

# **Supporting Decisions on Patient Prioritization at Admission to Homecare**

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COLUMBIA UNIVERSITY

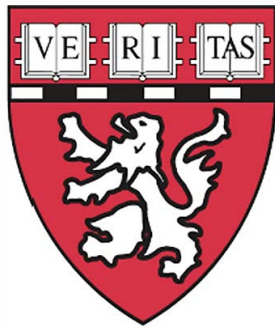
*School of Nursing*



# Research trajectory



Tool development  
(UPenn)



Tool pilot testing  
(Harvard & BWH)



Current work  
(Columbia & VNSNY)

# Funding

## Study

1. Frank Morgan Jones Fund (Center for Integrative Science in Aging)
2. Office of Nursing Research- UPenn, Faculty Senate Council Grant
3. Doyle Research Partnership Fund - VNSNY

## Personal

1. Spencer scholarship for PhD studies in the US (University of Haifa)
2. Fulbright Fellowship (U.S. Department of State)

# PROBLEM

- Up to 20% are readmitted within first two weeks.

(Anderson, Clarke, Helms, & Foreman, 2005; Berry et al., 2011; Bowles, 2012; Markley, Sabharwal, Wang, Bigbee, & Whitmire, 2012; C. Murtaugh, 2013; O'Connor, Hanlon, & Bowles, 2014)

- Study: High priority patients are not seen on time (Topaz, 2013).
- Lack of tools for patient prioritization.

**7 million patient admitted to 12,000 agencies**



# FINANCIAL IMPACT

**\$6,200/hospital day**



**\$135/homecare visit**



**98% savings**

**\$225 million fines** incurred by hospitals (CMS)



# Gaps in the literature...

- It is critical to identify patients at risk for poor outcomes (e.g. readmissions) and intervene at the right time.
- A variety of clinical, sociodemographic and functional status characteristics associated with poor outcomes and timing for the first nursing visit.
- There is a lack of evidence to support patient prioritization at the admission to home health.

# **The proposed solution:**

Decision support tool for patient prioritization for the first home health nursing visit.





# Specific Aims:

**Aim 1)** To identify disease characteristics, medications, patient needs, social support characteristics, and other factors identified by experts as associated with patient's priority for the first home health nursing visit.

**Aim 2)** To construct and validate the best predictive model imitating experts' decisions on patient's priority for the first home health nursing visit.

# **Background and Review of Literature: Theoretical Framework**

1. **Transitions theory** (Meleis, 2010): to examine the process of an individual's transition from hospital to home health settings.
2. **The Data Information Knowledge Wisdom framework** (American Nurses Association, 2008; Graves & Corcoran, 1989): to explicitly present all the informatics steps during the construction of a decision support tool.

# METHODS

## Prospective predictive study

### Participants:

1. **20 Registered nurse** (further experts) with at least a Baccalaureate degree in nursing from **4 geographic areas** in US.
2. At least **five years** of experience working as a **transitional care nurse, care manager or care coordinator** with responsibilities to assist in patient transfer from hospitals to home.



### Case summaries:

- Case summaries (R01- NR007674; UPHS health system).



- **Website** construction (Metter Interactive)

- Step 1: Case review

[illegible]

## Step 2: Priority choice

Based on your expertise, what priority would you place on making the first existing healthcare staff? Data are decision solely on patient characteristics and/or needs, the most concise treatment, common organizational priorities, or other factors in care.

Priority	Count	Percentage
High Priority	7	100%
Medium Priority	5	71%
Low Priority	4	57%

- Reiterate in 30% of the cases

### Step 3: Factors choice

[illegible]

#### Step 4: Final review

**Your Priority for the First Homecare Nursing Visit Decision:**

Please rank priority #6,3 on the priority scale from 1-10.

