



Stanford
HEALTH CARE

It is time to learn from patients like mine

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Let's meet Laura

A teenager with systemic lupus erythematosus, proteinuria, pancreatitis and positive for antiphospholipid antibodies



www.webmd.com/lupus/picture-of-acute-systemic-lupus-erythematosus

The Green Button project



<http://greenbutton.stanford.edu>

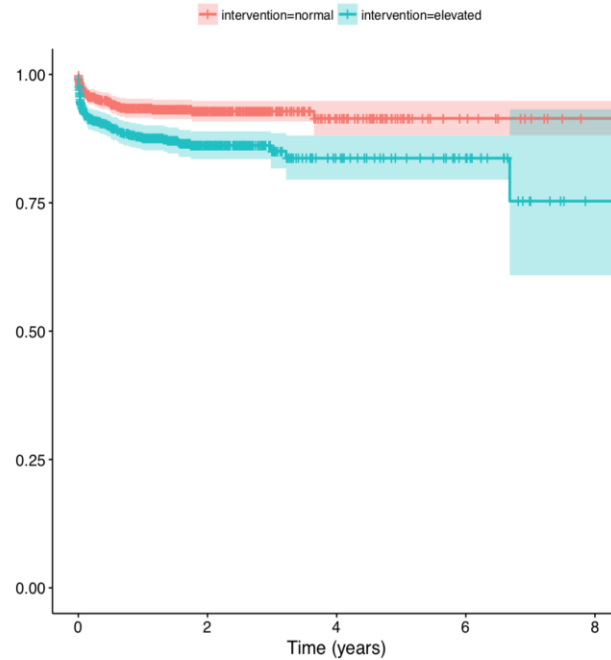
- Given a specific case, provide a summary of similar patients in Stanford's clinical data warehouse, the common treatment choices made, and the observed outcomes.
- An institutional review board approved study (IRB # 39709), which served 150 consultations across all service lines.
- **Invented novel technology to search medical timelines.**

Timeline

- 2014 **Green button:** using aggregate patient data at the bedside
(vision paper in Health Affairs)
- 2015 Outlined steps for rapid cohort studies at the bedside
- 2016 Built a search engine for patient timelines
- 2017 Launched a pilot of the service
- 2018 Described the methods used in the consult service, and a perspective on why “It is time to learn from similar patients”
- 2019 Completed the pilot study (writing up results)

