# Visualizing ERP Usage Logs in Real Time

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Abstract: We present a prototype system that visualizes business process models extracted from usage logs for providing support to Enterprise Resource Planning (ERP) system users in real time. While process mining and visualization techniques are commonly applied to off-line data analytics and process management, far less attention has been focused on how they can be applied in real time to assisting users of complex system interfaces. The approach described in this paper demonstrates the application of interactive visualizations to providing ERP system users with process-, task-, and context-related information during active system use. Such information is vital to the users' understanding of the supported processes and affects their ability to make the most effective use of the system, yet it is typically hidden behind opaque interfaces. Dynamically-generated interactive process visualizations that draw on data captured to usage logs are one way to open a much needed window for ERP users.

## **1 INTRODUCTION**

Enterprise Resource Planning (ERP) systems maintain event logs that record business processrelated information. The availability of these logs makes it possible to discover valuable knowledge that supports decision-making in organizations. For example, process models that describe the actual execution of a business process (e.g., order fulfillment) can be extracted from event logs, checked and validated against the prescribed process design, and improved by identifying problem areas such as bottlenecks and deadlocks (van der Aalst et al., 2011). Despite the development of techniques for managing business workflows (van der Aalst, 2011), far less attention has been paid to applying process mining and visualization in real time for benefiting ERP users (see, for example, Reichert et al., 2012). Rather, these techniques have been used primarily (a) for decision support rather than for operational task support, (b) by management and analysts rather than by end-users, and (c) in offline settings rather than in real-time, online settings (van der Aalst et al., 2010).

The goal of the research presented here is to explore how process mining and visualization can be used to assist ERP system users during active system use. Usability is one of the major factors impacting the success and failure of ERP implementations in organizations (Hestermann, 2009), with users experiencing difficulties in locating tasks, navigating between task pages, and understanding the process context (Babaian et al., 2010; Cooprider et al., 2010). In an earlier paper (Babaian et al., 2007), we explored how process visualizations could be used for aiding users in navigating the steps within a process and monitoring their progress.

In this paper, we focus on an approach for improving the users' understanding of the context of their interactions with the system, the interconnectedness of the tasks they perform and those performed by other users, and the flow of information between tasks and processes. While workflow management systems are useful for guiding users through established processes, users will still find ways to deviate from prescribed procedures (Rozinat and van der Aalst, 2008). The value of our approach comes from exposing users to the realities of system use through visualizations of business process and usage data extracted from system logs in real time. We have developed a prototype that serves as a proof-of-concept of this approach by visualizing various types of information about processes, tasks, and their related contexts, including the following:

• *The Composition of Tasks into Processes*: reveals to users the interconnectivity of the tasks they are working on with other tasks supported by the system.

- The Interface Pages Defined within the System for Performing each Task: strengthens the users' understanding of how ERP transactions they perform with the system map to tasks within a process.
- The Types of Data Objects Specified within the System as Inputs to and Outputs from Tasks, along with Usage Data on the Frequency with which They are passed between Tasks: disclose to users how the performance of other tasks impacts what they are working on as well as how the outputs they are creating may be put to use.
- Detailed Information on the Task Instances Performed by Users, Including the Actual busIness Objects used as Inputs to and Outputs from those Instances: provides crucial details for interpreting and diagnosing error situations; the output objects also make concrete for the users the impact of their actions on other tasks and processes supported by the system.

The information conveyed by these visualizations will help ordinary ERP users understand the often obscure relationships between process tasks, the data encompassed by those tasks, and the people performing them. As a result, we expect users to become more competent and confident in their interactions with the ERP system, thereby requiring less training and a diminished need for external support.

The remainder of this paper is organized as follows. The next section reviews related research. In Section 3, we first present a brief overview of the framework used for usage event logging and process identification. This is followed by the visualizations enabled by our approach and implemented in an ERP prototype. We conclude with directions for future research.

# 2 RELATED WORK

Process visualization is closely related to process mining, which is aimed at automatically extracting process models from event logs (van der Aalst, 2011). Most ERP systems maintain logs recording sequences of events that occur during system use. These sequences are often called process instances, as they represent specific executions of a business process. Process mining seeks to discover the general model of a process that fits and explains most of its instances (van der Aalst, 2010). Reichert (2012) highlights the importance of data flow to process modeling. The organization of the process around the flow and interaction of business objects is key to our own approach to process modeling and process instance identification.