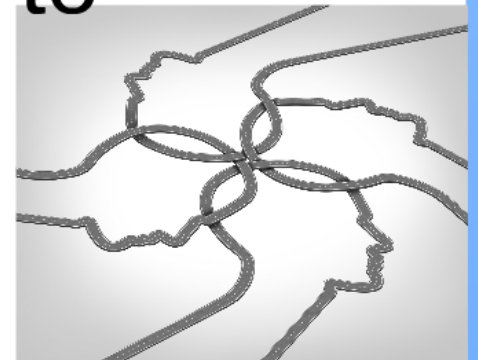
**Case characteristics that influenced your priority decision:**

variable name	variable value
AGE	56
COMORBIDITY_RESPONSE	chronic nursing problem, not a chronic condition
SOCIOECONOMIC_STATUS	LOWEST INCOME, MEDIAN, UNEMPLOYED

**Select Case**

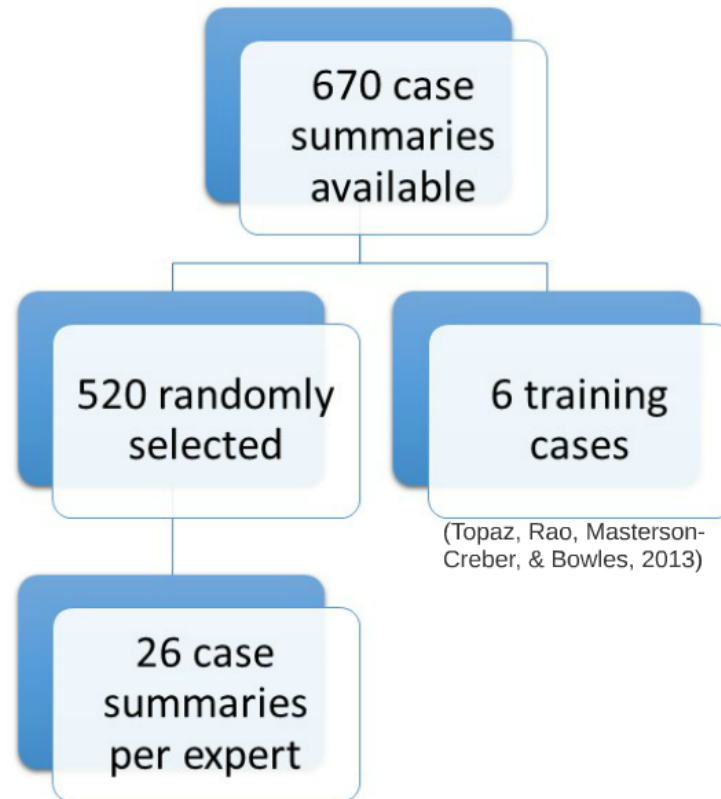
# Participants:

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# Case summaries:

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#### Sociodemographics

Age:	68
Race:	White
Ethnicity:	non-Hispanic/-Latino
Gender:	male
Marital Status:	married
Employment:	unemployed
Education:	high school

#### Hospital Stay Summary

The patient was admitted as a(n) elective admission with a primary diagnosis of: Malignant neoplasm of bladder, part unspecified.

The patient has the following secondary diagnoses:

Acute posthemorrhagic anemia  
Acute venous embolism and thrombosis of deep vessels of proximal lower extremity  
Acute venous embolism and thrombosis of superficial veins of upper extremity  
Chronic airway obstruction, not elsewhere classified  
Chronic kidney disease, unspecified

# Step 2: Priority choice

Based on your expertise, what priority would you place on making the first nursing homecare visit? Base your decision solely on patient characteristics and/or needs. Do not consider insurance, common organizational practices, or other barriers to care.

