## Interactive Visual Displays for Results Management in Complex Medical Workflows

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Committee: Ben Shneiderman (Chair)

Linda Aldoory (Dean's Representative)

Ben Bederson

Rance Cleaveland

Catherine Plaisant



## A story...



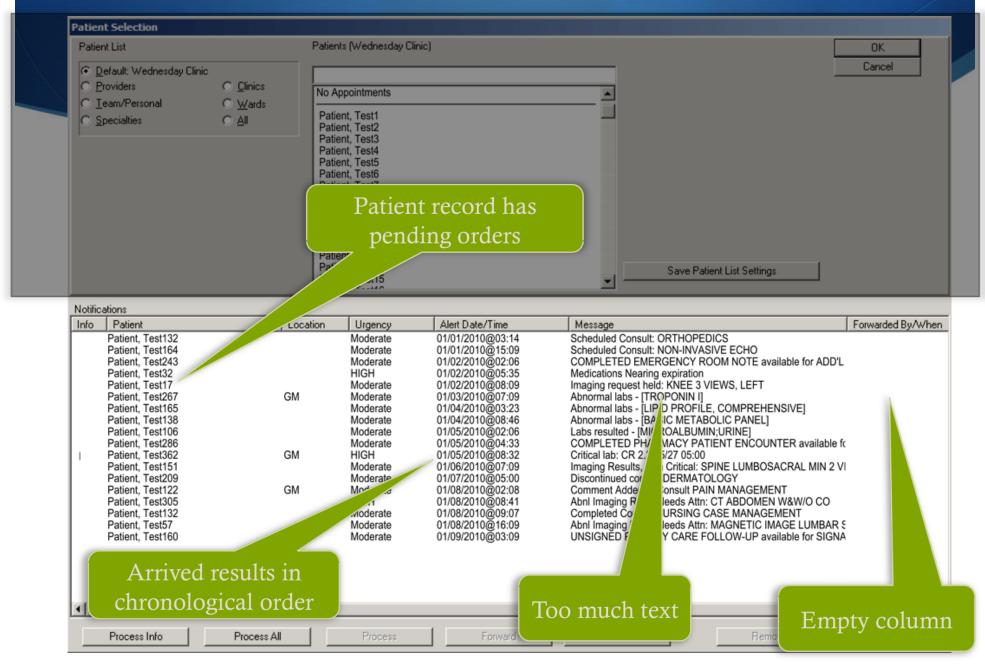
### Missed Results

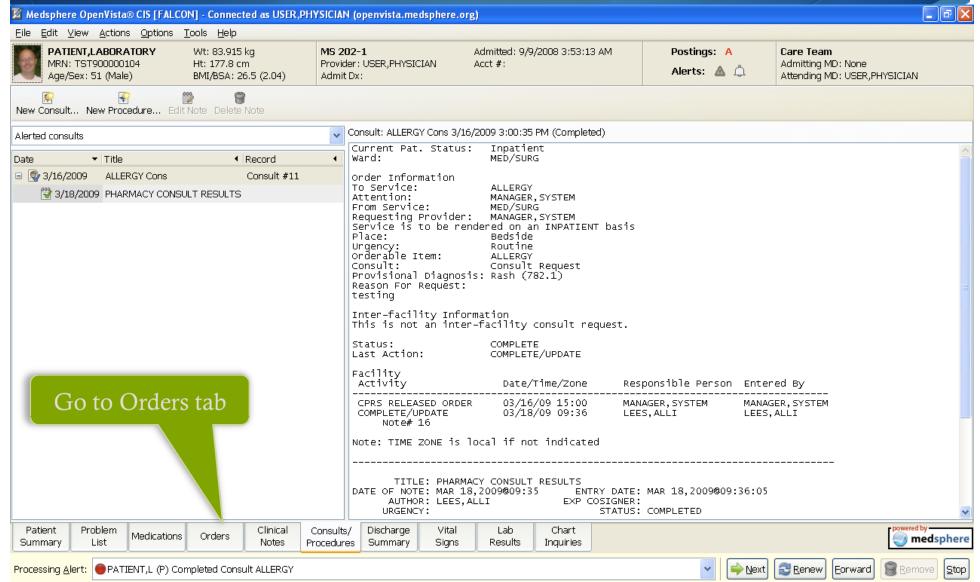


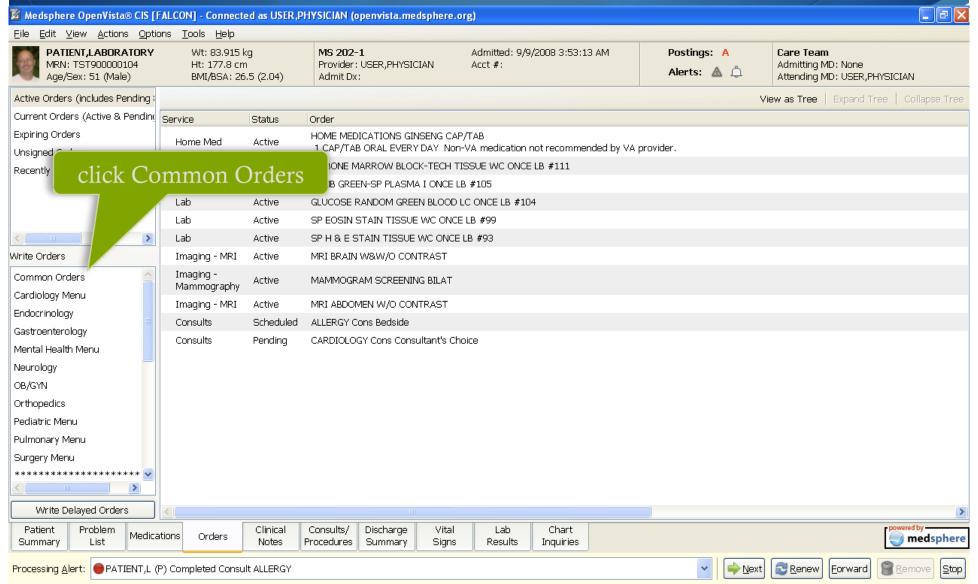


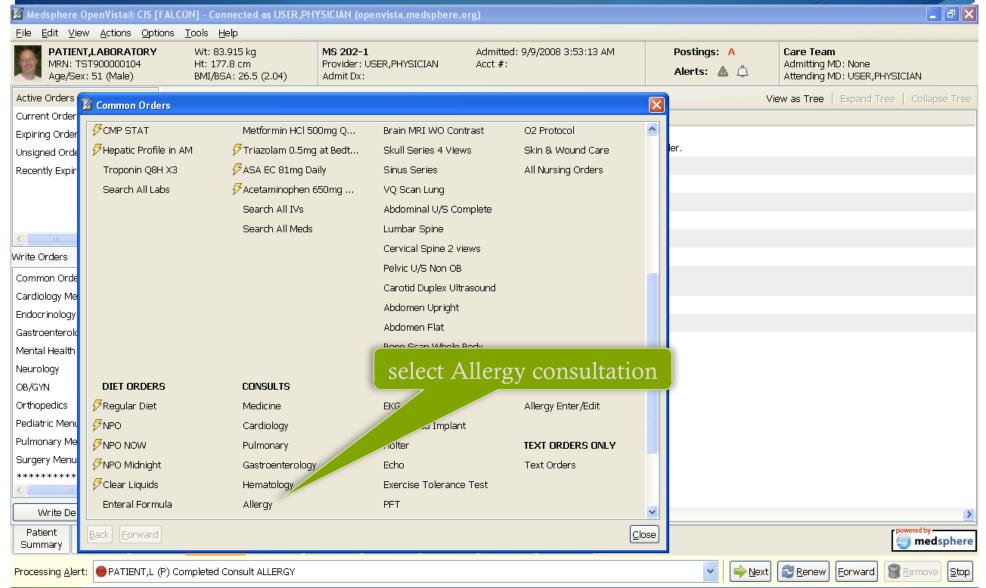
Hickner, 2008; Phillips, 2004

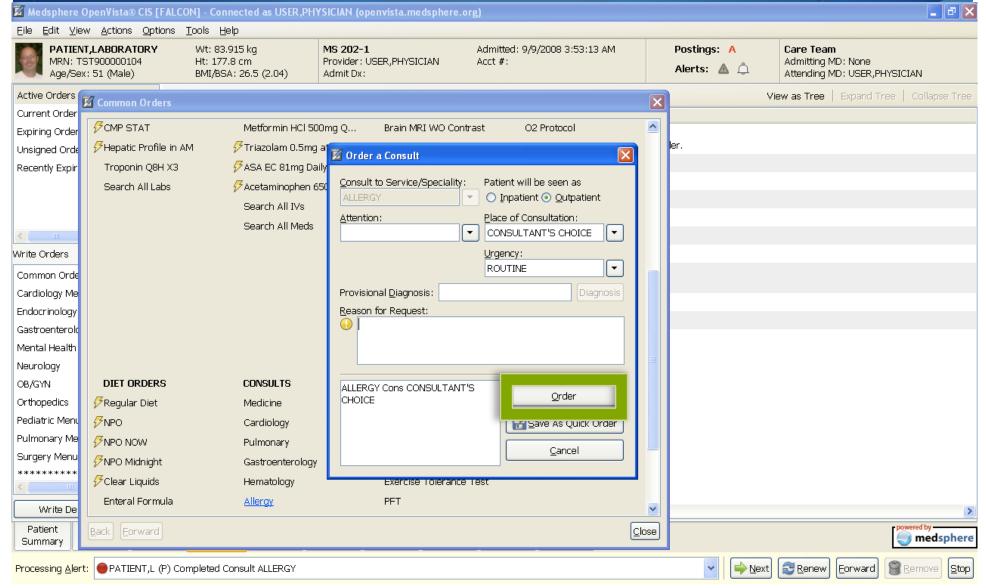
### Veterans Administration View Alert











### Contributions

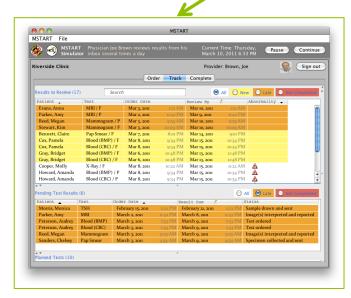
- 1 Observations and interviews with clinicians and discussions of findings for results management
- 2 Evaluations to quantify the benefits in time-critical applications where distractions undermine users' ability to track and react to orders
- 3 The development of guidelines for interactive rich tables with actions for rapid completion (ARCs)
- 4 The design and user studies of a novel retrospective analysis visualization

