



AGENCY FOR HEALTHCARE RESEARCH AND QUALITY



June 2021 CDS Connect Work Group Call



CDS Connect

Meeting Agenda

Schedule	Topic
3:00 - 3:02	<ul style="list-style-type: none">Roll Call, Michelle Lenox (MITRE)
3:02 - 3:05	<ul style="list-style-type: none">Review of the Agenda, Maria Michaels (CDC)
3:05 - 3:50	<ul style="list-style-type: none">Using CDS to Reduce Harm From Drug-Drug Interactions: Case Study of Warfarin and Non-Steroidal Anti-inflammatory Drugs (University of Pittsburgh; University of Utah)
3:50 - 3:55	<ul style="list-style-type: none">What's New with CDS Connect This Month (MITRE)
3:55 - 4:00	Open Discussion and Close Out, Maria Michaels (CDC) <ul style="list-style-type: none">Open discussion and announcementsConcluding comments, review next steps and adjourn

Objectives

- Share lessons learned on development of CDS
- Share new features and resources available for CDS Connect
- Discuss topics of interest to members relating to opportunities for CDS Connect, including launch of patient partnering panel

SHARING LESSONS LEARNED WITH CDS - Using CDS to Reduce Harm From Drug-Drug Interactions: Case Study of Warfarin and Non-Steroidal Anti-Inflammatory Drugs (NSAIDs)

Richard Boyce, University of Pittsburgh
Dan Malone, University of Utah

Disclosures

Rich Boyce: Neither myself or my spouse have any relevant financial relationships with commercial interests

Dan Malone: Neither myself or my spouse have any relevant financial relationships with commercial interests

Outline

- The use case:
Contextualized drug-drug interaction clinical decision support
- Authoring structured potential drug-drug interaction CDS
- Shared decision making via DDInteract™
- Discussion

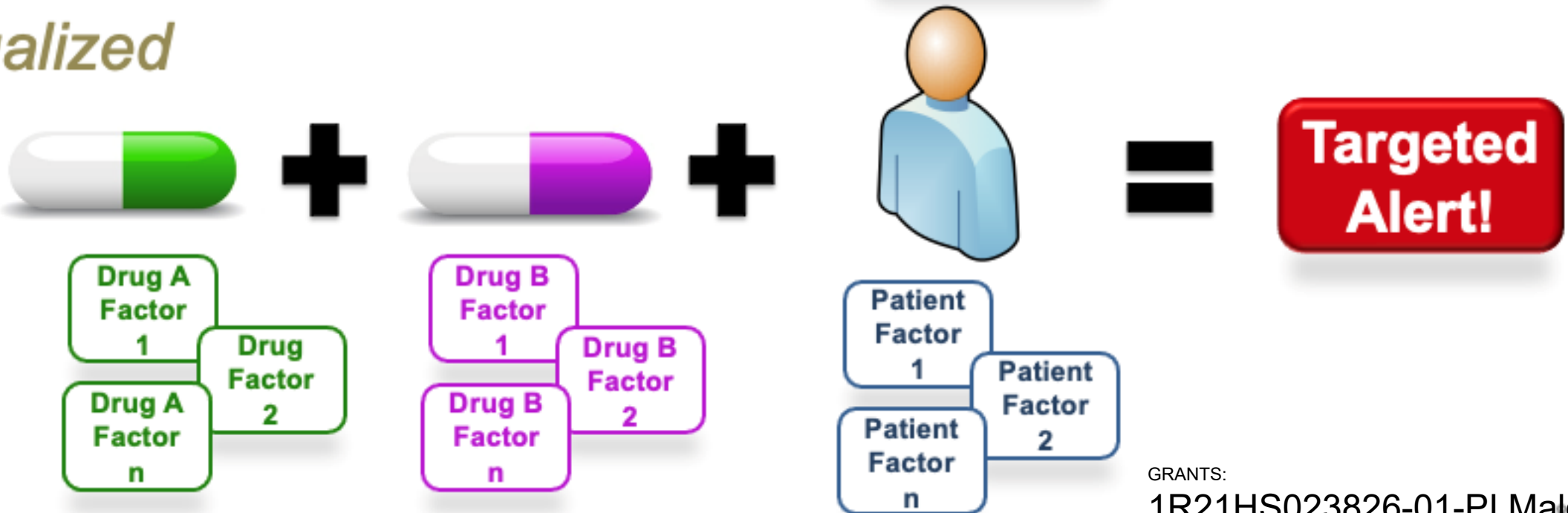
The Use Case: Contextualized Drug-Drug Interaction Clinical Decision Support

The Use Case: Contextualized drug-drug interaction CDS

*Conventional
Alerts:*



*Individualized
Alerts:*



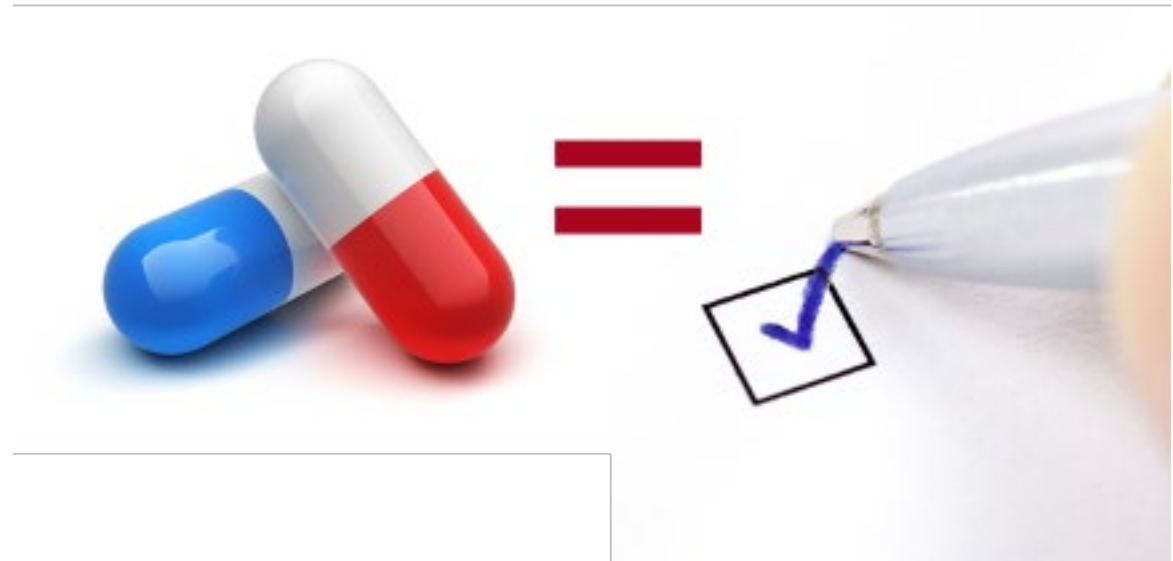
GRANTS:

1R21HS023826-01-PI Malone

1R01HS025984-01-PI Malone

Potential drug-drug interactions (PDDIs)

- Exposure to two or more drugs that are known to interact
 - ▶ “Potential” because exposure does not necessarily mean a clinically meaningful effect
 - Co-prescription or co-administration of drugs known to interact, regardless of whether harm ensues



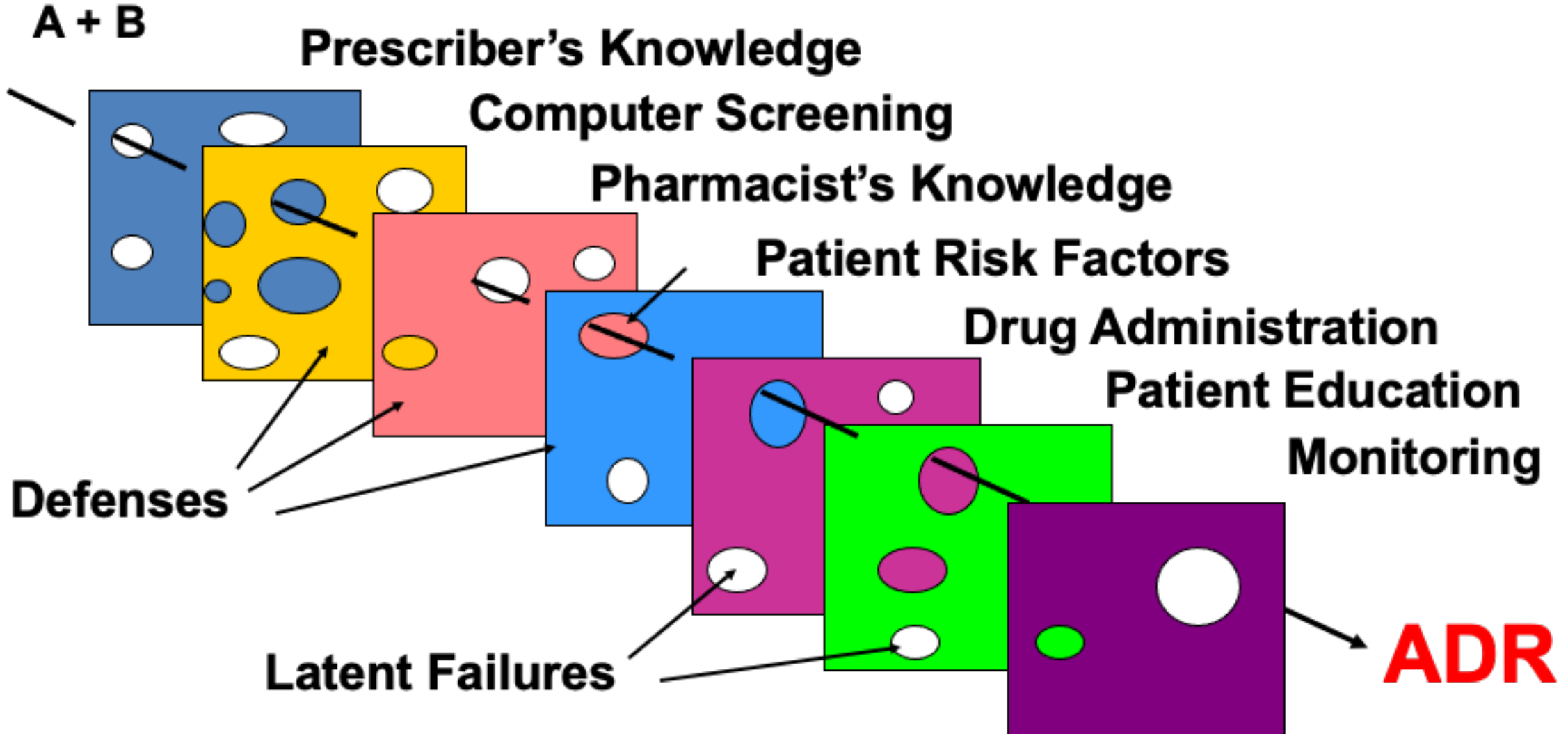
Clues About the Frequency of Harm

- Clinically important events attributable to drug-drug interactions:¹
 - ▶ 5.3% – 14.3% of inpatients
 - ▶ 231,000 US emergency department visits
- Hospital admissions associated with an adverse drug event attributable to drug-drug interactions:²
 - ▶ 22.2% (interquartile range 16.6% – 36.0%)

¹ Magro L, Moretti U, Leone R. Epidemiology and characteristics of adverse drug reactions caused by drug-drug interactions. *Expert Opin Drug Saf.* 2012;11(1):83-94. doi:10.1517/14740338.2012.631910

² Dechanont S, Maphanta S, Butthum B, Kongkaew C. Hospital admissions/visits associated with drug-drug interactions: a systematic review and meta-analysis. *Pharmacoepidemiol Drug Saf.* 2014;23(5):489-497. doi:10.1002/pds.3592.

“When the Holes Line Up”



Hansten PD, Horn JR. Modified from: James Reason, Human Error, 1990

Prescribers' PDDI Knowledge



Prescriber knowledge is often lacking

- 12,500 United States prescribers correctly identified 42.7% of 14 drug pairs¹
- 281 Iranian medical residents correctly classified only 41% (5.7/14) of 14 drug pairs²
- Mean number of correct responses from 244 Turkish physicians regarding the clinical significance of the 7 COVID-19 therapy related DDIs was 2.04 (± 1.31)³

¹ Ko et al. *Drug Saf.* 2008;31(6):525 – 536.