High Priority

Medium Priority

Low Priority

Please drag the slider to indicate your priority

- Rationale in 30% of the cases



# Step 3: Factors choice

## Sociodemographics

Age:	68 <input checked="" type="checkbox"/>
Race:	White <input type="checkbox"/>
Ethnicity:	non-Hispanic/-Latino <input type="checkbox"/>
Gender:	male <input type="checkbox"/>
Marital Status:	married <input type="checkbox"/>
Employment:	unemployed <input type="checkbox"/>
Education:	high school <input type="checkbox"/>

## Hospital Stay Summary

The patient was admitted as a(n) elective ☐ admission with a primary diagnosis of: Malignant neoplasm of bladder, part unspecified ☐.

The patient has the following secondary diagnoses:

- ☐ Acute posthemorrhagic anemia
- ☐ Acute venous embolism and thrombosis of deep vessels of proximal lower extremity
- ☐ Acute venous embolism and thrombosis of superficial veins of upper extremity
- ☒ Chronic airway obstruction, not elsewhere classified
- ☒ Chronic kidney disease, unspecified

# Step 4: Final review

## Your Priority for the First Homecare Nursing Visit Decision:

Medium priority (4.3 on the priority scale from 0-10).

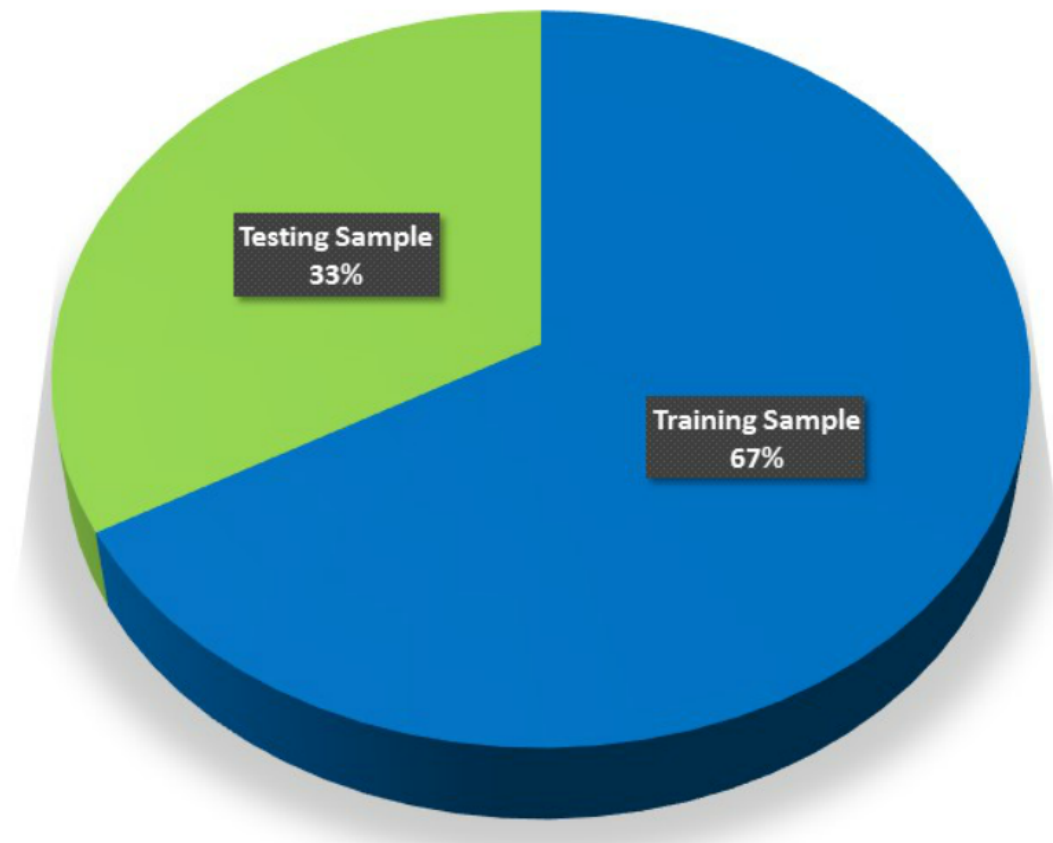
## Case characteristics that influenced your priority decision:

Variable Name	Variable Value
Age	68
Secondary Diagnosis	Chronic airway obstruction, not elsewhere classified
Secondary Diagnosis	Chronic kidney disease, unspecified

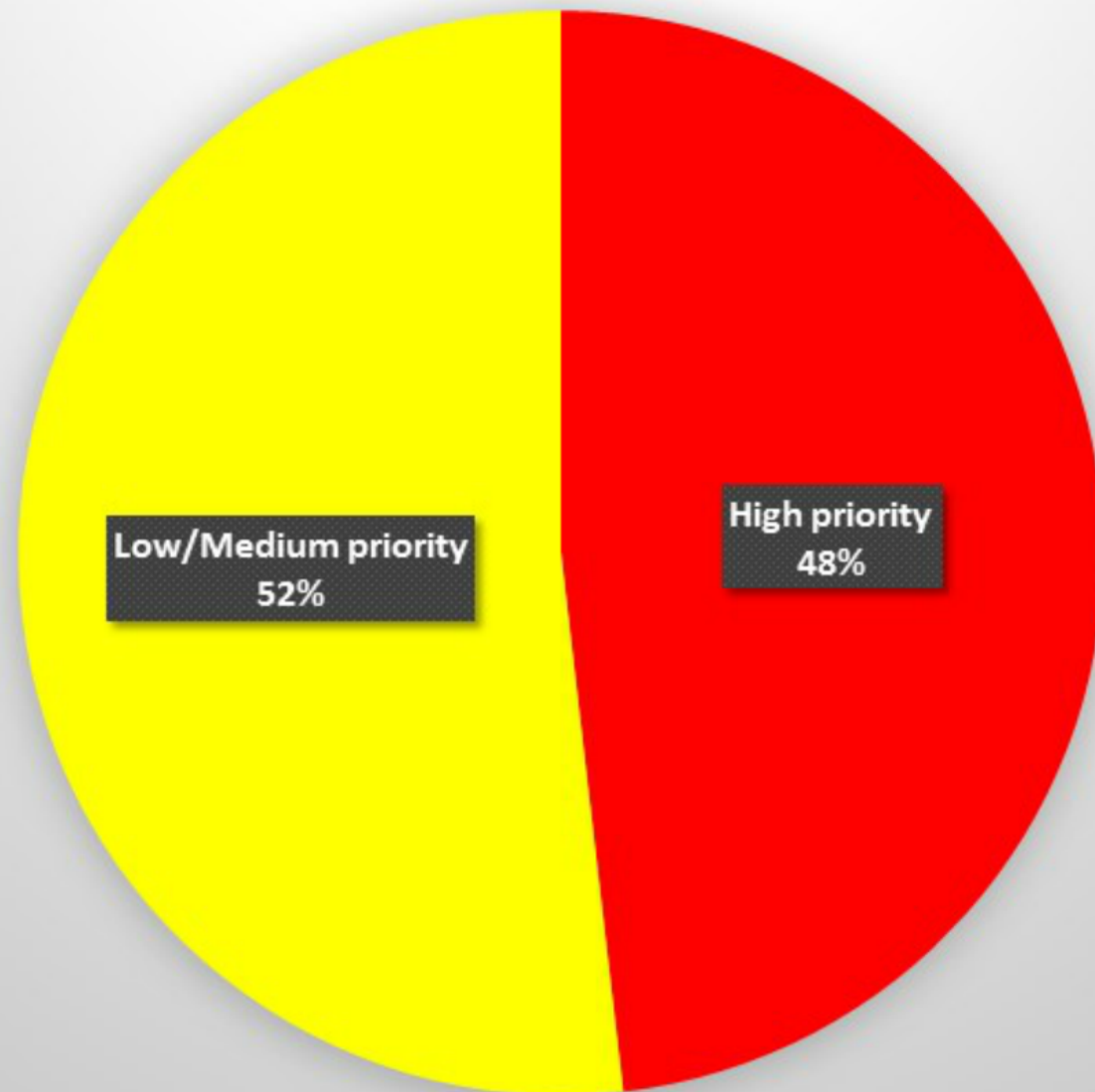
**Submit Case**

# RESULTS

- Holdout (testing) sample with one-third ( $n=176$ ) of the cases.

