EAGER: Detecting and Addressing Adverse Dependencies Across Human-in-the-Loop In-Home Medical Apps

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Goals of Project

- . To make the simultaneous use of multiple medical and wellness apps safe
- . To reduce the effort for medical and wellness app developers
- . To improve the design and implementation process for apps to make them more robust and aware of inter-app dependencies
- . To create personalized semantic-aware multilevel conflict detection
- . To interact in the Global Cities Challenge

Innovative Contributions

• A totally new approach to detecting primary and secondary dependencies across multiple in-situ, wellness, and medical apps

Research Challenges

• Development of a platform that supports construction of wireless and mobile medical apps that are conductive to dependency analysis

Human-in-the-Loop Apps

Smartphone Paradigm

- Medical apps are booming

 Focused on human physiological parameters Using a personalized physiological simulator as part of a model predictive control loop Solutions consider personalized information and time dependent interventions New solutions for finding contradictory advice in textual outputs of apps Practical improvement to safety – people will use many apps 	 Implementation of a set of apps with interventions Development of an runtime platform to support obtaining experience with running, detecting, and resolving dependencies to keep patients safe Develop solutions that can understand when advice (a major type of intervention) given by different apps is contradictory Develop solutions for addressing the very large numbers of secondary dependencies among the 7800 variables found in the HumMod simulator 		– By 2020, 157 million Americans predicted to have more than one chronic disorder	
Conflicts in HiL CPSs				
 Very challenging! Independently developed! Each app/system has its own assumption and strategy to control human physiological parameters Multiple apps, multiple interventions : CONFLICTS Increase, decrease each others effects unwillingly Drug overdose 	 Majority of health apps provide interventions as formatted or free text Advice/recommendations Detecting conflicts from pieces of text involve <i>Understanding</i> the intervention Inferring the implications of the intervention Using medical knowledge 	Veight Loss TipsSearch HereEat vitamin-filled melon folloSwap your regular cheese forOrink oolong tea instead of wOrink oolong tea instead of othChoose spinach ahead of othA daily glass of red wine canEat more berries to lose weigEating a bowl of muesli two hEat 'good' fats to burn fat. Eg	 High Level Parameters (vital signs) Body temperature, heart rate, blood pressure, respiratory rate, glucose (normal range known) ✓ Extensible Low Level Parameters (secondary effects) Kidney-ArcuateArtery. BloodFlow, LeftHeart-Flow. BloodFlow, Liver-Fuel. GlucoseDelivered(Cals/Min) Why do we need to worry about secondary effects (variables affected)? 	