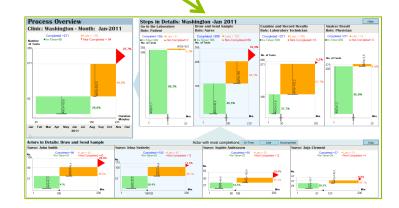
### Solution



Physician, Resident, Assistant

Manager





### Solution



Physician, Resident, Assistant

Manager

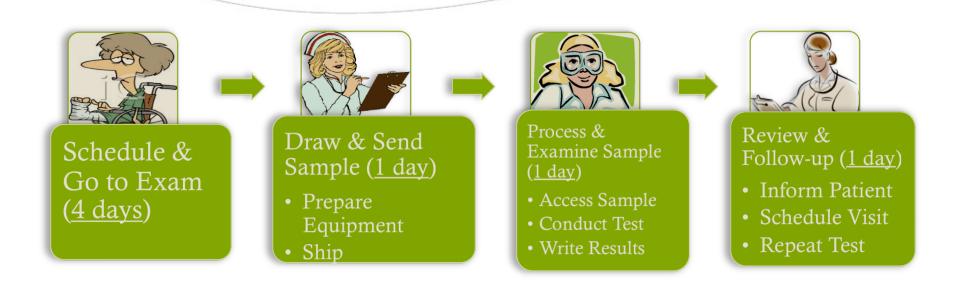




### Requirements Analysis

- Visits to 7 hospitals & clinics
- Observations of the medical workflow
- Electronic Health Record issues reported by clinicians
- Problems related to results management
- Design ideas about use cases, tables, delays, actions

# Results Management Workflow & Actions

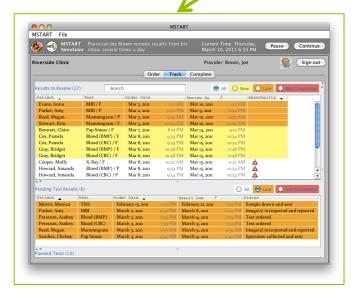


♦ [Aalst, 2005; Cass, 2000; Peterson, 1981; White, 2004]

### Solution

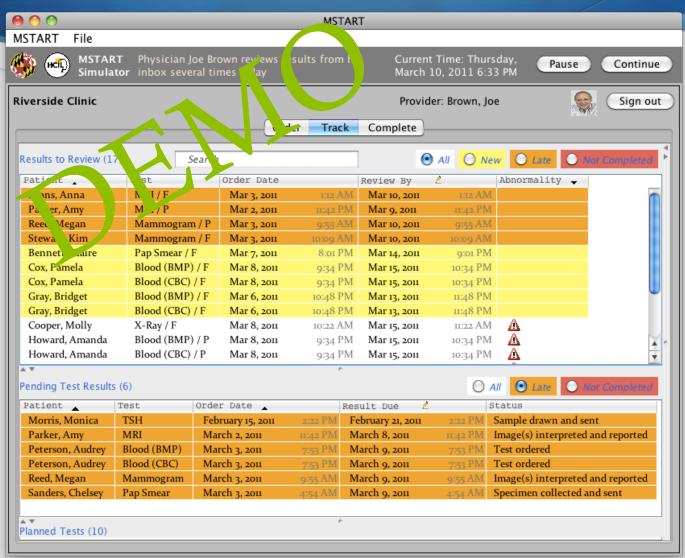
Physician, Resident, Assistant

Manager

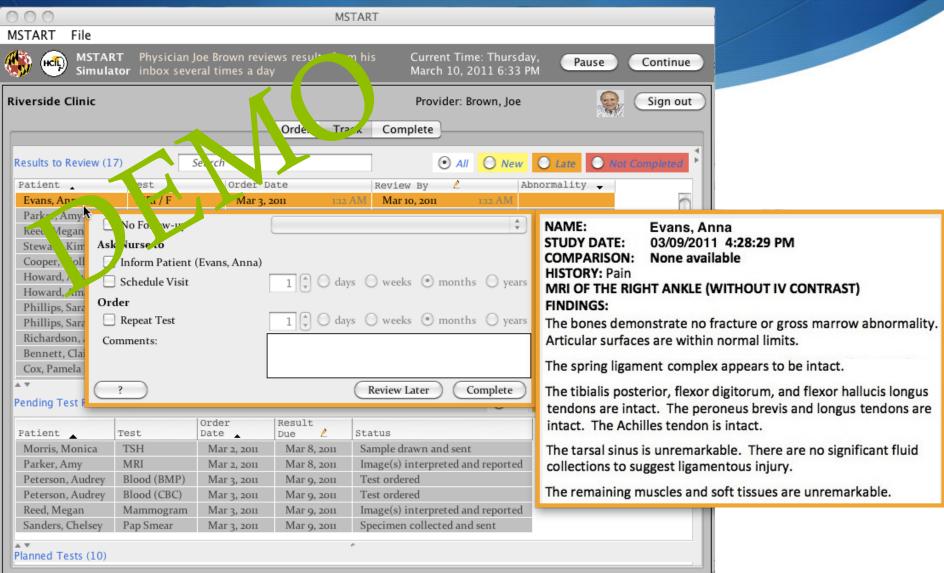




# Timely Management of Medical Orders: MStart



# Timely Management of Medical Results: ARC



### Evaluations

- Controlled Experiment for Awareness of Order Timeliness
- Evaluations of Actions for Rapid Completion

# Iterative Design Reviews with Medical Professionals

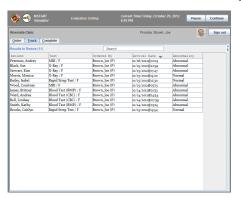
- Participatory design [Greenbaum and Kyng, 1991]
- ♦ Medicine, human-computer interaction, or software engineering
- 40 or more clinicians
- ♦ 30 mins to 2 h each
- Live demonstration or with interactive executable
- Nov, 2010 − Jun, 2011 & Jan − May, 2012

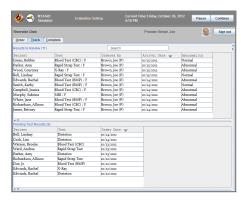
# Iterative Design Reviews with Medical Professionals

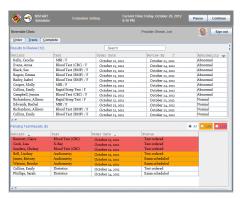
- Feedback on guidelines and evaluation
- Suggestions from a graphic designer
- Refinements to results management workflow
- Updates to prototype interface and interactions
- Design of retrospective analysis visualization

# Controlled Experiment for Awareness of Order Timeliness

- Quantify the benefit of
  - showing a list of pending orders
  - prioritizing by lateness information
- Compare 3 versions
  - Time to answer question: what is late/lost?







