 ratio to assign clinics who will receive the current intervention strategy plus physician peer coaching or continue the current intervention strategy for 12 months. Randomizations will be stratified on clinic's 1) health system, 2) number of patients, and 3) average MME being greater or equal to the health system's clinic average.

347 5. Intervention Plan

While the intervention plan is continuing as intended, due to the COVID-19 pandemic, study intervention activities were put on hold between March 25th and July 15th. Study activities have since resumed as intended.

351 Subjects will receive a combination of the following strategies:

Academic detailing. Clinicians from participating clinics will be invited to a regionally hosted, in-352 person training session where they will be provided lunch. The study team will also have a webinar 353 option (such as WebEx) for clinicians who cannot travel to the regional in-person meeting. The 354 session will be designed to both inform and engage clinic staff in the study. The session will be led by 355 Dr. Randall Brown and Jillian Landeck, who are experts in addiction medicine with extensive 356 experience managing the care of long-term opioid patients. Invitees will be medical directors and 357 prescribers (physicians, nurse practitioners, physician assistants), nurses, and staff directly involved 358 in clinic workflows related to opioid prescribing (e.g., medical assistants, lab techs, etc.). We will ask 359 each clinic to designate the clinic medical director to serve as contacts for the research team. The 360 training will cover the goals of the study, the importance of improving opioid prescribing in primary 361 care, a review of the latest standards of guidelines concordant care, how improvements in clinic 362 workflows can affect patient outcomes, clinical topics such as how to address opioid-induced 363 hyperalgesia and balancing patient-reported pain and function during dose reduction, and trainings on 364 how to use electronic medical records to monitor key opioid prescribing outcomes. An assessment 365 will be conducted during the session to elicit contextual characteristic that use the electronic health 366 record to monitor key opioid prescribing outcomes. The assessment will be a survey given at 367 meetings or online (for those joining via webinar)s. If clinicians are watching the academic detailing 368 meeting on their own or via webinar, they can take the survey on REDCap. At the conclusion of the 369 initial meeting, clinicians who attended the meeting will be asked to form change teams at their 370 clinics. 371

A quarterly hour-long academic detailing meeting will be hosted via webinar (such as WebEx) to provide clinics and clinicians further information about the CDC opioid prescribing guidelines. Quarterly webinar meetings will be separate for each study arm.

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Version 11, 8/31/2020

Following the academic detailing meeting, the health systems will create and deliver audit & feedback reports to clinicians. Health systems are already doing this and will customize the reports to fit the study. These reports will let clinicians know about their clinic's opioid prescribing metrics such as average MME, % of patients with urine drug testing, treatment agreements, and mental health screens, and % of patients co-prescribed benzodiazepines. Reports will only be at the clinic level.

Practice facilitation. Research staff trained in practice facilitation and/or study team members will 381 meet virtually with clinics using WebEx (or visit clinics in-person) and follow up over the course of up 382 to 5 monthly then 4 quarterly videoconferences or teleconferences to help clinics improve processes 383 related to opioid prescribing, such as ensuring that treatment agreements are signed by prescribers 384 and patients at least once a year, and integrating urine drug testing into clinic workflows. Clinic 385 medical directors will create change teams consisting of the clinic medical director and a physician 386 change leader and up to 5 clinic staff. The online or in-person visit will begin with a meeting with the 387 clinic medical director and the change team leader. At the meeting the facilitator will set a plan for the 388 389 day and answer any questions about the meeting. The facilitator will tour the clinic in-person or virtually over WebEx.²⁴ The facilitator will then meet (in-person or virtually) with the change team for 390 an hour to cover how to make workflow changes such as integrating treatment agreements and urine 391 392 drug tests into clinic processes. The change team will be educated about the nominal group technique²⁵ and Plan-Do-Study-Act cycles²⁶ (PDSA cycles) to select the area of improvement for the 393 first PDSA cycle. The practice facilitator will assist the change team in filling out the PDSA cycle and 394 the practice facilitator will enter the info into the Change cycle data table for reference for the follow-395 up conference call. Then the facilitator will debrief with the medical director and change team leader 396 to discuss the next steps for follow-up discussions. Over the next 18 months clinics will be able to call 397 in or meet over WebEx for up to 5 monthly, 60 minute-long meetings, followed by 4 guarterly hour-398 long follow-up discussions about the workflow changes. Sessions will be recorded using encrypted 399 audio recorders or WebEx's recording feature. Recordings will be used to ensure accurate note 400 taking. Recordings from audio recorders will be stored on the facilitator's password-protected 401 computer or laptop. Once note taking is completed the recordings will be destroyed. 402