Visualization is often used to present and display the results of process mining in the form of control flows (e.g., Petri Nets), data flows (e.g., Data Flow Diagrams), or social networks. Process visualization has been used to assist management and analysts in examining and monitoring business processes and identifying areas for improvements. For example, the geographic map metaphor can be applied for allowing users to zoom into and out of process graph visualizations (van der Aalst et al., 2011), while graph reduction approaches support the management of large business process specifications (Streit et al., 2005). The Proviado framework provides the means for personalized views of business processes and process instances at different levels of granularity (Reichert et al., 2012)

Despite promising progress, the potential of process visualization for improving ERP usability has yet to be recognized. Several studies have investigated the types of usability issues most frequently experienced by ERP users, and the lack of operational task support has been repeatedly reported as a factor causing negative perceptions of a system's usability (Babaian et al., 2010); (Calisir and Calisir, 2004); (Cooprider et al., 2010). Many ERP systems do not provide search functionality for users to find the correct task pages, there are no recommendations for future actions, and critical process context and progress information is often not easily accessible (Babaian et al., 2010); (Cooprider et al., 2010).

The research we present next investigates ways in which process mining and visualization techniques can be applied to addressing these types of issues, with a focus on revealing process, task, and contextual information to users during active system use.

## **3 RESEARCH DESIGN**

The research presented here is part of a larger project whose goal is to improve the usability of ERP systems. To that end, we have augmented an ERP prototype with a component that generates dynamic, interactive visualizations of systemsupported processes as well as the actual process instances performed by users. The objective of this approach is to improve usability by making transparent to the user: the tasks and processes supported by the system, the composition of tasks into processes, the actual task sequences performed by users, and the flow of information between tasks.

In support of our project's goal, we have developed the Task-Interface-Log (TIL) framework (Lucas and Babaian, 2012). This framework is at the heart of our ERP prototype and supplies the data used by the visualization component, as described next.

### 3.1 TIL Framework Overview

The TIL framework consists of a data model and supporting algorithms for deriving process-related data. While all ERP systems maintain usage logs for auditing and diagnostic purposes, those logs do not capture process structure or directly the interconnectedness of tasks and the users performing them. They are also not configured for ready application to user support. The TIL model was specifically designed to enable a system to effectively utilize usage history, supported process models, process and task instance details, and other contextual data during system-user interactions. The data model represents the system's task structure, interface components, and records of all system-user interactions, with each interaction automatically associated with its task and process context.

The TIL model is comprised of three modules: the Task module, the Interface module, and the Logging module. A Domain module, which is not part of TIL but is referenced by the three TIL modules, is used for representing ERP organizational data.

Tasks and processes are predefined within the Task module in accordance with the system in which the model is embedded. A *task* represents a transaction, such as "add material" or "edit purchase order." *Domain objects* (a.k.a. business objects) correspond to ERP Domain module records and include records on vendors, materials, purchase orders, etc. They are used as inputs to and outputs from tasks.

A *process* is defined in the TIL model as a set of tasks related via the flow of domain objects between them; its specification is independent of usage data and can be customized to meet the needs of a particular organizations.

A *task instance* is defined as the performance of a task by one or more users. For example, two users may work on a task instance associated with adding a purchase requisition, with one user starting the requisition and the second user adding additional information prior to submitting it.

One or more users will work on one or more

tasks within a particular *process instance*. For example, a process instance may consist of an Add Purchase Order task instance performed by one user, an Add Material task instance performed by another, and an Add Goods Receipt task instance performed by a third. Thus, process instances correspond to the actual instantiations and executions of processes by users.

User-system interactions are captured to the Logging module of the TIL model by input-aware interface components. These components are defined in the Interface module and populate the interface pages of the system (i.e., text fields, buttons, and menus).

The TIL model and associated algorithms have been implemented in SQL and embedded in an ERP prototype. The visualization component described in this paper relies on the TIL framework for providing the effective and efficient reconstruction of the process-related data. All of the visualizations presented next were dynamically generated during real-time use of the prototype.

#### 3.2 Process Visualizations

There are a variety of visualizations that can be provided to users for improving system-to-user communication and fostering a deeper understanding of the system and its uses. We have chosen to focus on visualizations that convey the system-specified means for performing a process, the actual process instances performed with the system, and associated contextual information that is typically unavailable to ERP system users. These choices were based on prior research that revealed the need for users to understand the underlying business processes and the contexts of their interactions (Topi et al., 2005).