### Provide list of orders

### 10/22/2012

Bell, Lindsay	Blood Test (CBC)
Brooks, Caitlyn	Rapid Strep Test
Evans, Anna	Blood Test (BMP)
Smith, Kathy	Blood Test (BMP)

### 10/23/2012

10/23/2012	
Bailey, Isabel	Dietetics
Bailey, Isabel	Rapid Strep Test
Black, Sue	X-Ray
Brooks, Caitlyn	X-Ray
Doe, Jo	MRI
James, Britney	Blood Test (BMP)
Parker, Amy	Audiometry
Peterson, Audrey	MRI
Richardson, Allison	Dietetics
Stewart, Kim	X-Ray
Ward, Andrea	Blood Test (CBC)
Wood, Courtney	Blood Test (CBC)
Wood, Courtney	MRI

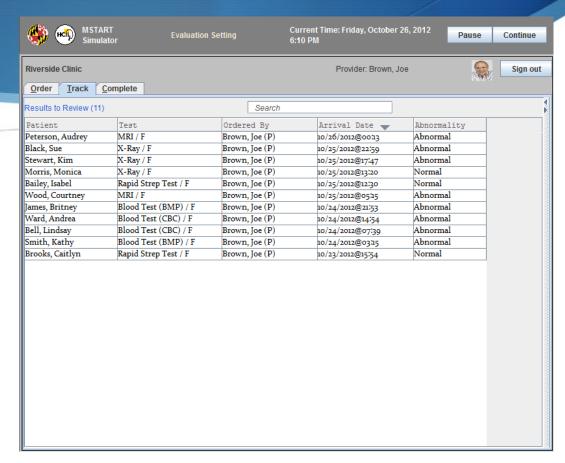
### 10/24/2012

Bell, Lindsay	Blood Test (BMP)
Brooks, Caitlyn	Audiometry
Morris, Monica	X-Ray

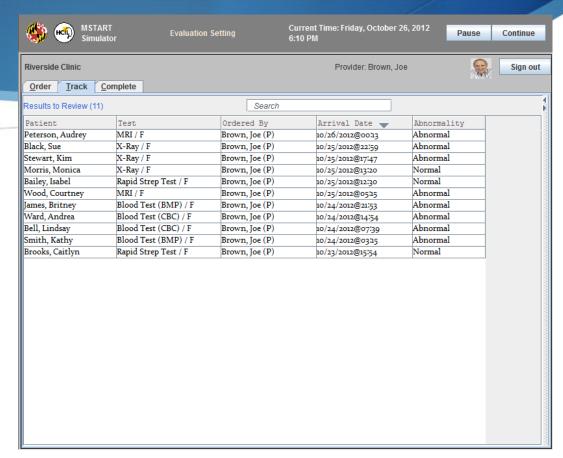
	Expected	Considered
	Duration (Days)	Lost After
		(Days)
Imaging and Lab Tests	1	4
Blood Tests [BMP or CBC]		
Rapid Strep Test		
MRI		
X-Ray		
Mammogram		
Consultations	3	16
Dietetics		
Audiometry		

# A distraction task...

### Results only (sorted by time received)



### Results only (sorted by time received)



Which orders are late? Lost?

### Results only (sorted by time received)

(Compare with orders)

10/	22/	20	12

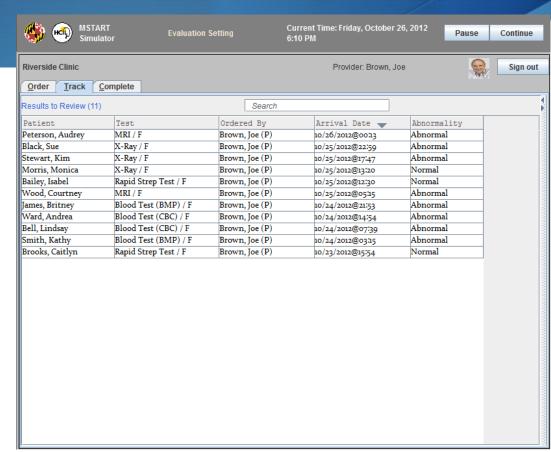
Bell, Lindsay	Blood Test (CBC)
Brooks, Caitlyn	Rapid Strep Test
Evans, Anna	Blood Test (BMP)
Smith, Kathy	Blood Test (BMP)

### 10/23/2012

Bailey, Isabel	Dietetics
Bailey, Isabel	Rapid Strep Test
Black, Sue	X-Ray
Brooks, Caitlyn	X-Ray
Doe, Jo	MRI
James, Britney	Blood Test (BMP)
Parker, Amy	Audiometry
Peterson, Audrey	MRI
Richardson, Allison	Dietetics
Stewart, Kim	X-Ray
Ward, Andrea	Blood Test (CBC)
Wood, Courtney	Blood Test (CBC)
Wood, Courtney	MRI

### 10/24/2012

Bell, Lindsay	Blood Test (BMP)
Brooks, Caitlyn	Audiometry
Morris, Monica	X-Ray



Which orders are late? Lost?