Physician peer coaching. At UW Health, physician peer coaches will be Drs. Brown and Landeck. 403 At Bellin Health, physicians with relevant experience in opioid prescribing will be nominated by health 404 system leaders to become each systems' physician peer coaches. These coaches will become 405 members of the research team. Drs. Brown and Landeck help their peers manage their patients on 406 opioid therapy. Participating clinics randomized to physician peer coaching will receive up to 4 407 quarterly coaching sessions over 12 months. Physician peer coaches will provide help to prescribers 408 to assist with tough panels through up to four quarterly coaching sessions over 12 months. Coaching 409 consultations will occur in sessions via videoconference (WebEx) or teleconference. Participants 410 attending the physician peer coaching sessions will be asked to take a survey before each session to 411 let the coach know what topics the group needs help with. After each physician peer consulting 412 session, participants will be asked to complete a post-session survey to assess how the session was 413 received and how confident the participant feels about addressing the session topic with patients. 414 After the fourth and last session, participants in the physician peer consultation interventions will be 415 asked to take a final survey to evaluate how the intervention impacted their confidence and 416 experiences treating patients prescribed opioids for chronic pain, and feedback on the intervention 417 itself. 418

Data collection 419

Quantitative data. Evaluation data extracted from the electronic health records of patients on 420 prescriber panels will be constructed and delivered by the Health Innovation Program (HIP) on behalf 421 of the Wisconsin Collaborative for Healthcare Quality (WCHQ). All members of the collaborative 422 (including UW Health) and other specially invited members (Bellin) submit patient level data extracted 423 from health records to a central data repository (called RBS, or "Repository Based Data 424 Submission"), which HIP is able to access through their Business Associate agreement with WCHQ. 425 The electronic data from the WCHQ is accessed by HIP through a secure File Transfer Protocol 426 (FTP) site that is set up by WCHQ. An FTP is a secure way of moving data from WCHQ to an outside 427 organization such as HIP. Datasets for researchers are constructed from these identifiable datasets 428 that have been transformed into de-identified datasets by HIP Programmers, who are not part of the 429 study team. Patient-level data will be grouped by prescriber and clinic for this project, and prescribers 430 and clinics will be coded so that the Programmers are able to deliver longitudinal data at the 431 432 prescriber and clinic levels. The study team will not have access to a crosswalk or any other code that would allow re-identification of the de-identified dataset delivered by HIP to the research team. 433 Datasets will be extracted and delivered from the start of the intervention to the end of the 6-month 434 follow-up at intervention month 27. No sensitive information will be included in the analysis dataset. 435 No individual PHI will be collected in the course of this study. Only aggregate statistical output 436 representing groups of subjects will be released. 437

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Qualitative data. The study team will conduct two sets of semi-structured interviews (exact questions 439 will vary based on answers to other questions) using the UW sponsored HIPPA compliant WebEx. 440 Semi-structured interviews will be conducted with two change team leaders or their designees (a total 441 of 8 participants) selected randomly from each intervention group at each participating health system. 442 The interviews will take place at intervention month 18 to better understand what practice facilitation 443 activities were done at clinics, what worked and did not work, and feedback on the intervention. A 444 second set of semi-structured interviews will be conducted with one prescriber (a total of 8 445 participants) selected randomly from each intervention group at each participating health system. 446 These interviews will take place between intervention months 18-21 to better understand what peer 447 support activities were done at clinics, what worked and did not work, what prescribers find 448 problematic, how peer support groups helped prescribers address these issues, and feedback on the 449 intervention. Qualitative interviews will be recorded and transcribed for analysis using WebEx's 450 recording and transcription feature. All identifying information will be coded and transcripts will be 451 stored securely on a Box folder (no PHI will be uploaded to the Box folder). The recording will be 452 destroyed after it is transcribed. 453