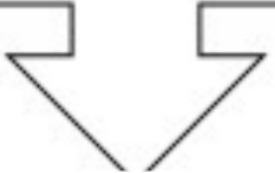


## First Home Health Visit Priority Category



# RESULTS

**STEP 1:** Examining optimal variable categorization with data mining and other quantitative analysis



- ICD 9 categories, Medication groups (VA drug classes with natural language processing).

# RESULTS

## Socio-demographics:

- 70 years old,
- 2/3 white
- 51% male
- 60% high school or less
- 2/3 not employed



## Functional status:

- 50% ambulation issues
- 32.9% toileting issues

## Caregiver:

- 83% caregiver present
- 67.1% spouse/child

## Health characteristics:

- 50% average/poor self rated health
- 14% wounds
- 50% no 6 month hospital stay

## Individual and living environment:

- 11% self reported depression
- 20% mental health issues
- Most lived in houses with family

# RESULTS

## Step 2.b: Selecting the most informative variable subset for the final model

1. Subset selection (Information Gain, Gain Ratio, Chi-square evaluator, and Correlation Feature Selection) (Witten et al., 2011).

2. Bootstrap subset selection method in STATA (50 iterations)



26 unique variables (70% agreement)

The diagram illustrates the convergence of two different subset selection methods. Two blue arrows originate from the two methods listed above and point towards a central box at the bottom. The box contains the text '26 unique variables (70% agreement)', indicating the final result of the process.



# RESULTS

Step 2.c: [Qualitative validation](#) based on experts' rationale descriptions

- Example “Patient is high priority due to number of comorbidities that must be controlled, polypharmacy, multiple readmissions/ER visits and wound care”.

# RESULTS

STEP 3: Constructing and validating the best predictive model imitating experts' decisions on patient's priority (Aim 2).

a. Construction and validation of a predictive model

ROC= 75.9, Sensitivity= 80% , Specificity= 57.9%.

# RESULTS

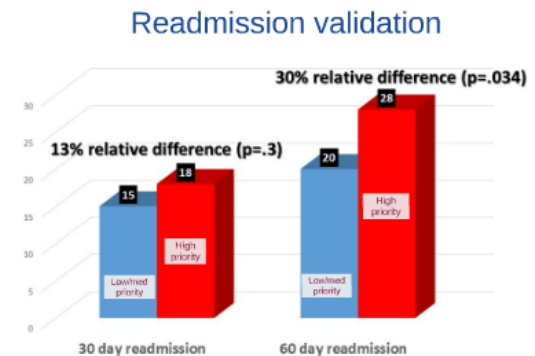
- Number of comorbid conditions (OR 1.04,  $p=.11$ , CI: .99-1.08)
- Number of discharge medications (OR 1.04,  $p=.08$ , CI: .87-1.09)
- Presence of wounds (OR 1.88,  $p=.06$ , CI: .95-3.7)
- Limitation in current toileting status (OR 2.02,  $p=.004$ , CI: .1.25-3.26)
- Presence of a comorbid condition of depression (OR 1.73,  $p=.15$ , CI: .8-3.6).