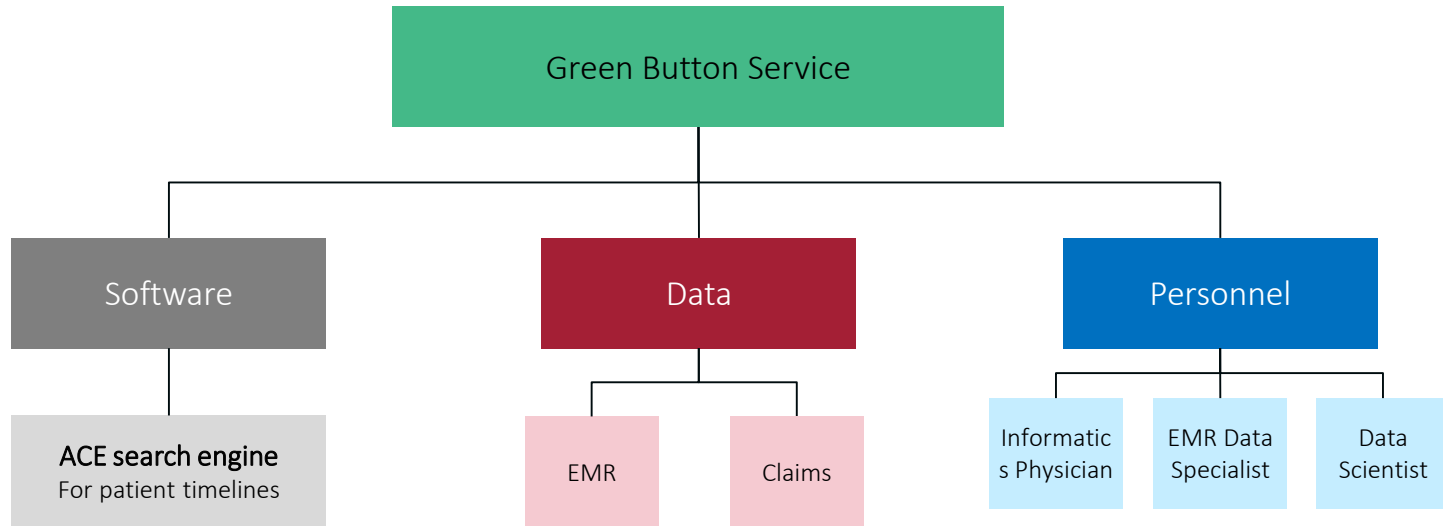
An example report

Mildly elevated serum free light chains and subsequent malignancy



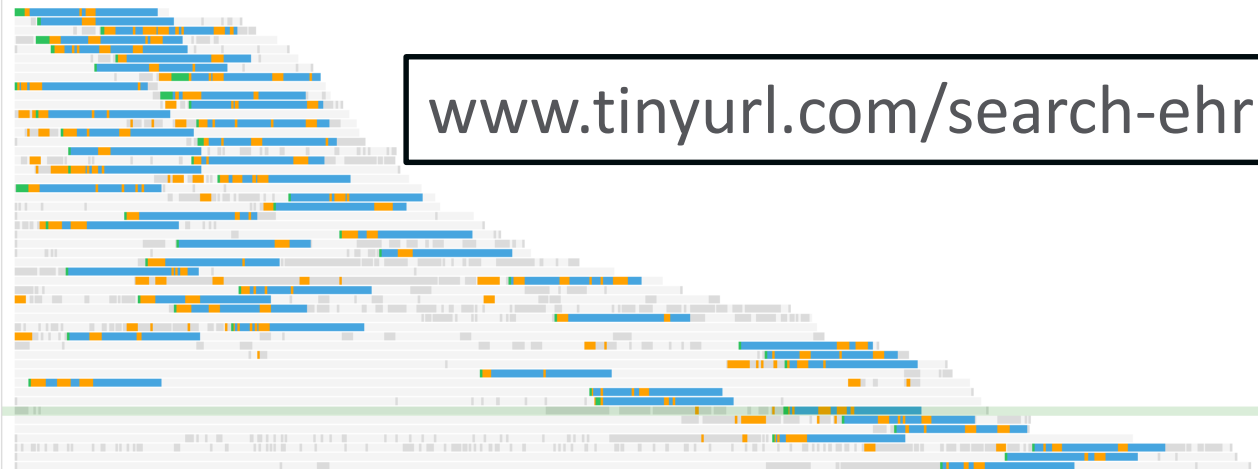
| | N | Observed | Expected | $(O - E)^2/E$ | $(O - E)^2/V$ | chisq | pvalue |
|----------|-----|----------|----------|---------------|---------------|-------|----------|
| normal | 760 | 49 | 73.365 | 8.092 | 16.413 | 16.4 | 5.09e-05 |
| elevated | 760 | 96 | 71.635 | 8.287 | 16.413 | 16.4 | 5.09e-05 |