454 Assessments. This study has developed a tailoring assessment based on pilot data to test 4 moderators (existence of an opioid prescribing policy at the system level, experience of quality 455 improvement at the clinic level, size of the clinic, and number of high dose patients) and assess other 456 factors that affect implementation through open and closed-ended questions. At 0, 5, 9, and 21 457 months assessments will be administered online (via REDCap) and online or in-person surveys. If in-458

Version 11, 8/31/2020

- person visits occur, participants will be asked to complete a hardcopy assessment. In-person
 assessment data will be entered into ICTR's REDCap.
- 461 *Detailed contact logs.* Research team members responsible for delivering the implementation 462 strategies will keep detailed logs of contact with clinics and prescribers to estimate measures of 463 adoption and implementation. All identifiable information will be de-identified by a research team 464 member.
- In the event that subjects (clinic or prescriber) choose to withdraw from the study, data that is already collected will be kept for analyses. No further data will be collected from that subject. If the clinic withdraws, all prescribers at that clinic will not have further data collected.
- 468 Physician peer consulting surveys

The study team will ask participants in the physician peer consulting intervention to take a pre- and 469 post-session survey for each session and a final, post-session survey using UW Madison's version of 470 Qualtrics. Surveys will ask questions about the topics prescribers want to discuss at the upcoming 471 consultation session, how confident they are in addressing the issues discussed at the past session, 472 and their experience with their consultant and the intervention. The surveys will only ask the 473 participant to provide their health system and clinic they practice at so the study team will know which 474 topics to discuss at each clinic's consulting session, understand how the consulting session was 475 receive, and make any adaptations to future consulting sessions. For this reason, health system and 476 clinic information will not be coded or de-identified. However, the research coordinator will code 477 health system and clinic for the analysis. 478

479 **Privacy and Confidentiality**

To mitigate the risk of breaches of confidentiality, all subjects and clinics will be assigned a code number. A list of subject and clinic code numbers will be maintained by a research team member and stored in a password-protected spreadsheet. This data will be kept on a secure, limited access, password-protected file service on ICTR's REDCap and UW's Qualtircs.

Potential Risks: This research is aimed at improving clinical practice related to opioid prescribing,
 and falls ultimately under the context of increasing patient safety. As such, the study team believes
 the risks to clinician subjects and individual patients are minimal, and the intervention will improve
 patient safety. The potential risks of participation are:

- Staff members could feel pressured to participate in the study. Opioid prescribing is a
 potentially controversial topic.
- Prescribers may be uncomfortable discussing their prescribing practices and may resist
 attempts to change clinical practice. To mitigate any perceived pressure to participate in the
 study, the research team will make it clear, through written materials and oral instructions, that
 staff participation in the research is completely voluntary.
- There could be a breach of confidentiality that could result in disclosure of research data
 outside the study team. To prevent this, all subjects will be assigned a code number. The lists
 will be kept in a locked file at HIP, and will not be shown to staff. Data collected will have the

Version 11, 8/31/2020

- 497 names removed and the code attached by a research team member. Project staff who have
 498 access to data will not have access to subject names.
- 499 We have taken the following measures to reduce potential risk to subjects:
- The primary units of analysis will be the clinic and prescribers; no staff members will ever be identified in presentations or publications.
- The research team will emphasize the idea that the current implementation study is intended to improve opioid prescribing practices.
- To address the risk of breach of confidentiality the research team will be provided only deidentified datasets and no individual provider will be able to be ascertained from these datasets
 nor will any member of the study team attempt to identify providers. Any qualitative data
 collected will be protected as well. Hard copy data will be kept in a locked cabinet and digital
 data will be stored on ICTR's REDCap.
- 509 UW-ICTR's Data Monitoring Committee.