# RESULTS

Step 3.c: Experts' model validation (3 experts)

Step 3.d: Other validation (readmissions)

Creating the tool (regression coefficients)



## **PREVENT**

Priority for First Home Health Visit Tool PREVENT<sup>©</sup> is copyrighted and is used ONLY with permission from Maxim Topaz 267-994-2751, [mtopaz80@gmail.com](mailto:mtopaz80@gmail.com)

**Rule:** Sum scores as follows. Any score >26 would suggest high priority for the first home health visit.

Question: (Response =Score)	Score
Count the <u>NUMBER OF MEDICATIONS</u> prescribed to the patient =	
Count the <u>NUMBER OF COMORBID CONDITIONS</u> patient has =	
Does the patient have a comorbid condition of <u>DEPRESSION</u> (e.g. Depressive disorder, NEC)?  NO = 0  YES = 15	
Does the patient have <u>WOUND</u> of any type?  NO = 0  YES = 15	
Does the patient have <u>LIMITATION IN TOILETING</u> functional ability requiring use of any assistive equipment, assistive person or both?  NO = 0  YES = 20	
Total Score:	
If total score is >26 then <u>high priority</u> for the first home health visit  If total score is =<26 then <u>low or medium</u> priority for the first home health visit	

# DISCUSSION

- Functional status: limitations in toileting

(O'Connor, 2012; Rosati et al., 2003; Rosati & Huang, 2007)

- Good summary variable but further investigation is needed



# DISCUSSION

## Number of comorbid conditions

(Rosati et al., 2003; Rosati & Huang, 2007; Berkowitz & Anderson, 2013; Fortinsky et al., 2014; O'Connor, 2012; Silverstein, Qin, Mercer, Fong, & Haydar, 2008)

## Number of discharge medications

- Alarming feedback
- No one particular group met the threshold

(O'Connor, 2012; Rosati et al., 2003; Rosati & Huang, 2007)

## Wound presence

(Fortinsky et al., 2006; Fortinsky et al., 2014; O'Connor, 2012)

## Comorbid condition of depression

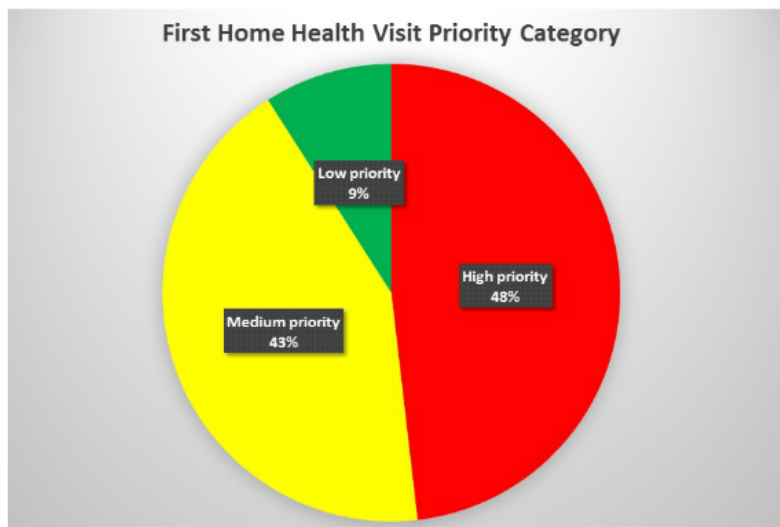
(Fortinsky et al., 2014; O'Connor, 2012)





# DISCUSSION

- Priority categorization (~10% low priority, 40% medium priority, 50% high priority): **patient complexity** vs. **ambiguity of decisions**.



# **LIMITATIONS**

- Patients' sample (one hospital system)
- Experts' sample
- Sample size limitations (e.g. only 14 patients with barriers to follow medication schedule)

# Doyle fund collaboration pilot

- Pilot with VNSNY funded by Eugene and Joseph Doyle fund
- Visiting Nurse Services of New York
  - Founded in 1893
  - **Largest** home- and community-based health care organization in the United States
  - On any given day VNSNY has approximately **65,000 patients** (2013 --> 2.3 million professional visits).