Service = software, data, and personnel





www.tinyurl.com/search-ehr

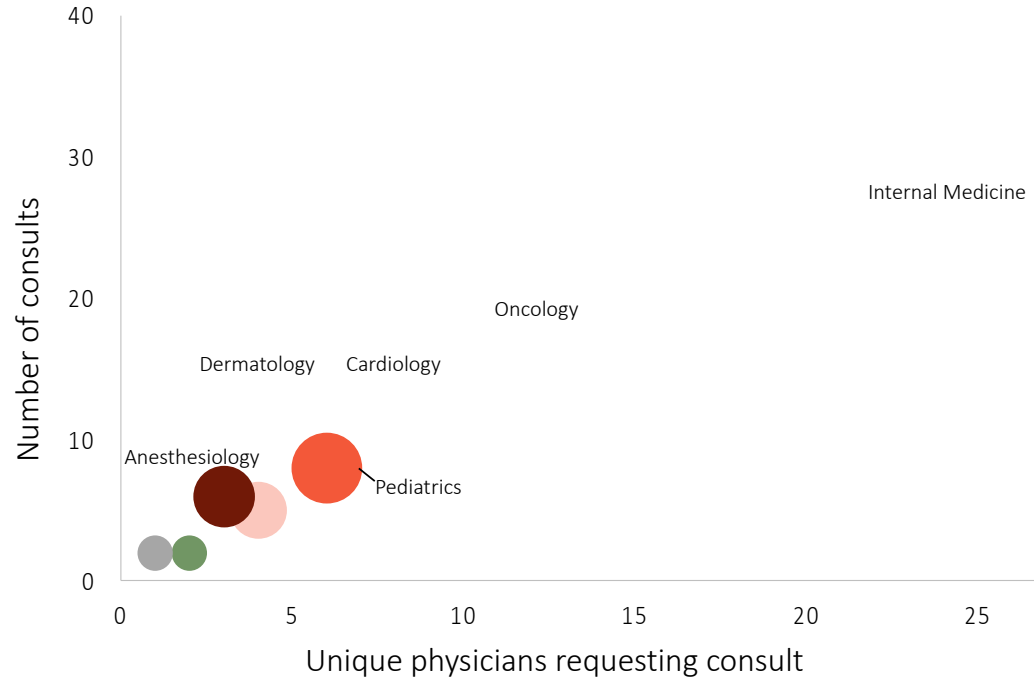
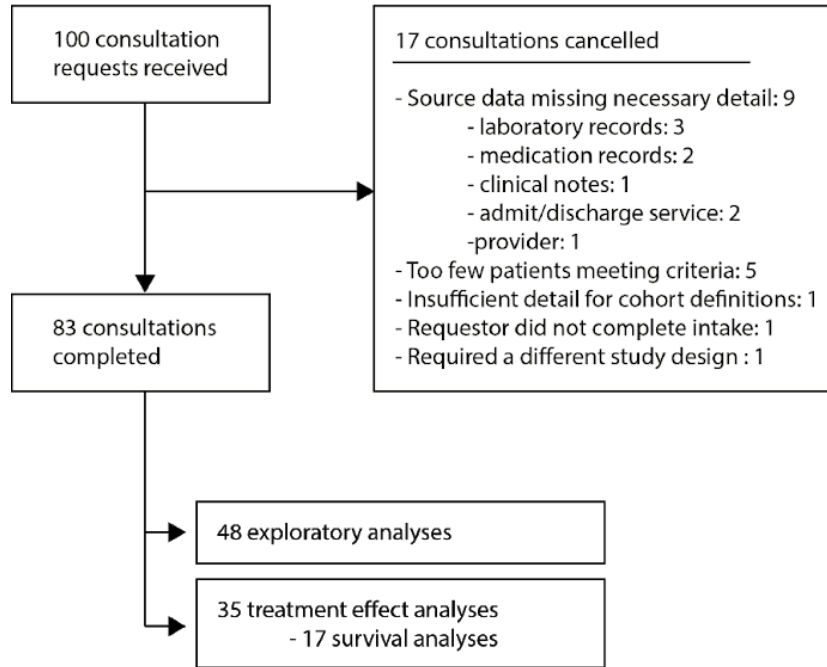


PID=1032493 (years)
 0 1 2 3 4 5 6 7 8 9
 1373 days†

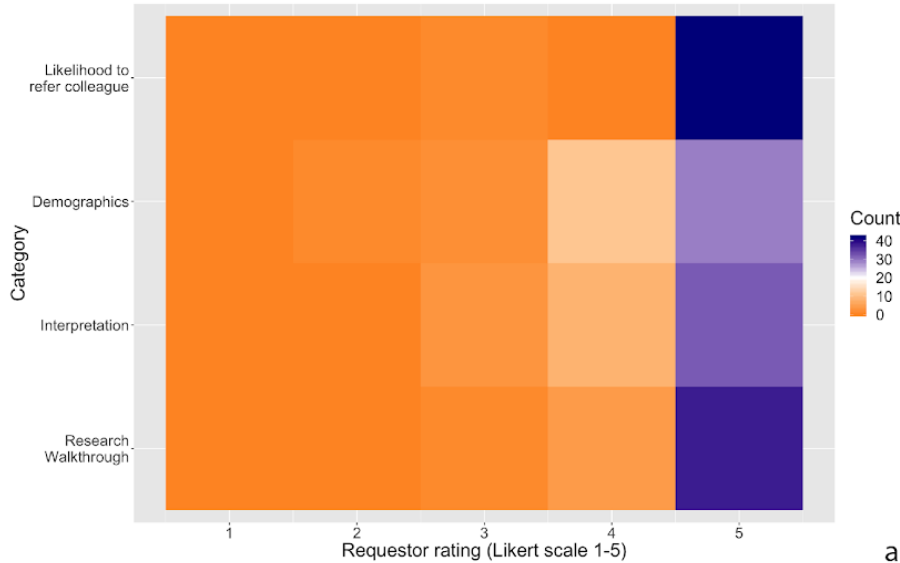
PID 1076150, MALE, WHITE, NON-HISPANIC, AGE 54 y, 288 d, 17 h, 15 m 1 pixel = 1920 minutes 🔍