This study will use UW-ICTR's Data Monitoring Committee. UW-ICTR has established a Data 510 Monitoring Committee (DMC) to provide a key resource for UW-Madison investigators conducting 511 clinical research. This DMC will provide investigators services to ensure appropriate measures are in 512 place to promote subject safety, research integrity and compliance with federal regulations and local 513 policies for individual clinical research protocols in need of DMC review (as determined by the 514 Principal Investigator (PI), the funding agency, the local Scientific Review Committee, or the local 515 IRB, and for which no DMC exists). For these studies, the UW ICTR DMC will be the primary data 516 and safety advisory group for the Principal Investigator. 517

The DMC is supported in its mission of safety and compliance by experienced ICTR staff to provide 518 administrative assistance, experienced members representing a diversity of backgrounds, skills and 519 knowledge, and the use of the Research Electronic Data Capture (REDCap) tool which provides data 520 management functionality by allowing the development of eCRFs and surveys to support data 521 capture. In providing oversight for the conduct of this study, the ICTR DMC will meet every 12 months 522 during the 5-year study. Additional meetings may be scheduled as determined by the DMC or as 523 requested by the PI. The DMC members will review protocol-specific reports created by statisticians 524 that serve a non-voting member role on the DMC using data pulled from REDCap. These standard 525 reports will include an overview of study objectives, a review of actual and projected accrual rates, an 526 evaluation of patient demographics for balance of randomization, and a summary of the number and 527 seriousness of adverse events. An interim analysis of study results may be performed and source 528 documents may be reviewed to allow the DMC to independently judge whether the overall integrity 529 and conduct of the protocol remain acceptable based on data provided and reported by the Principal 530 Investigator. The DMC will make recommendations to the Principal Investigator that could include 531 532 actions of continuation, modification, suspension, or termination.

533 This study may be temporarily suspended or prematurely terminated if there is sufficient reasonable 534 cause. Written notification, documenting the reason for study suspension or termination, will be 535 provided by the suspending or terminating party to The National Institute on Drug Abuse. If the study

Version 11, 8/31/2020

- is prematurely terminated or suspended, the PI will promptly inform the IRB and will provide the
- 537 reason(s) for the termination or suspension.
- 538 Circumstances that may warrant termination or suspension include, but are not limited to:
- Determination of unexpected, significant, or unacceptable risk to subjects
- Demonstration of efficacy that would warrant stopping
- Insufficient compliance to protocol requirements
- Data that are not sufficiently complete and/or evaluable
- 543 Determination of futility
- 544
- 545 Study may resume once concerns about safety, protocol compliance, or data quality are addressed 546 and satisfy the applicable federal and institutional regulatory authorities.

547 6. Measurement of Effect

- 548 This proposal uses the Reach, Effectiveness, Adoption, Implementation, and Maintenance (RE-AIM)
- 549 model as an organizing evaluation framework²⁷ to examine the quality, speed, and impact of
- 550 implementing the adaptive system consultation strategies. RE-AIM is a comprehensive evaluation
- 551 framework that assesses implementation in five dimensions. While RE-AIM has been used to
- evaluate many diseases of fidelity.²⁸ Specific measures for each RE-AIM dimension are presented in Table 1.

554 7. Study Parameters

Table 1 Outcome measure by RE-AIM category				
Domain	Source	Pertains to	Months*	
		aim:	collected	
Reach: # and % of patients excluded vs. participating (incl. characteristics)	EHR	PA, SA1	1-21	
Effectiveness: Overall rate of opioid prescribing and average MME per clinic	EHR	PA	1-21	
and provider				
# and % of patients completing urine drug testing (past 12 mo.)	EHR	PA	1-21	
# and % of patients screened for mental health using PHQ-2 (past 12 mo.)	EHR	PA	1-21	
Mental health (PHQ-9) scores for patients screening positive on PHQ-2 (past 12	EHR	PA	1-21	
mo.)				
Overall rate and dose of opioid-benzodiazepine co-prescribing	EHR	PA	1-21	
# and % of patients with treatment agreements (past 12 mo.)	EHR	PA	1-21	
# and % of opioid prescriptions above 90 MME	EHR	PA, SA1	1-21	
Patient attendance at scheduled clinic visits	EHR	PA, SA2	1-21	
# and % of patients prescribed buprenorphine	EHR	PA	1-21	
# and % of patients with PEG-3 score (past 12 mo.)	EHR	PA	1-21	
PEG-3 scores (past 12 mo.)	EHR	PA	1-21	
Adoption (setting): # and % of participating clinics vs. all clinics (incl.		SA1	1-21	
characteristics)				
Adoption (staff): # and % of participating staff vs. all eligible clinic staff (incl.		SA1	1-21	
characteristics)				
Clinician attendance at intervention meetings	RT	SA1	1-21	
Implementation: Hours of intervention received per clinic & prescriber	RT	SA1	1-21	
Adaptations made to protocols during intervention period	RT	SA1	1-21	
Assessment of 4 moderators: system-level opioid prescribing policy, clinic-level	RT;	SA1	0, 5, 9, 21	
experience in QI, size of clinic (# patients), # and % of patients on opioid doses				
> 90 MME				
Qualitative assessment of mechanisms of action & factors influencing	RT	SA1	1-21	
implementation				
Cost of each different implementation sequence & combination	RT	SA2	1-21	