### Add pending orders

### (Compare with orders)

10/22/2012
------------

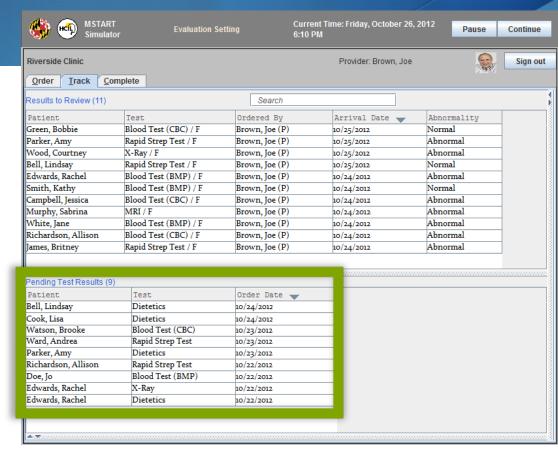
Bell, Lind	say	Blood Test (CBC)
Brooks, C	Caitlyn	Rapid Strep Test
Evans, Ar	nna	Blood Test (BMP)
Smith, Ka	ithy	Blood Test (BMP)

### 10/23/2012

10/23/2012	
Bailey, Isabel	Dietetics
Bailey, Isabel	Rapid Strep Test
Black, Sue	X-Ray
Brooks, Caitlyn	X-Ray
Doe, Jo	MRI
James, Britney	Blood Test (BMP)
Parker, Amy	Audiometry
Peterson, Audrey	MRI
Richardson, Allison	Dietetics
Stewart, Kim	X-Ray
Ward, Andrea	Blood Test (CBC)
Wood, Courtney	Blood Test (CBC)
Wood, Courtney	MRI

### 10/24/2012

Bell, Lindsay	Blood Test (BMP)
Brooks, Caitlyn	Audiometry
Morris, Monica	X-Ray



Which orders are late? Lost?

### Add pending orders (with lateness information)

(Compare with orders)

10/22/2012	
Bell, Lindsay	Blood Test (CBC)
Brooks, Caitlyn	Rapid Strep Test
Evans, Anna	Blood Test (BMP)
Smith, Kathy	Blood Test (BMP)
10/23/2012	
Bailey, Isabel	Dietetics
Bailey, Isabel	Rapid Strep Test
Black, Sue	X-Ray
Brooks, Caitlyn	X-Ray
Doe, Jo	MRI
James, Britney	Blood Test (BMP)
Parker, Amy	Audiometry
Peterson, Audrey	MRI
Richardson, Allison	Dietetics
Stewart, Kim	X-Ray
Ward, Andrea	Blood Test (CBC)
Wood, Courtney	Blood Test (CBC)
Wood, Courtney	MRI
10/24/2012	
Bell, Lindsay	Blood Test (BMP)
Brooks, Caitlyn	Audiometry