² Nabovati et al. *International journal of clinical pharmacy* 39.3 (2017): 560 – 568.

³ Sürmelioglu et al. *Postgraduate Medicine* (2020): 1 – 5.

Does CDS Work?

Systems that provide PDDI alerts at the point of care often alert to PDDIs that have little potential clinical significance

- **Frustrating clinicians:** Clinicians override up to 90% of potential DDI alerts, primarily because clinicians do not consider the alerts to be relevant.
- **Can lead to inappropriate responses:** 87.3% of high-priority alerts were overridden in a 1-year sample of inpatient and outpatient data from a large academic health system; less than half (45.4%) of the overrides were considered appropriate

Key Point



PDDI clinical decision support is currently sensitive but not precise; alerts are more effective when they consider the specific patient context

- Daniels *et al.*¹ observed a reduction in the override rate from 93.9% to 46.8% after making nearly a third (30.2%) of DDI alerts more contextual and suppressing another 16.5% of alerts.

¹ Daniels CC, Burlison JD, Baker DK, et al. Optimizing Drug-Drug Interaction Alerts Using a Multidimensional Approach. *Pediatrics*. 2019;143(3). doi:10.1542/peds.2017-4111

What Does a Contextualized PDDI Algorithm Look Like?

- See the CDS Connect Repository
 - ▶ Warfarin – NSAIDS:
<https://cds.ahrq.gov/cdsconnect/artifact/contextual-drug-interaction-decision-support-algorithm-warfarin-nonsteroidal>
 - ▶ Warfarin – antidepressants:
<https://cds.ahrq.gov/cdsconnect/artifact/contextual-drug-interaction-decision-support-algorithm-warfarin-antidepressants>
- Others in the process of release to CDS Connect
 - ▶ ddi-cds.org

Authoring Structured PDDI CDS

CDS Hooks in the Prescribing Workflow

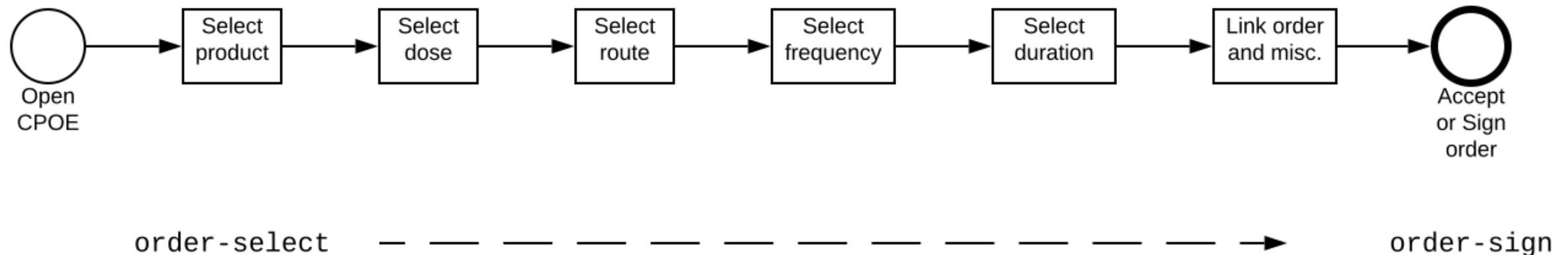
- Patient-view hook
 - ▶ Clinician
 - ▶ Shared decision making
- Order-select, order-sign hooks
 - ▶ Clinician

Patient View

- Short card summary of PDDIs
 - ▶ Can be actionable from the card
- SMART App link
 - ▶ Many PDDI situations require clinician input to arrive at the appropriate action
 - ▶ Shared decision making

Order-Select/Order-Sign

- Clinician-facing CDS
 - ▶ Order-select
 - Early in the prescribing workflow
 - Less cognitive burden than at order-sign?
 - ▶ Order-sign
 - Last step in the prescribing workflow



Additional Requirements?

- Ability to test the rules
 - ▶ Retrospectively
 - ▶ Prospectively
- Simple to author
 - ▶ Most authors are not knowledgeable about FHIR and need some help to pick the correct resources

Authoring PDDI CDS Rules (1/5)