Prototype ERP					
Add Purchase Order : Enter Header and Defaults					
Date Jan 28	, 2013				
PO Purchase Req	uisition (Optional)				
Purchase Req. ID	5	Lookup	endor: Trans World United		
PO Header Info					
Issue Date	2013-01-15	Lookup			
Vendor	2	Lookup	rans World United		
PO Default Values	i				
Plant	1	Lookup	lew York Plant		
Delivery Date	2013-02-04	Lookup			
Storage Location	2	Lookup	Shelf 2		

Figure 1: Add Purchase Order page from the ERP Prototype with "Display" button for accessing visualizations.

To access the visualization interface, the user of the prototype clicks on a "Display" button, which is available from the bottom of each interface page. As an example, Figure 1 highlights the placement of this button at the bottom of the page for adding a purchase order.

After launching this application, the user views the Process Graph containing the task currently being performed. Clicking on the Process Instance Graph tab shows the current process instance associated with the user's interactions, while selecting any node or link in either of these graphs reveals additional information in the Process Details pane. Figure 2 provides an example of the interface presented to the user after clicking the Display button shown in Figure 1 (the components of this figure are described in detail in Section 3.2.1.). If the user has just logged on and is therefore not yet working on an active process when a Display button is clicked, then the visualization component will show the graphs for the process and process instances most recently worked on by that user. IN

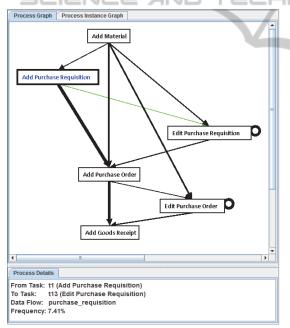


Figure 2: Visualization component displaying process graph that includes the Add Purchase Order task, with additional process details on the selected link in the lower pane.

Since the exemplar purchasing process demonstrated in this paper consists of a small number of tasks distributed across a few hierarchical levels, we have used a simple layout method to place the same-level task nodes at the same height on the panel and then manually manipulated the layout. For large-scale processes, more sophisticated hierarchical layout algorithms (Six and Tollis, 2002; Sugiyama et al., 1981) and graph reduction approaches (Sadiq and Orlowska, 1999; Sadiq and Orlowska, 2000; van der Aalst et al., 2011) can be applied to automatically minimize the number of line crossings and reduce the structural complexity of the generated graph.

Process and Process Instance Graphs, along with the associated detailed information available on their components, are discussed below.

#### 3.2.1 Process Graphs

Process graph visualizations provide the user with information on the tasks comprising a process, the tasks preceding and following a selected task, and the flow of object types between tasks. This information is critical for a user's understanding of the processes supported by the system and how to execute them successfully. It facilitates user awareness of the position of the current task they are working on within a process, where the inputs to that task are coming from, the options available to them upon completion of that task, and potential uses for the output generated by the task. It is often difficult, if not impossible, for users of the leading commercial ERP systems to be able to view this type of information (Babaian et al., 2010); (Calisir and Calisir, 2004). To compensate, users often create notes and usage guides that are then distributed within organizational units (Topi et al., 2006), but that is a far less efficient and costlier approach than having the system convey this information directly to the user.

In addition to making this information available to users during active system use, our approach is further distinguished by incorporating usage log data into process graph visualizations. For example, the frequency with which domain objects flow between different task sequences can be calculated based on the usage log and visualized in the process graphs. We illustrate the system's visualization component with the following examples, which were dynamically generated during use of the prototype.

**Tasks Comprising a Process:** The process graph in Figure 2 shows the node-link diagram for the Purchasing process, with a thicker border around the task the user was working on when the "Display" option was clicked. A blue label bears the name of that task – in this case, the *Add Purchase Order* task. The user can see all of the possible actions that led up to the current task, as well as the possible sequences of actions that can be performed next.

This view of the interconnectedness of tasks can be eye-opening to users who work on discrete tasks and have no means for discovering how what they do fits into the overall process specified within the system.

Flows of Domain Objects: Arrowed links represent the flow of domain objects between tasks. Figure 2 shows that the purchase requisition object output by the Add Purchase Requisition task can be used as an input to two other tasks, Edit Purchase Requisition and Add Purchase Order. Circular links are attached to tasks that can loop back to themselves, such as the editing tasks in the graph. Information on object flow is essential to the users' understanding of the sources for the inputs they use in performing tasks. What is equally if not more important is making users aware of what happens to the outputs produced by the tasks they work on; such awareness drives home the need for checking that the purchase requisition was not only created but was also successfully submitted so that a purchase order can be generated, for example.