Topaz M, Trifilio M, Maloney D, Bar-Bachar O, Bowles KH. [Improving patient prioritization during hospital-homecare transition: A pilot study of a clinical decision support tool](#). Res Nurs Health. 2018 Oct;41(5):440-447. doi: 10.1002/nur.21907. Epub 2018 Sep 11. PubMed PMID: 30203417.



**Doyle fund collab**

# Methods

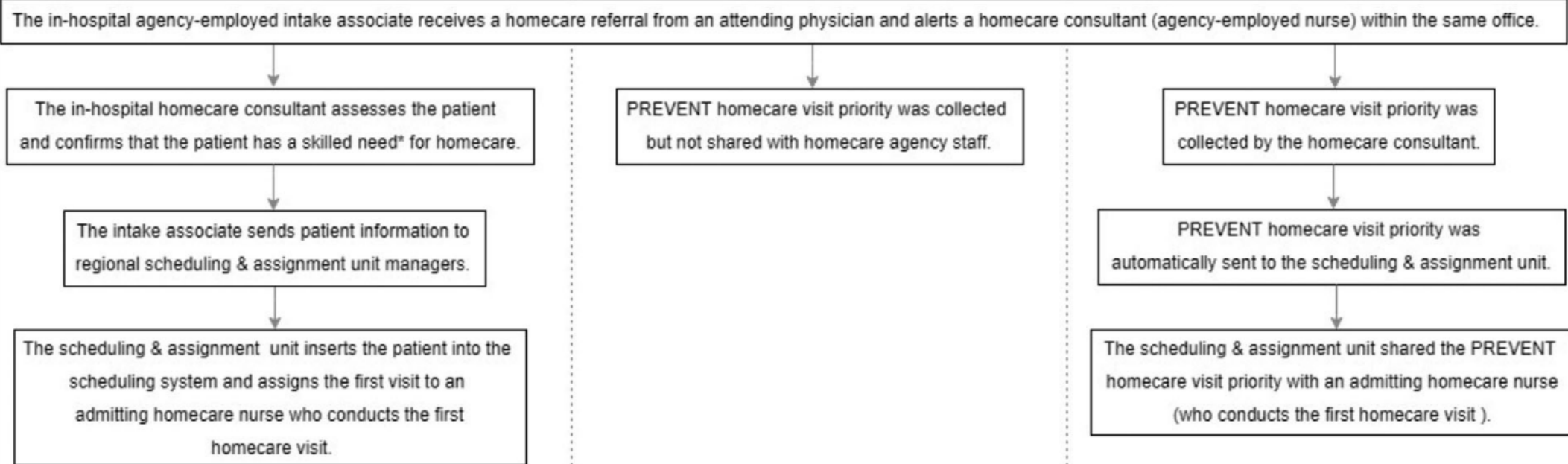
Pre-post, quasi-experimental design

- Pre-experimental phase – PREVENT not shared (n=90).
- Experimental phase- PREVENT shared (n=86).

## Regular homecare admission process

## Control phase

## Experimental phase



# Results

Pre-experimental phase--- high and medium/low priority patients were admitted within 2.2 days

VS

Experimental phase--- high risk patients admitted one-half day sooner (1.8 days) and medium/low priority patients within 2.6 days.