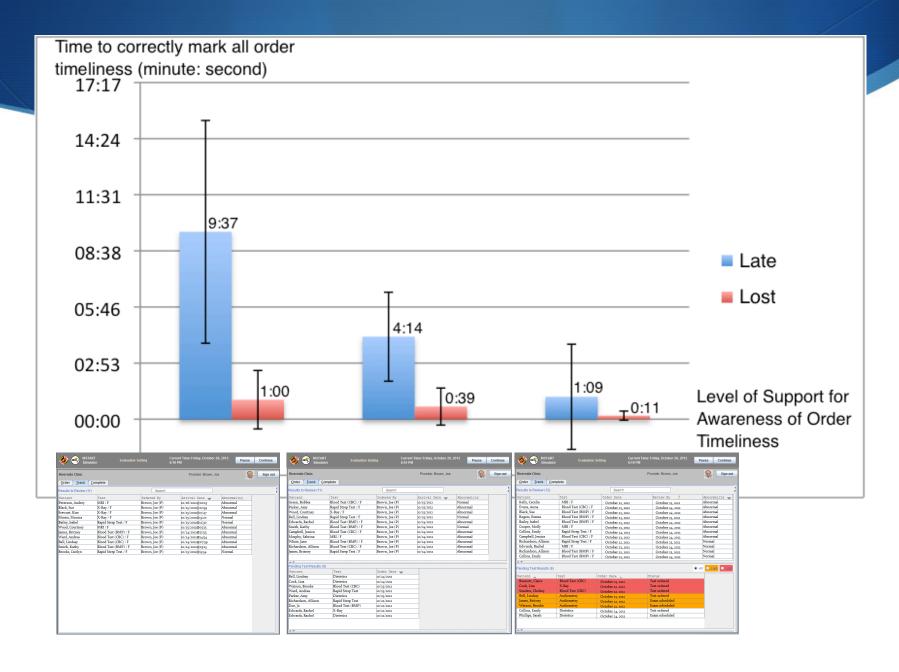
X-Rav

Morris, Monica

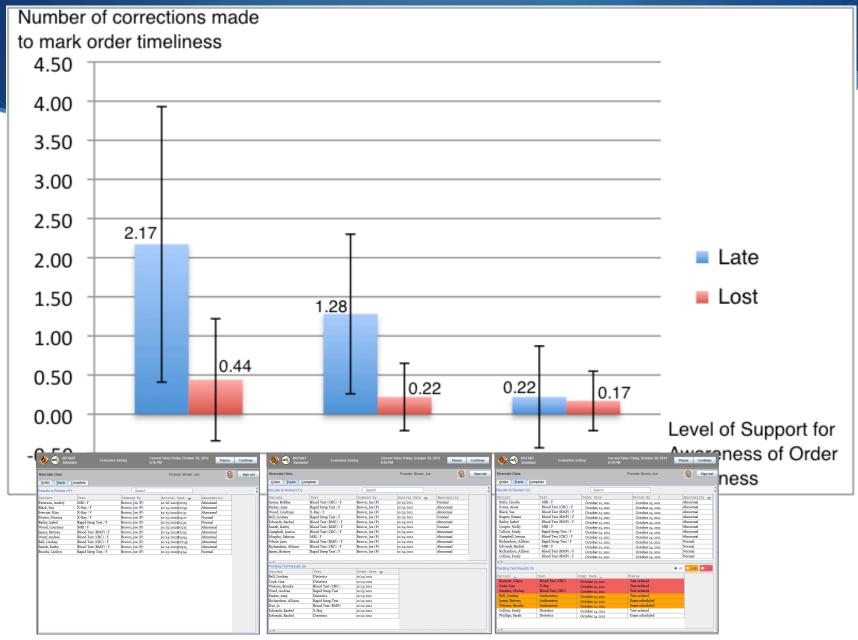
iverside Clinic			Provider: Brown, Joe	Sign ou
Order Track Com	pplete			2000000
Order Track Con	ipiete			
esults to Review (12)		Search		
atient	Test	Order Date	Review By 🙎	Abnormality -
Kelly, Cecelia	MRI / F	October 22, 2012	October 23, 2012	Abnormal
Evans, Anna	Blood Test (CBC) / F	October 23, 2012	October 24, 2012	Abnormal
Black, Sue	Blood Test (BMP) / F	October 23, 2012	October 24, 2012	Abnormal
Rogers, Emma	Blood Test (BMP) / F	October 23, 2012	October 23, 2012	Abnormal
Bailey, Isabel	Blood Test (BMP) / F	October 23, 2012	October 24, 2012	Abnormal
Cooper, Molly	MRI / F	October 23, 2012	October 24, 2012	Abnormal
Collins, Emily	Rapid Strep Test / F	October 24, 2012	October 24, 2012	Abnormal
Campbell, Jessica	Blood Test (CBC) / F	October 23, 2012	October 24, 2012	Abnormal
Richardson, Allison	Rapid Strep Test / F	October 22, 2012	October 23, 2012	Normal
Edwards, Rachel	MRI / F	October 23, 2012	October 24, 2012	Normal
Richardson, Allison	Blood Test (BMP) / F	October 22, 2012	October 23, 2012	Normal
Collins, Emily	Blood Test (BMP) / F	October 23, 2012	October 24, 2012	Normal
•				
ending Test Results (8)				All    Late    Los
Patient _	Test	Order Date _	Status	
Bennett, Claire	Blood Test (CBC)	October 23, 2012	Test ordered	
Cook, Lisa	X-Ray	October 22, 2012	Test ordered	
Sanders, Chelsey	Blood Test (CBC)	October 22, 2012	Test ordered	
Bell, Lindsay	Audiometry	October 23, 2012	Test ordered	
James, Britney	Audiometry	October 22, 2012	Exam scheduled	
Watson, Brooke	Audiometry	October 22, 2012	Exam scheduled	
Collins, Emily	Dietetics	October 24, 2012	Test ordered	
Phillips, Sarah			Exam scheduled	

♦ Which orders are late? Lost?

## Results (18 participants)



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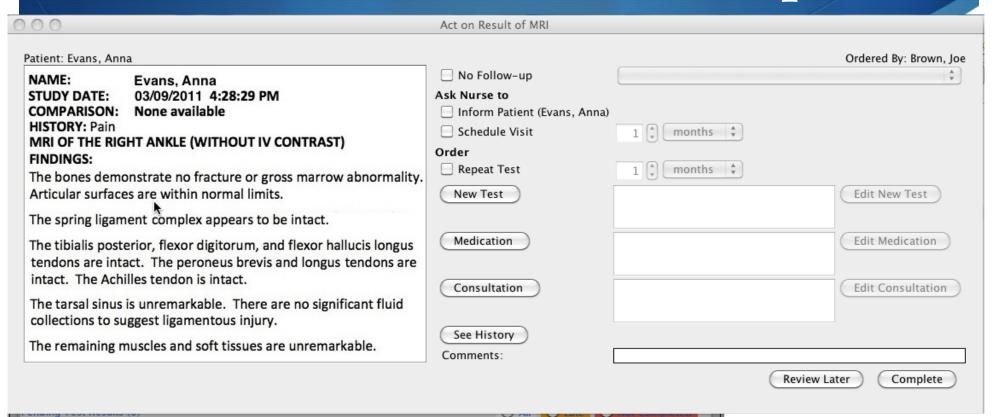
## Predictive Model for Results Management

- Time to compare names  $\approx 0.5$  sec
- $2 < \text{time to look up a date} \le 2.5$

# Evaluations of Actions for Rapid Completion

- Evaluating Time to Execute Actions
- Evaluating the Number of Steps

### Conventional Follow-up



Patient _	Test	Order Date	Result Due 2	Status	
Morris, Monica	TSH	Mar 2, 2011	Mar 8, 2011	Sample drawn and sent	
Parker, Amy	MRI	Mar 2, 2011	Mar 8, 2011	Image(s) interpreted and reported	
Peterson, Audrey	Blood (BMP)	Mar 3, 2011	Mar 9, 2011	Test ordered	
Peterson, Audrey	Blood (CBC)	Mar 3, 2011	Mar 9, 2011	Test ordered	
Reed, Megan	Mammogram	Mar 3, 2011	Mar 9, 2011	Image(s) interpreted and reported	
Sanders, Chelsey	Pap Smear	Mar 3, 2011	Mar 9, 2011	Specimen collected and sent	

## Evaluating Time to Execute Actions\*

Action	Conventional	ARC	ARC w/ Keyboard
Review Later	30s	28s (7%)	26s (13%)
Inform Patient + Confirm	44s	39s (11%)	29s (34%)
Inform Patient + Repeat Test (1 mo) + Confirm	51s	42s (18%)	34s (33%)
Inform Patient + Schedule Visit (1 w) + Confirm	1m 8s	51s (25%)	41s (40%)
No Follow-up (Other) + Confirm	1m 2s	53s (15%)	49s (21%)