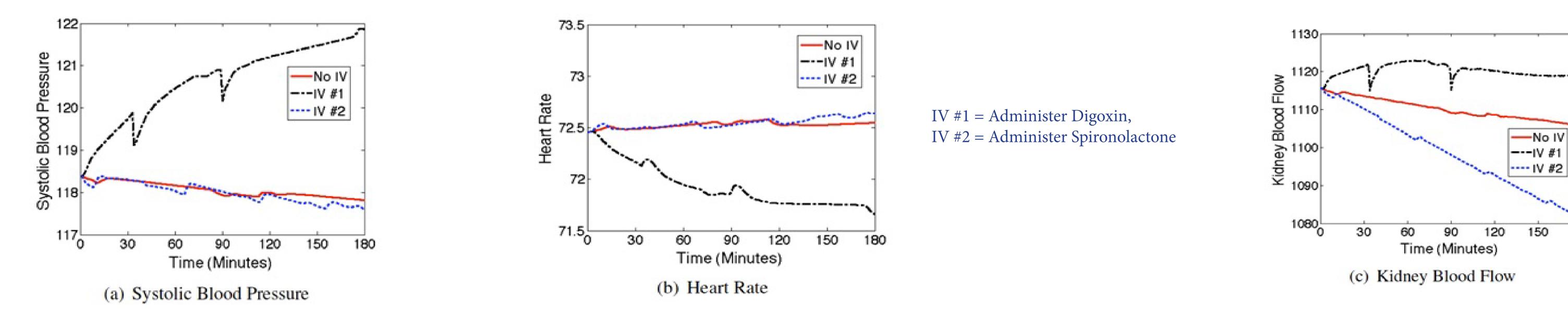
Fat Quies abases offer a mas

• Need to address a spectrum of (complex) dependencies

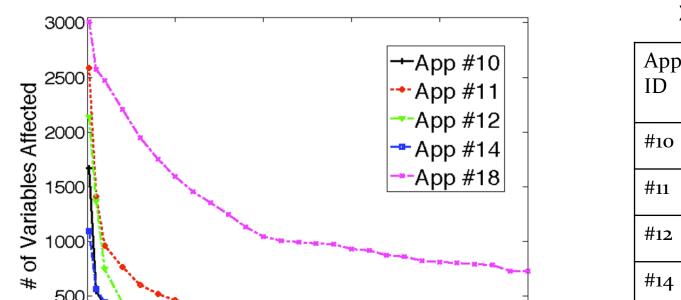
(heart rate)

180

Conflict!







Use App Meta Data

Types of Conflicts in Text Advice

3000 X = 250%	App Developers Specify		Advice 1	Advice 2
App #10 App # Variables	 Only the high level parameters (just 5 parameters) 	Antonym	Soy is a miracle food.	Soy is terrible for you!
App #11	 Allowed to specify low level parameters, if known 	Negation	Olive oil is perfectly ok for	Don't use olive oil for cooking as it has a low smoke point and can
App #12 → App #14 #10 208	- Specify effect: <i>increase</i> , <i>decrease</i> , <i>null</i>		frying.	become toxic.
App #18 #11 289		Numeric		of <u>3 to 5</u> cups of coffee per day may
- #12 219			coffee per day, as it can increase the risk of death from all causes	
	<pre><intervention> MidodrineSingleDose.Dose </intervention></pre>	SubjectAdvice differs based on gender, age, health condition, ethnicity of thespecificsubject		
# 500 #12 211 #18 727	<dosage> 10 </dosage>	Contradictory	,	Avoid drinking as even one drink a
0 50 100 150 200 250	(dosayer 10 (/dosayer	effects	growth of breast cancer cells.	day increases risk of breast cancer.
Threshold Values	<pre><param/> Heart-Rate.Rate </pre>	Different	Tea consumption can lower	Prostate cancer risk is higher for
	<pre><effect> increase </effect></pre>	effects	one's risk of hypertension and heart disease.	heavy tea drinkers.
Structure of Advice	Solution Approach			
Free text:				ction Cluster reated
 Free text: "Drink around 1.5 to 2 liters of water, every day." 	Lexical processing Impose some structure on the		Being Cr	reated
 Free text: "Drink around 1.5 to 2 liters of water, every day." Sentence can be imperative or declarative 	Lexical processing Impose some	Title: Support		reated
Free text:	Lexical processing Impose some structure on the	Title: Support Participants	Being Cr for Safety of the Elderly	reated
ree text: • "Drink around 1.5 to 2 liters of water, every day." • Sentence can be imperative or declarative • Source: general health app that provides bulk of tips emi-structured	Lexical processing Impose some structure on the text Named entity recognition Lexical and semantic parsing Detecting conceptual overlap	Title: Support Participants • Academia	Being Cr for Safety of the Elderly	reated y Population
ree text: • "Drink around 1.5 to 2 liters of water, every day." • Sentence can be imperative or declarative • Source: general health app that provides bulk of tips emi-structured • Something between the other 2 types • Source: created by app developers, partial	Lexical processing Named entity recognition Lexical and semantic parsing Detecting conceptual overlap Using MetaMap,	Title: Support Participants • Academia Univer	Being Cr for Safety of the Elderly	reated y Population University of Minnesota
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