<https://authoring.ddi-cds.org/authoring/>

PATIENT-CENTERED OUTCOMES RESEARCH

demo

Drug-Drug Interaction Clinical Decision Support Authoring

Home

Artifacts

Workspace

Runs

Testing

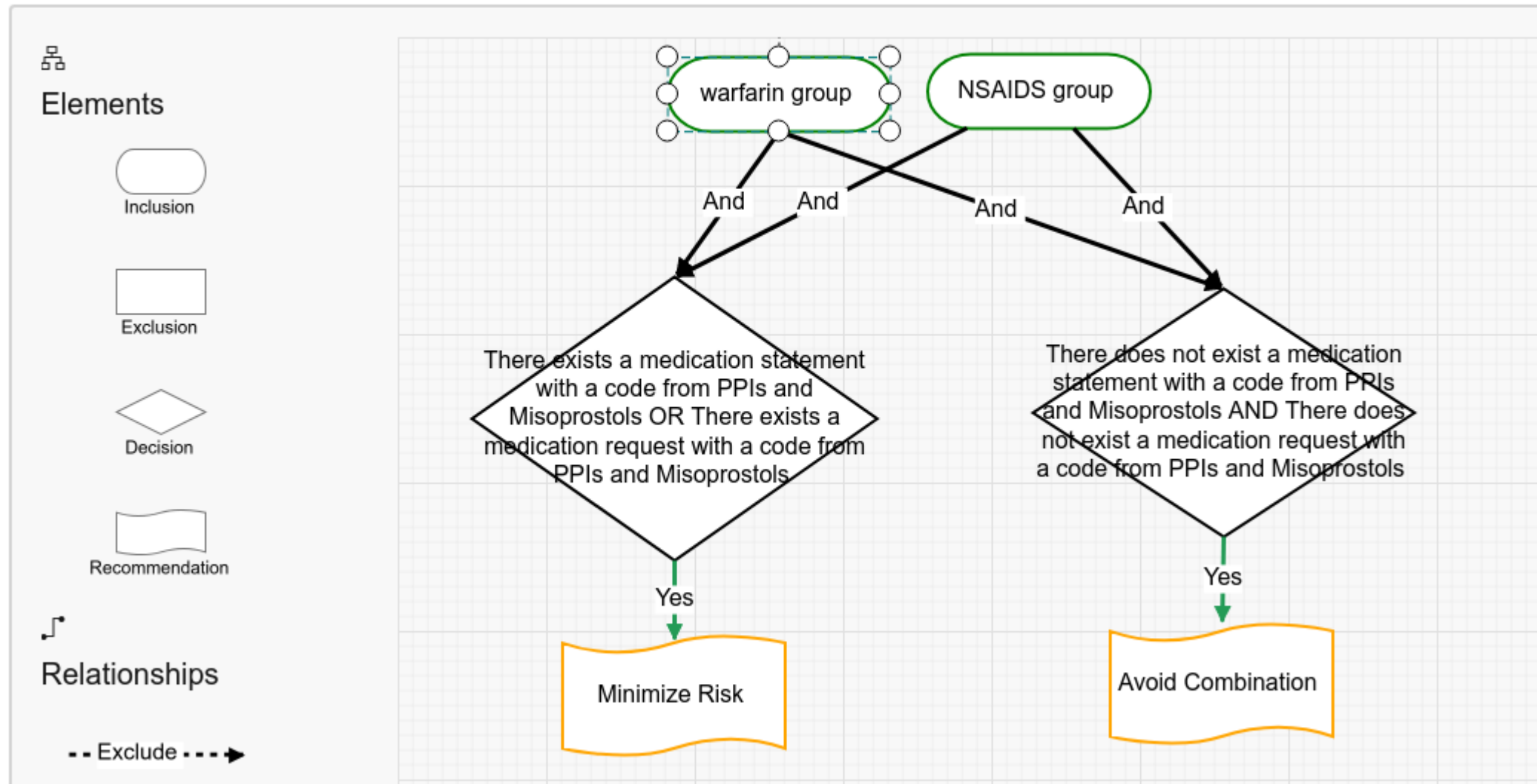
Documentation

+ CREATE NEW ARTIFACT

ARTIFACT NAME	VERSION	LAST UPDATED		
warfarin - NSAIDS	1.0	a few seconds ago	<div><div></div>EDIT INFO</div>	<div><div></div>DELETE</div>
Colchine - CYP3A4 inhibitors	1	2 days ago	<div><div></div>EDIT INFO</div>	<div><div></div>DELETE</div>

Authoring PDDI CDS Rules (2/5)

Build a decision diagram.







Authoring PDDI CDS Rules (3/5)

PATIENT-CENTERED OUTCOMES RESEARCH demo

Drug-Drug Interaction Clinical Decision Support Authoring

Home Artifacts **Workspace** Runs Testing Documentation

 warfarin - NSAIDS

 DOWNLOAD CQL  SAVE  RUN RULE


Last saved Wednesday, May 26th 2021, 1:44:14 pm.

Run Rule Configuration ×

FHIR server configuration

☒ Run rule using our FHIR server and synthetic data

☐ Specify your own FHIR server configuration

Run rule over period: Start date  — End date 

NEXT

Authoring PDDI CDS rules (4/5)

Run Rule Configuration

×

Define the following fields for the Plan Definition

Topic Text*:

Related Artifact Type:

Related Artifact Display*:

Related Artifact URL*:





☐ Is this a SMART App Launch URL?

Select the recommendations to be used in the Plan Definition

☐ Assess risk and take action if necessary ☐ Use only if benefit outweighs risk

RUN RULE

Authoring PDDI CDS rules (5/5)

Warfarin - NSAIDs	Alerts 6/1/2021 - 6/3/2021	
	Patients	 15
	Total	 12
	Minimize Risk	 6
	Avoid Combination	 2

Warfarin - NSAIDs	Alerts 6/1/2021 - 6/3/2021	
	Patient 1	Minimize Risk
	Patient 2	Avoid Combination
	Patient 3	No alert