| Event Type | Approximate Time (Years) |
|---------------------------|--------------------------|
| \$PPI_GT_3M_LT_1Y | 3.5 - 8.5 |
| \$PPI | 1.0 - 1.5 |
| \$VARICES | 3.0 - 4.5 |
| advance directive-sca... | 3.5 - 4.0 |
| anesthesia | 3.5 - 4.0 |
| anesthesia event | 3.5 - 4.0 |
| appointment | 1.0 - 1.5 |
| bpa | 2.0 - 2.5 |
| consents-scan | 3.5 - 4.0 |
| history | 1.0 - 1.5 |
| hospital encounter | 1.0 - 1.5 |
| inpatient | 1.0 - 1.5 |
| letter (out) | 3.5 - 4.0 |
| office visit | 3.5 - 4.0 |
| orders only | 3.5 - 4.0 |
| outside care-scan | 3.5 - 4.0 |
| panes visit | 3.5 - 4.0 |
| patient email | 3.5 - 4.0 |
| patient outreach | 3.5 - 4.0 |
| refill | 3.5 - 4.0 |
| resolute professional ... | 3.5 - 4.0 |
| scan | 3.5 - 4.0 |
| surgery | 3.5 - 4.0 |
| telephone | 3.5 - 4.0 |
| transcription only | 3.5 - 4.0 |
| treatment plan | 3.5 - 4.0 |
| unknown | 3.5 - 4.0 |
| 00-99.99 | 3.5 - 4.0 |
| 001-139.99 | 3.5 - 4.0 |
| 001-999.99 | 3.5 - 4.0 |
| 01-05.99 | 3.5 - 4.0 |
| 030-041.99 | 3.5 - 4.0 |
| 038 | 3.5 - 4.0 |
| 038.9 | 3.5 - 4.0 |
| 05 | 3.5 - 4.0 |
| 05.9 | 3.5 - 4.0 |

The first 100 consults



The first 100 consults



How 'reliable' are the results?

1. Comparing with two reference sets

- Applies to the 18 treatment effect estimation consults
- 13-22% were “false discoveries”