<sup>\*</sup>Measured Difference: 10 orders w/o distraction

## Evaluating the Number of Steps

Action	OpenVista	Allscripts	ARC
Inform Patient	-	6	3 (50%)
Confirm	-	5	2 (60%)
No Follow-up	-	4	4 (0%)
Repeat Test	17	-	5 (71%)
Schedule Visit	12	-	5 (58%)

### Design Guidelines

- Results management design guidelines (8)
- ♦ Actions for rapid completion design guidelines (17)

## Results Management Design Guidelines

- Show pending orders
- Prioritize by late/lost status
- Embed actions when appropriate
- Provide retrospective analysis

# Table Design Guidelines

Notifications									
Info	Patient	t Location Urgency Alert Date/Time Message		Message	Forwarded By/When				
	T	GM GM	Urgency  Moderate Moderate Moderate HIGH Moderate Moderate Moderate Moderate Moderate Moderate Moderate Moderate HIGH Moderate HIGH Moderate Moderate Moderate Moderate Moderate Moderate Moderate Moderate HIGH Moderate Moderate Moderate Moderate Moderate Moderate	Alert Date/Time  01/01/2010@03:14  01/01/2010@015:09  01/02/2010@02:06  01/02/2010@08:09  01/03/2010@07:09  01/04/2010@03:23  01/04/2010@03:23  01/05/2010@02:06  01/05/2010@02:06  01/05/2010@08:32  01/06/2010@08:32  01/06/2010@07:09  01/07/2010@05:00  01/08/2010@05:00  01/08/2010@09:07  01/08/2010@09:07  01/08/2010@016:09  01/09/2010@03:09	Scheduled Consult: ORTHOPEDICS Scheduled Consult: NON-INVASIVE ECHO COMPLETED EMERGENCY ROOM NOTE available for ADD'L Medications Nearing expiration Imaging request held: KNEE 3 VIEWS, LEFT Abnormal labs - [TROPONIN I] Abnormal labs - [LIPID PROFILE, COMPREHENSIVE] Abnormal labs - [BASIC METABOLIC PANEL] Labs resulted - [MICROALBUMIN;URINE] COMPLETED PHARMACY PATIENT ENCOUNTER available for Critical lab: CR 2.3 05/27 05:00 Imaging Results, Non Critical: SPINE LUMBOSACRAL MIN 2 VID Discontinued consult DERMATOLOGY Comment Added to Consult PAIN MANAGEMENT AbnI Imaging Resit; Needs Attn: CT ABDOMEN W&W/O CO Completed Consult NURSING CASE MANAGEMENT AbnI Imaging Resit; Needs Attn: MAGNETIC IMAGE LUMBAR S UNSIGNED PRIMARY CARE FOLLOW-UP available for SIGNA				
4						F			

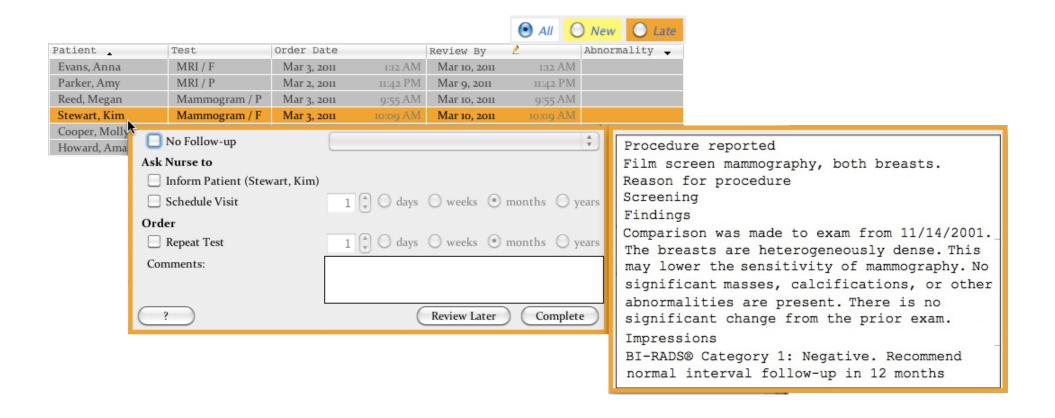
# Table Design Guidelines

• Sorting, icons, colors, columns, labels, filters, layout

						All	O New	O Late
Patient _	Test	Order Date		Review By	2		Abnormality -	
Evans, Anna	MRI / F	Mar 3, 2011	132 AM	Mar 10, 2011		1:12 AM		
Parker, Amy	MRI / P	Mar 2, 2011	11:42 PM	Mar 9, 2011		11:42 PM		
Reed, Megan	Mammogram / P	Mar 3, 2011	9:55 AM	Mar 10, 2011		9:55 AM		
Stewart, Kim	Mammogram / F	Mar 3, 2011	10:09 AM	Mar 10, 2011		10:09 AM		
Cooper, Molly	X-Ray / F	Mar 8, 2011	10:22 AM	Mar 15, 2011		11:22 AM	Δ	
Howard, Amanda	Blood (BMP) / P	Mar 8, 2011	9:34 PM	Mar 15, 2011		10:34 PM	Δ	

[Few, 2004; MSCUI, 2008; Tullis, 2004]

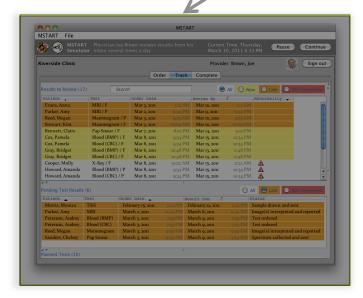
# Actions for Rapid Completion Design Guidelines