Shared Decision Making via DDInteract™

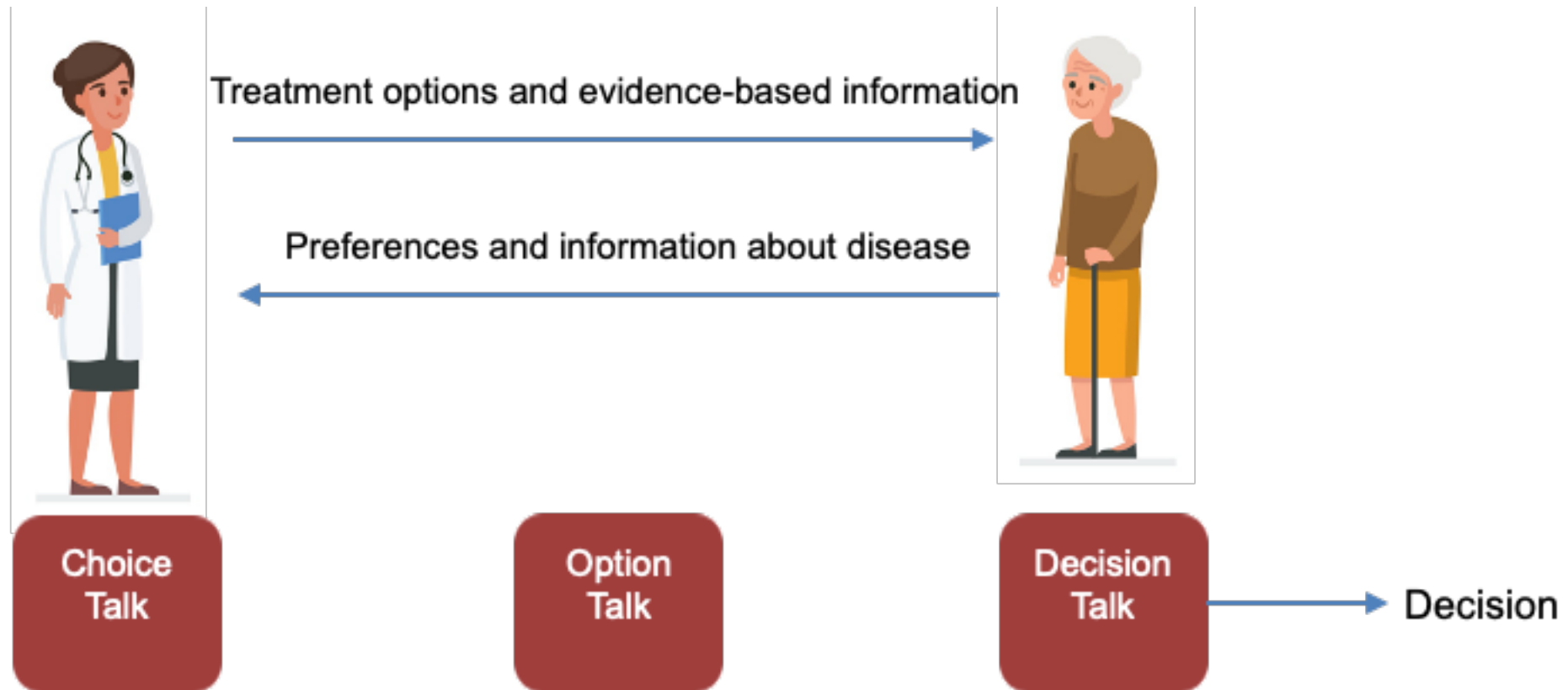
Shared Decision Making with DDIs

- DDInteract
 - ▶ Novel SDM app to improve clinician and patient understanding of risk of harm due to exposure to select potential DDIs.

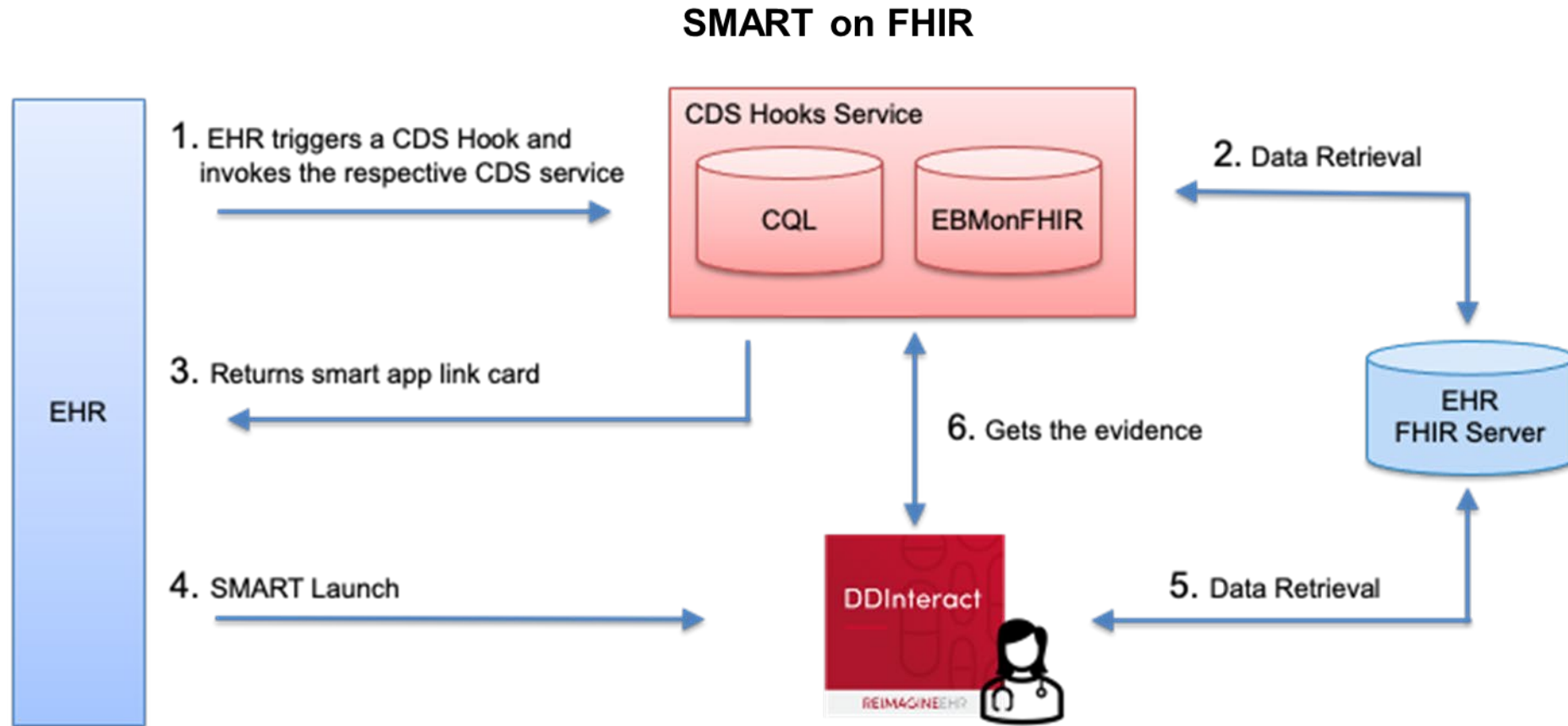


Shared Decision Making




Occurs when a healthcare provider and a patient work together to make a care decision that is best for the patient.