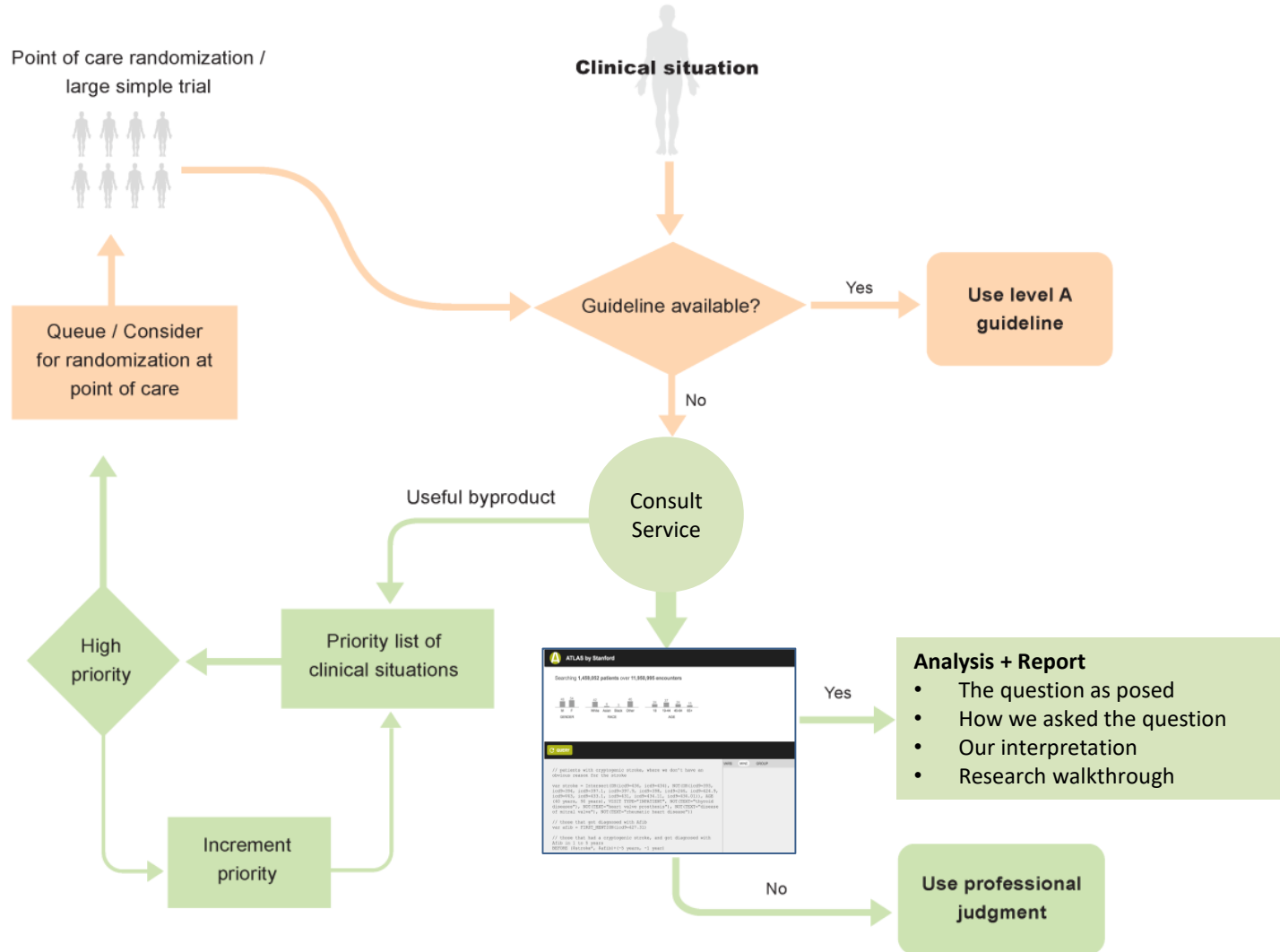
2. Comparing across datasets (Truven, Optum)

- Agreed 68-74% of the time
- About the same rate as how often RCTs agree with each other

3. Comparing patient matching strategies

- Agreed 79% of the time

Green button → Informatics Consult



Green button and the Informatics Consult

Informatics Consult team



Saurabh Gobar



Alison Callahan



Vladimir Polony



Ken Jung



Nigam Shah



Robert Harrington



Rob Tibshirani



Trevor Hastie

Stanford Health Care partners



David Entwistle



Tip Kim



Christopher Sharp

Funding: NLM, Dean's office School of Medicine, an anonymous donor, Department of Pathology, Center for Population Health Sciences, Stanford Health Care

Related prior efforts

Estimating Prognosis with the Aid of a Conversational-Mode Computer Program

ALVAN R. FEINSTEIN, M.D., JOEL F. RUBINSTEIN, M.D., and WALTER A. RAMSHAW, M.A.,

chemic heart disease is being used to expand our ability to care for patients. This report describes how the experience is documented, stored, and retrieved so that it can be used in patient management. Data acquisition is integrated with patient care by means of forms that are part of the patient record. Follow-up information is obtained at six months, one year, and yearly thereafter. All data are stored in a computer information system that allows the doctor to recall the experience of patients like his own patient. Prognostic

has been developing a system method for capturing our clinical perience with patients who have chemic heart disease. We began endeavor because we believed the ability to recall what we had done to whom we had done it, and what had happened would improve our ability to care for each new patient. began to use this accumulated clir experience, or data bank, in the

Evidence-Based Medicine in the EMR Era

Jennifer Frankovich, M.D., Christopher A. Longhurst, M.D., and Scott M. Sutherland, M.D.

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PROGNOSTIC REPORT FOR INDEX CASE : PATIENT A
WITH THE FOLLOWING CRITERIA :
HISTORY OF MYOCARDIAL INFARCTION
NO HISTORY OF RECURRENT CHEST PAIN
NO HISTORY OF CONGESTIVE HEART FAILURE
HEART SIZE NORMAL BY CHEST X-RAY
A SUBGROUP OF 18 PATIENTS WAS FOUND.