**Frequency of Object Flows:** The thickness of each arrowed link in the process graph is proportional to the frequency of the data flow from a source task to a target task. Figure 2 shows that newly created purchase requisitions were passed more frequently to the *Add Purchase Order* task than to the *Edit Purchase Requisition* task. This means that more purchase orders were submitted directly for use in creating a purchase order than were saved and subsequently edited prior to submission. Thus, users can learn about the likely flow of business objects and the implications behind those flows for the processes they work on, as derived from actual usage data.

**Detailed View of Object Flows:** Clicking on a link turns it green and displays additional information about it in the Process Details pane. Figure 2 contains the results of clicking on the link going from the *Add Purchase Requisition* node to the *Edit Purchase Requisition* node, including the type of object passed between the two (purchase requisition, in this case) and the frequency with which a purchase requisition task to the *Edit Purchase Requisition* task to the *Edit Purchase Requisition* task. Clicking on the link therefore reveals the numeric data that underlies the observable thickness of each link.

**Detailed View of Tasks in a Process:** Clicking on a node also turns it green and provides additional information about the task it represents. Figure 3 shows details associated with two of the nodes in the

process graph, obtained by first clicking the *Add Purchase Requisition* node followed by clicking the *Edit Purchase Requisition* node. This data informs the user of the ID and textual description for each selected task along with the names of the interface pages in the system to be used in performing it. For example, it reveals that the *Add Purchase Requisition* task interface consists of two pages: *Enter Header and Defaults*, and *Enter Line Items*. This helps users understand how the interface pages they make use of are linked to particular tasks within a process and also serves to aid users in navigating the system.

The information we are currently visualizing and making available in the Process Details pane on tasks and links is by no means exhaustive. Any parameters directly associated with these components or derivable from the usage log could be presented. We have selected a meaningful initial subset that our investigations have shown would be useful in order to demonstrate the capabilities of our approach.

Task: Output:	t1 (Add Purchase Requisition) purchase_requisition	<b>^</b>
Page(s):	- Enter Header and Defaults - Enter Line Items	=
Task: Output: Page(s):	t13 (Edit Purchase Requisition) purchase_requisition	
5.17	- Edit Purchase Requisition - Edit Line Items	

Figure 3: Additional information displayed in Process Details area from clicking on two nodes in the process graph of Figure 2.

#### **3.2.2** Process Instance Graphs

While process graphs reveal the relationships between tasks within a process, as specified within the system, process instance visualizations provide detailed information on actual executions of processes by users of the system. Users can see all task instances within a particular process instance, as well as the instantiated domain objects serving as inputs to and outputs from those instances. Process instance graphs and associated visualizations can be particularly effective for conveying information to new users about how tasks performed by others in the organization contribute to the process instances on which they work. These visualizations can also provide critical information to any user facing an error situation, for which system support is often inadequate (Topi et al., 2005).

The following examples illustrate the information conveyed by the process instance visualizations.

Task Instances Comprising a Process: The process instance graph in Figure 4 shows the nodelink diagram for an instantiated process instance. The label on each node shows the task instance ID, the name of the represented task, and the ID of the instantiated domain object associated with that particular task instance. In this example, one can easily see that Purchase Order (PO) #65 was generated from Purchase Requisition (PR) #5. We know from the circular link on the Edit Purchase *Requisition* task in the process graph of Figure 3 that the editing task can be repeated multiple times; what we learn from the process instance graph is that, in this particular execution of the process, PR #5 was edited twice. While the process graph also revealed that materials can be added to several different tasks, we can see that in this case, a new material was added during the creation of PR #5 and another was added during the second editing of that PR.

As previously mentioned, a user can access the visualization component while either involved in a task or after having just logged on to the system. Each of these "usage scenarios" is likely to have different implications for how the information conveyed by the visualizations will be most helpful.

In Usage Scenario 1, the user clicks on the "Display" button while performing a task. The current process instance is then displayed, with the current task instance the user is working on surrounded by a thick border and bearing a blue label. For example, the view shown in Figure 4 was generated from the Add Purchase Order interface shown in Figure 1. In this case, the user is made aware of the actual chain of events that led up to the creation of Purchase Order #65. If the user experiences an error situation, such information can be very useful in interpreting the error message and identifying possible sources of the error. While commercial ERP systems store this same type of information, the ability to trace back through the history of task instances and domain objects leading to the current state is something that only the most experienced users who have undergone rigorous training are typically able to do.