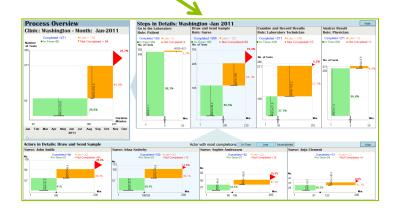


#### Solution

Physician, Resident, Assistant

Manager

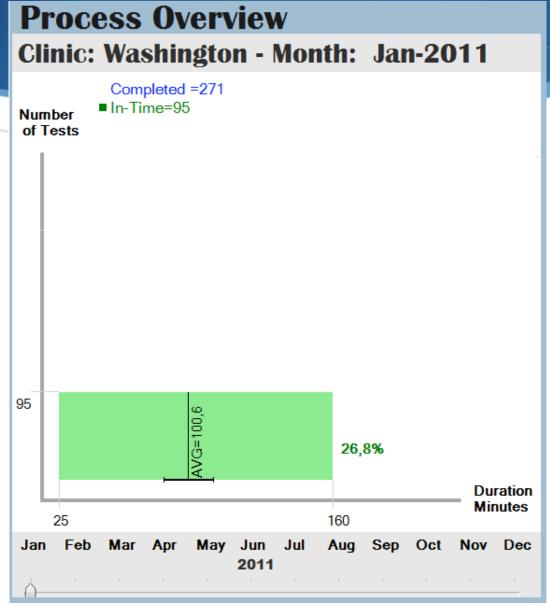




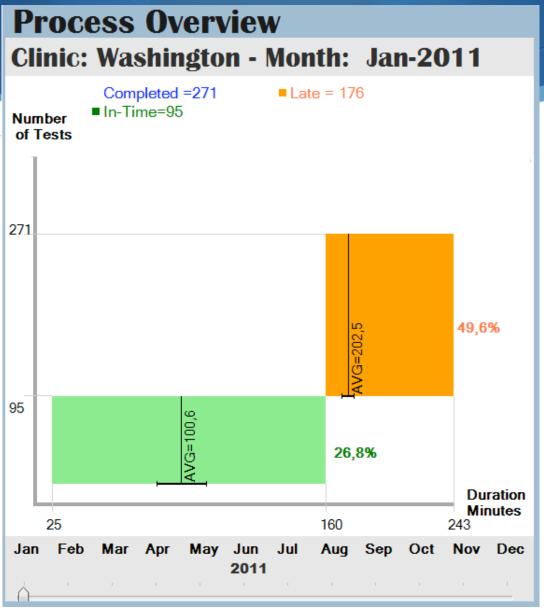
# Retrospective Analysis of Medical Orders: MSProVis



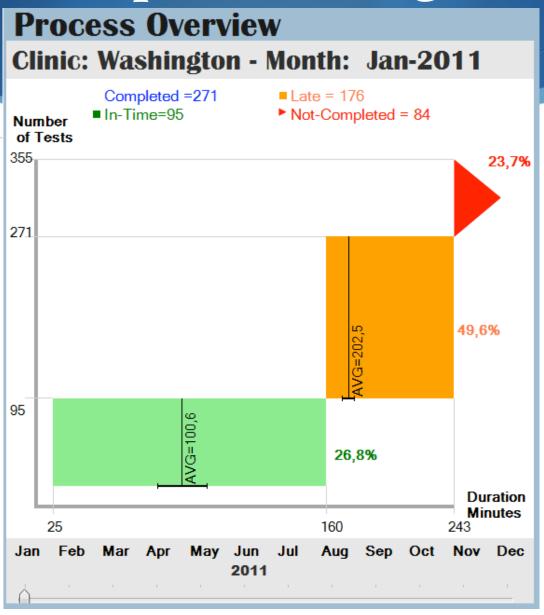
#### Process Completion Diagram (PCD)



# Process Completion Diagram (PCD)



### Process Completion Diagram (PCD)



#### Multi-Step Process Visualization

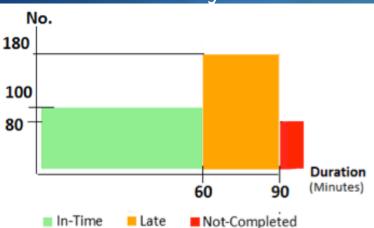


#### Evaluation

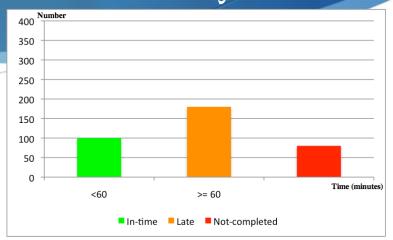
- Usability studies
  - Studies with 5 novices
  - Studies with 2 physicians
- Surveys

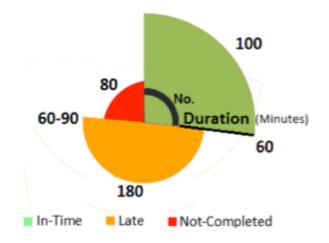
### Surveys

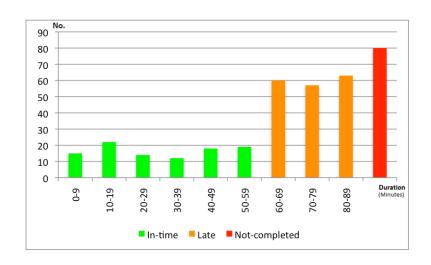




#### Survey 2







#### Conclusion

- 1 Observations and interviews with clinicians and discussions of findings for results management
- 2 Evaluations to quantify the benefits in time-critical applications where distractions undermine users' ability to track and react to orders
- 3 The development of guidelines for interactive rich tables with actions for rapid completion
- 4 The design and user studies of a novel retrospective analysis visualization

#### Conclusion



Provider, Resident, Assistant

Manager