Theoretical Connectivity



Overall View

 Increased risk of gastrointestinal bleed – warfarin-NSAID interaction

Risk Profile for Patient

Major Risk Factors

☒ On warfarin
warfarin (03/28/2021)

☒ Older than 65

☐ On aspirin

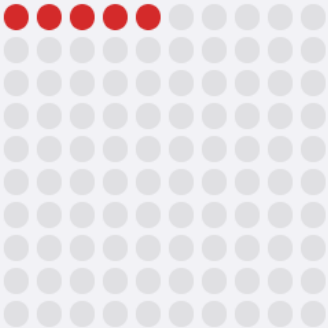
☐ Previous gastrointestinal bleed

☐ On clopidogrel

☐ On Selective Serotonin Reuptake Inhibitor


☐ On systemic corticosteroid

Estimated Gastrointestinal Bleeds (100 patients)



5 potential bleeds with this Risk Profile


Points for **shared decision-making** discussion:





- Goal is to reduce pain AND risk of stomach bleeding
- Options have different benefits and risks
- Best option may depend on the patient's preferences
- Summarize the decision and plan for follow up

Answer these questions to help the patient decide:

How do you prefer to treat your pain?

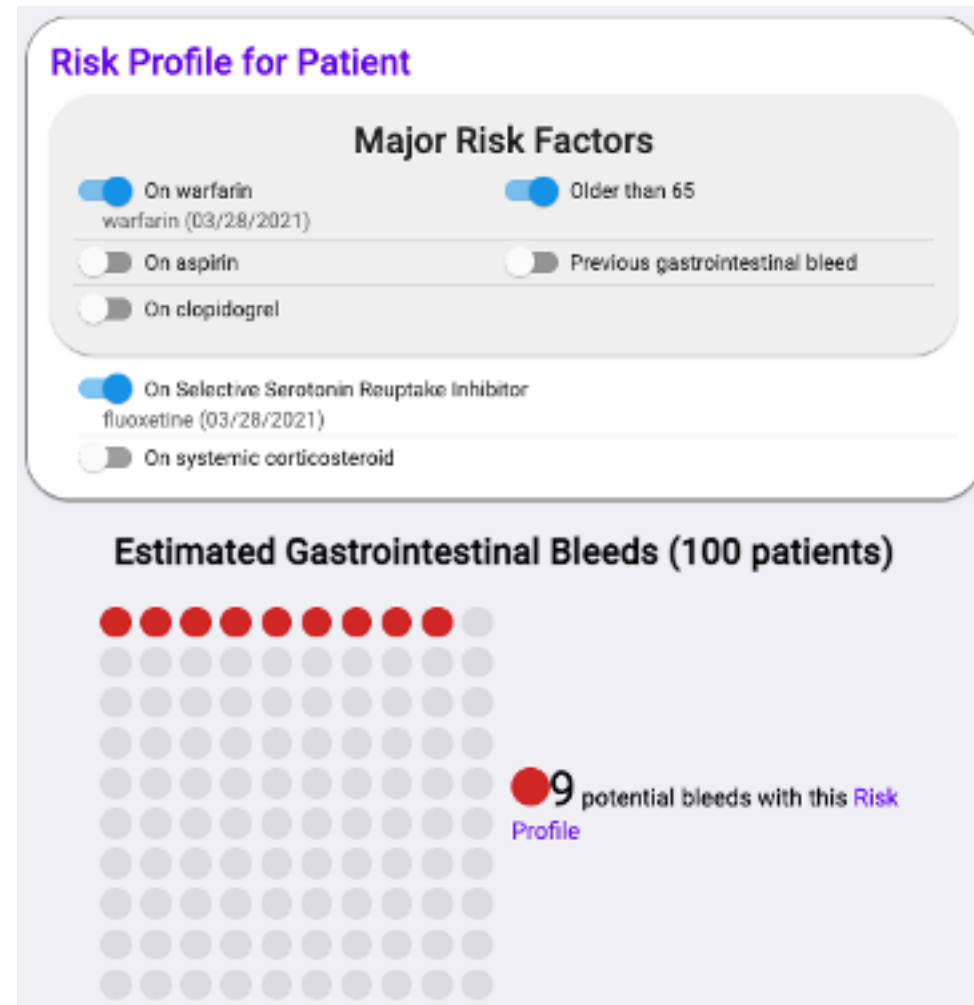
What is a drug-drug interaction?

What is a gastrointestinal bleed?

Evidence

Design

Primary Information Tab



Patient Risk
Factors

Visual Display of
Patient Risk

Shared Decision Making Attributes (1/2)



Points for **shared decision-making** discussion:

- Goal is to reduce pain AND risk of stomach bleeding
- Options have different benefits and risks
- Best option may depend on the patient's preferences
- Summarize the decision and plan for follow up

Answer these questions to help the patient decide:

How do you prefer to treat your pain?

Medication

Non-medication

Shared Decision Making Attributes (2/2)



Points for **shared decision-making** discussion:

- Goal is to reduce pain AND risk of stomach bleeding
- Options have different benefits and risks
- Best option may depend on the patient's preferences
- Summarize the decision and plan for follow up

Answer these questions to help the patient decide:

How do you prefer to treat your pain?

Medication

Non-medication

What type of pain medication do you prefer?

Oral NSAID

Other-medication

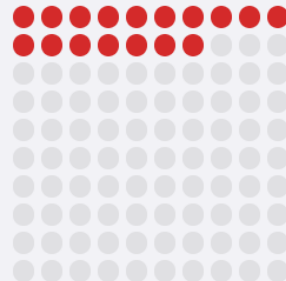
Shared Decision Making Screenshot

Risk Profile for Patient

Major Risk Factors

- ☒ On warfarin
warfarin (03/28/2021)
- ☒ Older than 65
- ☐ On aspirin
- ☐ Previous gastrointestinal bleed
- ☐ On clopidogrel
- ☐ On Selective Serotonin Reuptake Inhibitor
- ☐ On systemic corticosteroid

Estimated Gastrointestinal Bleeds (100 patients)



17 potential bleeds with this
Risk Profile and ibuprofen

Points for **shared decision-making** discussion:



- Goal is to reduce pain AND risk of stomach bleeding
- Options have different benefits and risks
- Best option may depend on the patient's preferences
- Summarize the decision and plan for follow up

Answer these questions to help the patient decide:

How do you prefer to treat your pain?

Medication

Non-medication

What type of pain medication do you prefer?

Oral NSAID

Other-medication

Less risk

☐ celecoxib (Celebrex) 100mg \$\$\$
Take 1 capsule every 12 hours...

☐ diclofenac (Voltaren) \$\$
75mg Take 1 tablet every 12 hours...