IRB 2018-1276 Version 11, 8/31/2020 Maintenance: 6-mo. Follow-up on all effectiveness outcomes EHR All aims 22-27 *Months correspond to intervention months PA: Primary aim; SA1, Secondary aim 1; SA2, Secondary aim 2; RT: Research team; HS: Health system; EHR: Electronic health record

555 Clinics will be randomized on a 1:1 ratio to either receive practice facilitation plus academic detailing 556 or academic detailing alone at month 3. At month 9, all clinics will be randomized on a 1:1 ratio to 557 either continue the current intervention or add physician peer coaching to the bundle of strategies. It 558 is anticipated that up to 152 prescribers will be recruited from 40 primary care clinics among 2 559 healthcare systems. The intervention will last for 21 months followed by a 6 month follow-up period.

560 8. Statistical Considerations

561 Research Design

Analyses will be conducted at two levels, (1) at the clinic level and (2) at the prescriber level. UW Health and Bellin Health primary care clinics will be recruited for participation in the intervention and data collection activities. All clinics and all prescribers within clinics, once randomized, will be included in the intent-to-treat sample. The primary research outcome is morphine milligram equivalent (MME) and will be available for all prescribers within all clinics that consent, regardless of intervention engagement or drop-out.

568 This study will use a sequential, multiple assignment randomized trial (SMART), which is a factorial 569 design (see Figure 1).^{1,2} This SMART has 4 implementation strategies embedded within it.



IRB 2018-1276 Version 11, 8/31/2020 571 **Quantitative data collection and analysis**

572 Data are available for many study measures, allowing for time-series analysis of repeated measures 573 to detect changes in a clinic over time (pre-intervention vs. post-intervention). Clinics and prescribers 574 will be compared to clinics and prescribers receiving only academic detailing by accessing measures 575 through the Wisconsin Collaborative Healthcare Quality system-wide data warehouse at Health 576 Innovation Program (HIP). Programmers and compliance officers at HIP will prepare a de-identified 577 dataset analysis purposes by the study statistician. The dataset will remain on HIP's secure data 578 servers at all times.

The quantitative analysis of data from the electronic health record (EHR) will focus primarily on average daily morphine milligram equivalent for chronic pain patients at the clinic and prescriber levels. Changes in outcomes will be assessed through repeated monthly observations assessed retrospectively post-intervention. Data will be collected every three months throughout the 21 month intervention and 6 month follow-up period.

The study team will analyze the de-identified dataset delivered by HIP for evaluation purposes. The research team will not have access to any individual patient data or PHI. Prescriber identities will be protected; identifying information (such as staff names) will be replaced with code numbers by the HIP Programmers. The de-identified dataset will be coded by prescriber and clinic and the code key will be kept by HIP Programmers and not provided to the study team.

589 Due to delays in the data delivery from the Wisconsin Collaborative Healthcare Quality the research 590 team will also receive and analyze data that the UW Clinical Research Data Services (CRDS) 591 provides for the clinic feedback reports. The purpose for this is to speed up data analysis. CRDS will 592 act as an honest broker and will not provide the research team with patient-level identifiable data. 593 CRDS will provide data to the research team through ICTR REDCap's file repository feature.

594 Qualitative data collection and analysis

595 Interviews over WebEx for practice facilitation and physician peer coaching will be recorded and 596 transcribed. Subjects will be reminded that calls are recorded. The recordings will be transcribed and 597 coded by the study team. Qualitative analyses will be done using Nvivo.

598 Qualitative assessments will be conducted to assess contextual factors of systems consultation. 599 These assessments will be coded to group data at the clinic level for analysis and take place at 600 months 0, 5, 9, and 21 of the intervention.