# Results

21.1% of patients were readmitted in pre-experimental phase

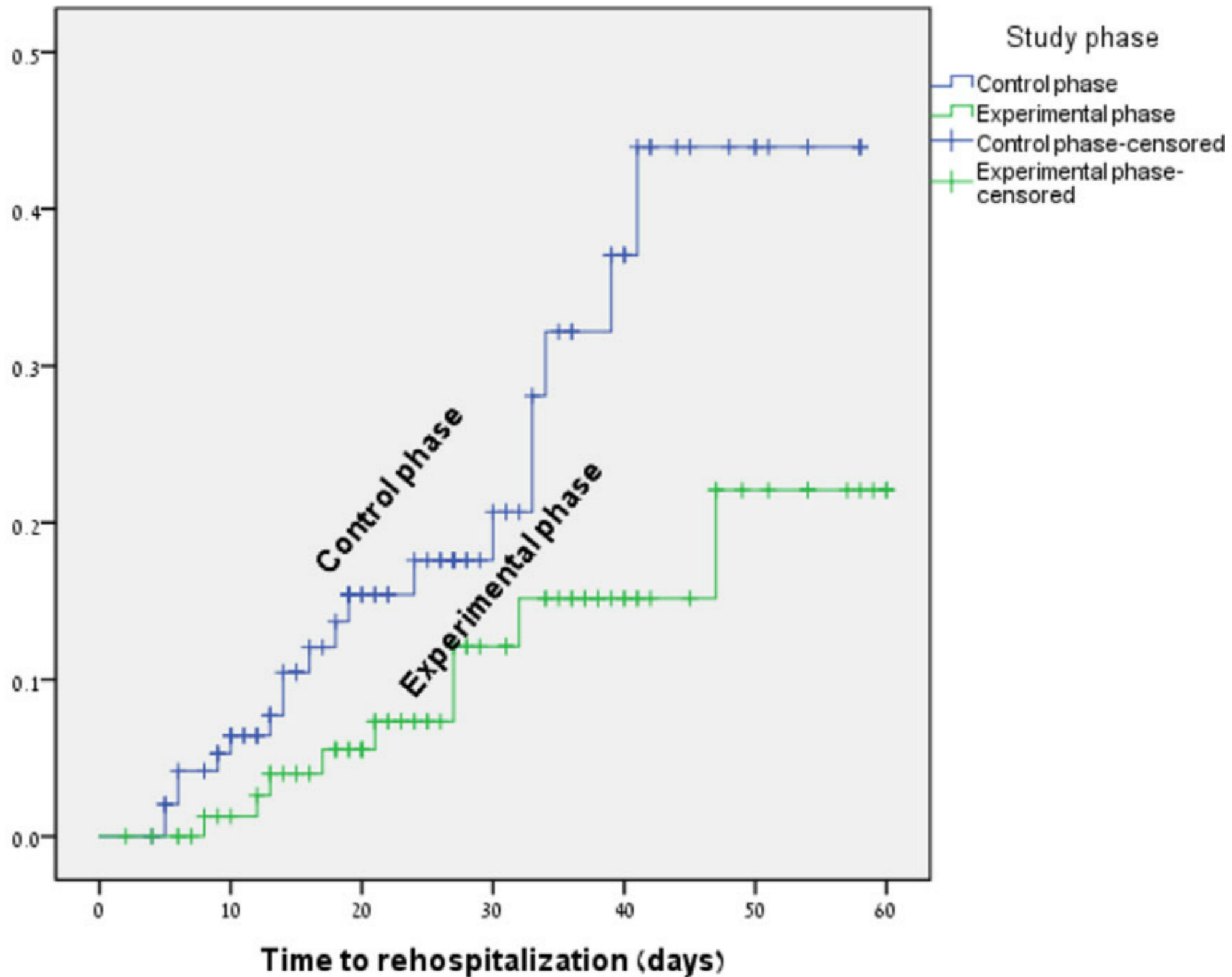
VS

11.7% of patients in the experimental phase

~40% relative percent reduction in readmission

Hospital admission rates decreased in both high risk (and medium/low risk patients between the pre- and experimental phases.

Risk of rehospitalization (cumulative hazard)



# CONCLUSIONS

- One of the first clinical decision support tools for home health, the “**PREVENT**”- Priority for Home Health Visit Tool.
- **Further work** is needed to test the tool's effects on patient outcomes.



# CURRENT WORK

- NINR R01 submitted (21% score)
- Learning algorithms vs. "rigid" tools
- Incorporating natural language processing to identify risk factors

The image features two large, light blue L-shaped brackets, one on the left and one on the right, framing the central text.

# **THANK YOU**

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