☒ ibuprofen (Motrin) 600mg \$
Take 1 tablet every 8 hours...

☐ naproxen (Aleve) 250mg \$
Take 1 tablet every 8 hours...

More risk

☐ meloxicam (Mobic) \$\$
7.5mg Take 1 tablet daily...

Would you consider taking a stomach acid reducer to decrease risk?

Stomach acid reducer

No stomach acid reducer

Methods to Reduce Risk

Non-Medication Treatments

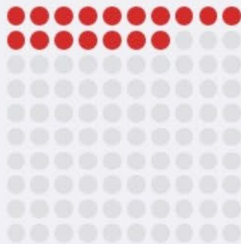
Alternative Treatments

Risk Profile for Patient

Major Risk Factors

- ☒ On warfarin (03/28/2021)
- ☒ Older than 65
- ☐ On aspirin
- ☐ Previous gastrointestinal bleed
- ☐ On clopidogrel
- ☐ On Selective Serotonin Reuptake Inhibitor
- ☐ On systemic corticosteroid

Estimated Gastrointestinal Bleeds (100 patients)



17 potential bleeds with this Risk Profile and ibuprofen

Points for **shared decision-making** discussion:

- Goal is to reduce pain AND risk of stomach bleeding
- Options have different benefits and risks
- Best option may depend on the patient's preferences
- Summarize the decision and plan for follow up

Answer these questions to help the patient decide:

How do you prefer to treat your pain?

Medication

Non-medication

What type of pain medication do you prefer?

Oral NSAID

Other-medication

Less risk

☐ celecoxib (Celebrex) 100mg
Take 1 capsule every 12 hours... \$\$\$

☐ diclofenac (Voltaren)
75mg Take 1 tablet every 12 hours... \$\$

☒ ibuprofen (Motrin) 600mg
Take 1 tablet every 8 hours... \$

☐ naproxen (Aleve) 250mg
Take 1 tablet every 8 hours... \$

More risk

☐ meloxicam (Mobic)
7.5mg Take 1 tablet daily... \$\$

Would you consider taking a stomach acid reducer to decrease risk?

Stomach acid reducer

No stomach acid reducer

☐ omeprazole (Prilosec) 40mg
Take 1 capsule daily... \$\$

☐ esomeprazole (Nexium) 40mg
Take 1 capsule daily... \$\$\$

How do you prefer to treat your pain?

Medication

Non-medication

- Acupuncture
- Biofeedback
- Electrical Stimulation
- Exercise/Stretching
- Massage Therapy
- Meditation
- Physical Therapy
- Positive Psychology/Spiritual/Meaningfulness
- Psychotherapy
- Relaxation Therapy
- Sleep Habits
- Surgery (specific cases)
- Weight Loss (specific cases)

For further information visit: [MedlinePlus](#).

After Visit Summary

Since you are on warfarin, you have an increased risk of a stomach bleed with adding a nonsteroidal anti-inflammatory drug, such as ibuprofen (Motrin), naproxen (Aleve), or aspirin. After we discussed this risk and treatment options for your pain, we decided to try an alternative treatment without medications. If you decide you need pain medication before we reassess, you can use acetaminophen (Tylenol) 250mg 1-2 tablets every 6 hours as needed for pain.

Clinical Documentation

Accept

Clinical Summary for Chart

Additional Information (1/4)

What is a drug-drug interaction?



What is a gastrointestinal bleed?



Evidence



Additional Information (2/4)

What is a drug-drug interaction?

What

Evidence

What is a drug-drug interaction?

- When two or more drugs react with each other and cause unwanted side effects
- Warfarin (Coumadin) and NSAIDs (nonsteroidal anti-inflammatory drugs) increases your risk of stomach bleeding



warfarin

+



ibuprofen

=



Additional Information (3/4)

What is a drug-drug interaction?

What is a gastrointestinal bleed?

Evidence

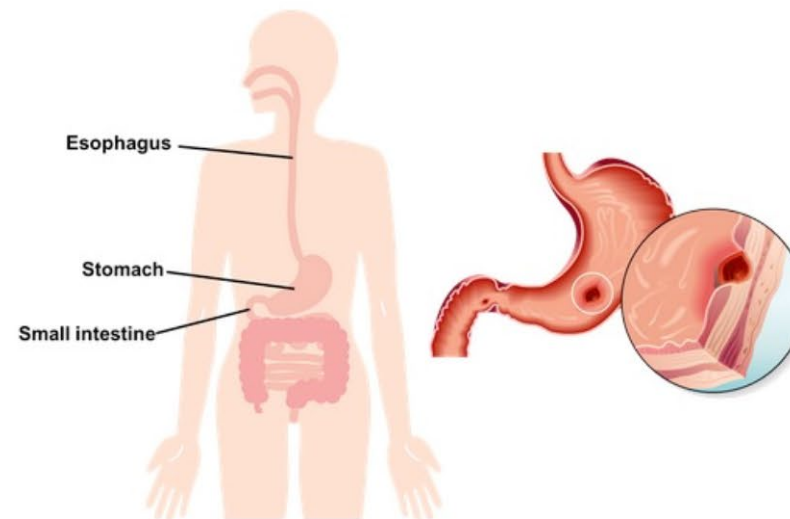
What is a gastrointestinal bleed?

Bleeding that occurs anywhere in the digestive tract, from the esophagus to the rectum.

Symptoms may include:

- Vomiting blood or something that looks like coffee grounds
- Melena: dark and tarry-appearing stools with a distinctive smell
- Feeling weak, light-headed, or woozy
- Rapid heartbeat
- Belly cramps or pain

Parts of your body that are most at risk for bleeding from a drug interaction include:



Additional Information (4/4)

What is a drug-drug interaction?

What is a gastrointestinal bleed?