601 Qualitative data will be collected via REDCap at the prescriber levels will be stored REDCap for 602 analysis purposes. Any publication that results from the study data will not include the names of 603 clinics or staff members where data were collected. All other results will be presented in anonymous 604 aggregated form.

605 **Statistical analysis**

Version 11, 8/31/2020

- 606 Statistical analysis will be conducted by Daniel Almirall at the University of Michigan. Dr. Almirall will 607 be provided a secure, remote login to the password-protected servers at the Health Innovation
- 608 Program to access the de-identified datasets.

The analysis will use a longitudinal (repeated-measures) analysis. Time will be coded such that t=0 609 denotes month 3 of the intervention period (the initial randomization): in the following text, data 610 collected prior to *t*=0 is considered baseline data (including the MME prior to month 3). The primary 611 outcome (MME) is a continuous measure and is collected at t=0 (at month 3, prior to randomization) 612 and every 3 months up to t=18 (intervention month 21) for a total of 7 measurement occasions. (Note 613 that the primary outcome is clustered: repeated measures, within prescribers, within clinics.) 614 Longitudinal regression models, adapted for the analysis of a longitudinal SMART^{29,30} and further 615 extended for use with data arising from a cluster-randomized SMART,³¹ will be used to contrast the 4 616 sequences and combinations of implementation strategies in terms of the average change in MME. 617

A piecewise-linear model with a knot at t=6 (MME collected immediately before the second randomization at intervention month 9) will be used to model the temporal trajectories over the course of months 10-21. The model the study plans to use has a linear trend from t=0 to t=3 for prescribers in academic detailing plus practice facilitation and academic detailing only clinics, and a linear trend from t=3 to month t=18 for each of the 4 sequences and combinations of implementation strategies. We allow for changes in the mean trajectory (i.e., deflections) at intervention month 9 (t=6) since this is the point at which prescribers may begin receiving physician peer coaching.

625 Cost analysis

This study will estimate the cost of delivering the four different sequences and combinations of 626 strategies, including incremental cost effectiveness of adding practice facilitation and physician peer 627 coaching. Methods and instruments used for cost data collection in the Systems Consultation R34³ 628 will be used. Detailed logs of call contacts between members of the research team and the clinic 629 change teams will be kept to estimate the number of hours spent delivering the implementation 630 strategy. The consultants will document the date and duration of each contact they have with clinic 631 staff members, role of the staff member, and a summary of topics discussed. Cost estimates of the 632 intervention will be calculated by multiplying hourly wage rates for physician peer coaches and 633 practice facilitators. Costs for non-personnel may include travel to site visits, the cost of 634 teleconferencing services for follow-up calls, etc. 635

636 Power

The estimated sample size for this study is based on the primary aim: a comparison on change in morphine milligram equivalent (MME) between implementation sequences of all three strategies vs. academic detailing only. Based on the pilot data, the inter-clinic correlation coefficient was 0.14. Assuming the average prescribers per clinic is 4, a type-1 error rate of 5%, and an early adoption rate of 50% gives a total of 40 primary care clinics at 80% power to detect an effect size of d=0.66 between the two implementation sequences on change in MME. In the pilot data we found a standard deviation of 35 MME, which is estimated to detect differences on MME as small as 18 MME.

646

645

Data to be collected	Storage	Type of Data
Clinician subject intake	REDCap/ Locked cabinet	Coded
Clinician subject demographics	REDCap/ Locked cabinet	Coded
Qualitative assessment data	REDCap/ Locked cabinet	Coded
Prescriber consent form	REDCap/ Locked cabinet	Coded
Systems consultation coaching	Box folder/ Locked cabinet	Coded
log		
De-identified patient electronic	HIP	De-identified
health record data		
Practice facilitation notes	Box folder	Coded
Audio recordings from PF/PPC	Facilitator computer/laptop	Recording
sessions	(audio) or WebEx cloud	
	storage (video)	
Audio recordings from	WebEx secure cloud	Recording
interviews	storage	
Transcriptions of interviews	Box folder	De-identified
Physician peer consulting	UW Qualtrics	Coded
survey		

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648 **<u>10. References</u>**

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