ASSOCIATED CLINICAL FINDINGS IN THIS SUBGROUP
MALES (% OF PATIENTS) * 100.0%
AGE (% OF PATIENTS WITHIN 5 YRS+) * 33.3%
DURATION OF IHD (% OF PATIENTS WITHIN 12 MONTHS) * 5.6%
TYPICAL ANGINA (% OF PATIENTS) * .0%
CHEST PAIN STABLE (% OF PATIENTS) * .0%
NYHA FUNCTIONAL CLASS FOR ANGINA = 4 (% OF PATIENTS) * 100.0%
HISTORY OF MYOCARDIAL INFARCTION (% OF PATIENTS) * 100.0%
NO HISTORY OF CONGESTIVE HEART FAILURE (% OF PATIENTS) * 100.0%
NO HISTORY OF HYPERTENSION (% OF PATIENTS) * 72.2%
NO HISTORY OF DIABETES MELLITUS (% OF PATIENTS) * 94.4%
HISTORY OF SMOKING (% OF PATIENTS) * 64.7%
NO PRIOR TREATMENT WITH B-BLOCKERS (% OF PATIENTS) * 28.9%
NO VENTRICULAR GALLOP (% OF PATIENTS) * 100.0%
NO PERIPHERAL BRUIES (% OF PATIENTS) * 100.0%
SERUM CHOLESTEROL (MEAN +/- SD) * 233.7 +/- 53.2
HEART SIZE NORMAL, CHEST X-RAY (% OF PATIENTS) * 100.0%
NO DIAGNOSTIC Q-WAVES, ECG (% OF PATIENTS) * 43.8%
NO CONDUCTION ABNORMALITIES (% OF PATIENTS) * 87.5%
NO RESTING ST-T WAVE CHANGES (% OF PATIENTS) * 75.0%
EXERCISE TEST POSITIVE (% OF PATIENTS) * 18.2%
LEFT VENTRICULAR END-DIASTOLIC PRESSURE (MEAN +/- SD) * 10.6 +/- 3.8
ARTERIOVENOUS OXYGEN DIFFERENCE (MEAN +/- SD) * 4.8 +/- 1.0
CARDIAC INDEX IN ML/MIN/SQ M. (MEAN +/- SD) * 2931.0 +/- 615.3
EJECTION FRACTION (MEAN +/- SD) * 45.5 +/- 9.3
NO SIGNIFICANT CORONARY DISEASE (% OF PATIENTS) * 5.6%
NORMAL LEFT VENTRICULAR CONTRACTION (% OF PATIENTS) * 77.8%
NO LEFT VENTRICULAR ANEURYSMS (% OF PATIENTS) * 90.0%
NO MITRAL INSUFFICIENCY (% OF PATIENTS) * 100.0%

PROGNOSTIC TABULATION

MEDICINE SURGERY
ALIVE DEAD NRA* SURVIVAL I ALIVE DEAD NRA* SURVIVAL
SURGICAL 16 0 0 100.0% I 2 0 0 100.0%
SIX-MONTH 16 0 0 100.0% I 2 0 0 100.0%
ONE-YEAR 10 0 6 100.0% I 2 0 0 100.0%
TWO-YEAR 6 0 4 100.0% I 2 0 0 100.0%
THREE YEAR 1 0 5 100.0% I 2 0 0 100.0%
*NRA=NOT YET REACHED ANNIVERSARY

THERE WERE 0 PERIOPERATIVE MYOCARDIAL INFARCTIONS. SUBSEQUENTLY 0
SURGICALLY TREATED PATIENTS HAVE HAD INFARCTIONS. 0 MEDICALLY TREATED
PATIENTS HAVE HAD INFARCTIONS.
AT THE TWO-YEAR FOLLOW-UP 3 OUT OF 5 MEDICALLY TREATED PATIENTS
WERE PAIN-FREE AND 2 OUT OF 2 SURGICALLY TREATED PATIENTS WERE PAIN-
FREE.
    
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Fig 3.—Prognostic report of patient A.

Questions that remain

- Does having such a consult service change patient outcomes?
- How could we enable such consults nationwide?
- Could we automate such analyses to be “always on”?
- Could we get such a “curbside consult” from multiple health systems?
- Could patients benefit from having access to such reports?