Evidence

FORMULA

Risk

Age > 65 years = 2.5
On aspirin = 1.55
On clopidogrel = 3.66
On ssri = 2
On corticosteroid = 1.4
Hx of GI bleeding = 5
With stomach acid reducer = 0.24

Equation

$$Pr(\text{Bleeding}) = e^{Y_i} \div (1 + e^{Y_i})$$

$$Y_i = \beta_0 + \beta_i X_i + \varepsilon_i$$

$Y_i = \text{alpha} + 0.91 * \text{age} + 0.44 * \text{asa} + 1.29 * \text{clon} + 0.69 * \text{ssri} + 0.33 * \text{cortico} + 1.61 * \text{gibled} + 1.10 * \text{cele} + 1.10 * \text{dico} + 1.38 * \text{ibup} + 2.19 * \text{indo} + 2.19 * \text{keto} + 2.89 * \text{ketr} + 2.08 * \text{napr} + 2.08 * \text{melo} + 2.64 * \text{piro} + (-1.42) * \text{ppi}$

This risk score has not been externally validated.

REFERENCES




Chen WC, Chen YH, Hsu PI, Tsay FW, Chan HH, Cheng JS, Lai KH. Gastrointestinal hemorrhage in warfarin anticoagulated patients: incidence, risk factor, management, and outcome. *Biomed Res Int*. 2014;2014:463767. doi: 10.1155/2014/463767. Epub 2014 May 29. PMID: 24987683; PMCID: PMC4058852.



Ray WA, Chung CP, Murray KT, Smalley WE, Daugherty JR, Dupont WD, Stein CM. Association of Proton Pump Inhibitors With Reduced Risk of Warfarin-Related Serious Upper Gastrointestinal Bleeding. *Gastroenterology*. 2016 Dec;151(6):1105-1112.e10. doi: 10.1053/j.gastro.2016.08.054. Epub 2016 Sep 14. PMID: 27639805; PMCID: PMC5124401.

Try DDInteract! (1/2)

- <https://ddi-cds.org/apps/>



The screenshot shows the DDI-CDS website. The header features the title "DDI-CDS" in large black font, with "Drug-Drug Interaction Clinical Decision Support" underneath. To the left of the title is a graphic of green and blue pill icons connected by yellow lines. Below the header is a navigation bar with "Apps" on the left and "Home / Apps" on the right. The main content area contains a welcome message, two paragraphs of text describing the apps, and a list of two apps with right-pointing chevrons.

DDI-CDS

Drug-Drug Interaction Clinical Decision Support

Apps Home / Apps

Welcome to the DDI-CDS app page. Tools to improve patient safety are listed below. These are based on our CDS algorithms using open, free, and standards-based health information technology standards (SMART on FHIR).

The first app related to Warfarin and Non-Steroidal Anti-Inflammatory Drugs (NSAIDs) is currently undergoing testing. If you are physician, pharmacist, or informaticist, we are interested in having you "test" drive the tool and completing a short survey. This app is a "shared-decision making" app – designed to have a healthcare professional have a discussion with a patient about the combination of the two medications.

The second app (Colchicine- CYP3A4/PGP inhibitors) is another tool to assist clinicians to assess the risk of harm when using these types of medications concurrently. This tool is still under development and testing at this time.

- Warfarin-NSAIDs Drug Interaction App (DDInteract™) >
- DDI-CDS for Colchicine – Cytochrome P450 3A4/P-glycoprotein Inhibitors >

Try DDInteract! (2/2)

Warfarin-NSAIDs Drug Interaction App (DDInteract™)

Click here to watch a short **video** that explains how the app was designed to work.

- You can demo the app by:
 - Running it like a risk calculator **Launch**
- Selecting any of the following patient profiles
 - Patient born in 1970 and taking warfarin 4 MG tablet, sulindac 200 MG tablet, and spironolactone 100 MG tablet – **Launch**
 - Patient born in 1952 and taking warfarin 4 MG tablet and sulindac 200 MG tablet with a history of GI bleeding – **Launch**
 - Patient born in 1940 and taking warfarin 10 MG tablet, prednisone 20 MG tablet, and ketorolac tromethamine 10 MG tablet – **Launch**
 - Patient born in 1970 and taking warfarin 10 MG tablet and ketorolac tromethamine 10 MG tablet – **Launch**
 - Patient born in 1952 and taking 4 MG warfarin tablet and a topical diclofenac lotion – **Launch**

Please provide us with your feedback!!

We are interested in your opinions about our tool. Below is a link to a confidential survey. At the end of the survey you have the option to enter a drawing for one of ten \$100 Amazon gift card! (drawing open to the first 100 participants)

<https://www.surveymonkey.com/r/5BC32WX>

We would welcome any other comments you have. You can also email us at info@ddi-cds.org

DDInteract™ is a shared decision making tool designed to assist both prescribers and patients understand the risks of bleeding while taking warfarin with and without NSAIDs. The app was designed with input from physicians, pharmacists, patients, and human factors researchers. *Trademark pending

Summary

- First authoring-to-service environment for PDDI CDS artifact development
- DDInteract is a novel SDM tool for managing drug-drug interactions
 - ▶ App-based approach for the last mile of meaningful CDS for drug safety

Discussion

WHAT'S NEW WITH CDS CONNECT

Matt Coarr and Chris Moesel, MITRE

Updates and New Features



- **Authoring Tool**

- ▶ Support for using base elements, parameters, and external CQL as arguments to external CQL functions
- ▶ Support for Strength of Recommendation and Quality of Evidence in CPG form
- ▶ Updates to design and interaction of Value Set Authority Center integration
- ▶ Visual error indicators and content indicators on tabs in Workspace
- ▶ “Sticky” tabs so authors always know their context (e.g., Inclusion, Exclusions)
- ▶ Bug fixes and continued updates to support reusability and maintainability

- **Repository**

- ▶ API update for related artifacts deployed (now returning title, ID, and URL for each related artifact)
- ▶ UI changes in progress
- ▶ CPG-on-FHIR work continues
- ▶ User documentation update continues
- ▶ Updated environments to PHP 7.4
- ▶ Software updates and security patches — In progress: Drupal 9 and Acquia Dev Desktop replacement
- ▶ Technical support for Repository contributors

Link to CDS Connect: <https://cds.ahrq.gov/cdsconnect>

ANNOUNCEMENTS, OPEN DISCUSSION AND CLOSE-OUT

Maria Michaels

Office of Public Health Scientific Services
Centers for Disease Control and Prevention