In Usage Scenario 2, the user clicks the "Display" button after having just logged on to the system. In this case, the process instance most recently worked on by the user is displayed. Now the thick border and blue label indicate the task

instance the user performed most recently. This view can be particularly helpful to the user who has not logged on for an extended period of time and needs a reminder of her most recent interactions with the system.

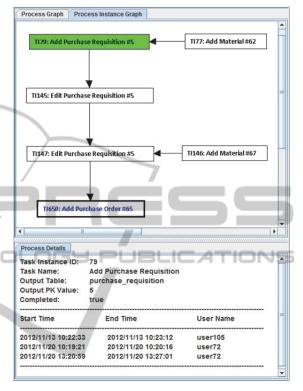


Figure 4: Process instance graph showing the history of Task Instance TI650 with additional details of the selected node in the Process Details pane.

**Detailed Histories of Task Instances and Associated Domain Objects:** Clicking on a node in a process instance graph turns it green and reveals detailed information on the task instance and the output it produces, as shown in the Process Details pane of Figure 4. As noted earlier, the type of information displayed in the details pane should be customized to the needs of the users of the system, with the data we have included here providing an illusory example.

Task instance identification information, the output table where the domain object that was produced is stored, the identifier of that object (i.e., its primary key value), and whether or not the task instance was completed are displayed first. This is followed by information on who worked on the task instance and when. Figure 4 shows that user105 initiated the creation of PR #5. One week later, user72 edited that PR in two separate sessions on the same day. Note that the two editing sessions are also

represented by the two editing task instance nodes in the graph: TI145 and TI147; clicking on the node for a task instance that instantiated a new domain object (in this case, PR #5) reveals the full history of that object's creation.

As with the process instance graph, the detailed information on task instances will also have implications for users that vary by usage scenario. Under *Usage Scenario 1*, where the user is engaged in an ongoing process, the most useful information is likely to be that detailed data on task instance performance. Whether the user runs into an error situation or just needs more information about the data he is working with, he will be able to trace the sequential order in which the task instances were performed and the domain objects were created. Typically this type of information is only available to users who have experience with using a reporting module, and even then, some time may be needed to pull the relevant pieces together.

If the user does happen to encounter an error that he cannot resolve, then the information on output tables and primary keys can be very helpful to ERP support personnel.

Under Usage Scenario 2, in which the user has just logged on, the completion status parameter recorded for a task instance can be especially relevant. The user can click on the task instance she worked on most recently and be reminded of whether or not she finished it. From there, she can click on preceding task instances within the process instance graph to further remind herself about the context of the work she was doing. For example, the person who last worked on Purchase Order (PO) #65 could see if she had completed the order. If she had not, she could then view the details on Purchase Requisition #5 to see who had been involved in the requisition task leading up to the placement of that order. While there are other ways to get this type information, being able to easily do so through the system saves the user time and directs her attention to the task at hand.

# 4 CONCLUSIONS AND FUTURE RESEARCH

We have presented an approach that provides users with a deeper understanding of the processes they perform with the system and the contexts of their interactions via real-time, interactive visualizations. By drawing on the system's knowledge of its own functionality in conjunction with usage data, process visualizations present users with the systemsupported task sequences for performing a process, the flow of domain objects between tasks, the position of the task the user is currently performing within the available sequences, and usage statistics on the paths between tasks. Understanding the relationships between tasks and how processes are typically performed within the organization is essential for developing true proficiency with the system.

Process instance visualizations provide detailed views of actual process instances performed by the user, including the current instance being worked on as well as the most recently performed task. The former allows the user to trace back through the context of the current interaction. Having the ability to follow the paths of the actual domain objects that were inputs to and outputs from each task instance is particularly useful in interpreting, diagnosing, and resolving error situations. Providing details on a user's most recently performed task instance and the process context within which that task was performed serves to orient the user and remind her of recent work.

The visualizations of higher level processes coupled with detailed process instances provide users with a much needed window into how processes are enabled by the system and performed in practice. Addressing the lack of visibility provided by ERP systems can have a profound impact on the ability of users to make the most effective use of these complex systems.

In future work, we will explore additional visualizations for assisting users, such as deriving navigable process sequences based on process instances successfully completed by a specified group of users within a particular time period. While our approach has been implemented in a prototype, methods for integrating it into existing ERP systems will also be investigated.

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