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Multi-relationship evaluation design: Formalization of an automatic test plan generator

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ABSTRACT

The number of intelligent and advanced technologies in the manufacturing, military and homeland security industries is increasing. Evaluating these technologies is a critical step in their development cycle. Test designers have put forth considerable effort in creating methods to accelerate the test-plan development process. The multi-relationship evaluation design (MRED) methodology is an automatic test plan generator. MRED collects multiple inputs, processes them interactively with a test designer and outputs evaluation blueprints that specify key test-plan characteristics. This paper describes MRED's process and presents the mathematical representations used by MRED and the stakeholder preference handling strategy. A robot arm is the example used to demonstrate MRED.

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1. Introduction

Intelligent and advanced technologies are currently deployed in manufacturing, military, homeland security and automotive sectors of industry. Evaluation events are critical steps in the development of these advanced systems. Evaluation events inform the technology developers of specific needs for enhancement, capture end-user feedback, and verify the technology's functionality. Test exercises are an opportunity to realize the technology's current abilities and limitations and inform future test efforts. Here, "the term test refers to a planned evaluation event or exercise focused on capturing data to generate performance metrics of a specific technology under scrutiny" (Weiss, Schmidt, Scott, & Schlenoff, 2010). Evaluation designers expend considerable effort in creating methods to accelerate the test-plan development process (Sukhatme & Bekey, 1995). These efforts are most visible when designers must produce intricate test plans to evaluate intelligent and advanced technologies. Numerous researchers have documented the importance of evaluations and how they guide artificial intelligence (AI) system research and development (Cohen & Howe, 2008; Gao & Tsoukalas, 2002).

The multi-relationship evaluation design (MRED) methodology is an automatic test plan generator that will allow evaluation designers to accelerate the test-plan development process. MRED collects multiple inputs from various source categories and automatically outputs evaluation blueprints that specify key test-plan

characteristics. MRED input comes from stakeholders, who provide not only their preferences, but also technology state assessments and the resources available for testing. This information along with the relationships among these inputs is combined as input into the MRED algorithm.

Stakeholder preference capture and processing is a critical function of MRED and a significant point of emphasis in this paper. These subjective preferences are supported by each Stakeholder's knowledge of the facts. Providing preferences to ultimately select evaluation blueprints is different than what is encountered in product development. Each class of Stakeholders could potentially select entirely unique test-plan blueprints with very different test elements. This is not the case in product development where preferences provided on constituent attributes (product size, weight, etc.) all contribute to the same overriding goal of profit for the business. In product development, the decision-makers are usually all employees of the same entity. In the typical development of advanced technology evaluation, input from different Stakeholders (often with competing interests) is collected and processed for decision-making. This effort leverages evaluative voting discussed in Section 4.5 (Hillinger, 2004).

This paper is outlined as follows: Section 2 presents the overall MRED methodology; Section 3 describes the example to which MRED will be applied; Section 4 mathematically formalizes the MRED process; and Section 5 concludes the paper.

2. Multi-relationship evaluation design

MRED is an interactive algorithm that processes input categories and outputs one or more constituent test plan elements in

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one or more evaluation blueprints (Fig. 1) (Weiss & Schmidt, 2012). MRED leverages the relationships across the inputs and the influences the inputs have on the outputs. The overall methodology was proposed in Weiss and Schmidt (2011a) while the output blueprint evaluation elements were defined in Weiss et al. (2010), Weiss and Schmidt (2010). The relationships between specific inputs and outputs were presented in Weiss and Schmidt (2011b, 2011c). This section presents the MRED model inputs, and output blueprint elements as shown in Fig. 1.

2.1. Input categories

MRED relies upon information, data, and preferences from five categories (shown in Fig. 1).

2.1.1. Technology test levels (TTLs)

TTLs are defined as the technology's constituent Components and Capabilities along with the System, in its entirety (Weiss et al., 2010; Weiss, 2012). They are defined as:

- **Component** – Essential part or feature of a System that contributes to the System's ability to accomplish a goal (s).
- **Capability** – A specific ability of a technology. A System is made up of one or more Capabilities. A Capability is enabled by either a single Component or multiple Components working together.
- **System** – A group of cooperative or interdependent Components forming an integrated whole to accomplish a specific goal (s).

2.1.2. Metrics

Pertinent Metrics are also input according to the input TTLs. Metrics fall into one of two groups:

- **Technical performance** – Metrics related to quantitative factors (e.g. accuracy, distance, time, etc.)
- **Utility assessments** – Metrics related to qualitative factors that express the condition or status of being useful and usable to the target user population.

2.1.3. Technology state – maturity

MRED defines Technology state as a technology's fitness for testing. Technology state is described by the element of Maturity which is identified for each individual TTL (Weiss & Schmidt, 2011c). Maturity is defined with respect to MRED as: the state of development of individual Components, Capabilities, and the System. A tech-

nology's Maturity has a direct impact on whether a specific TTL is ready for testing and what, if not all, functions are available. Maturity must be input into MRED for a TTL to be considered for evaluation. The Maturity level is defined for the System (i.e. the overall technology) and for each individual Capability and Component that are to be tested. At any time during development, the Maturity of the System, its Components and its Capabilities will be defined as one of the following:

- **Immature** – The technology test level being tested has yet to be developed or is still in the process of being developed.
- **Fully developed** – The Technology test level is developed to the point of being operational and complete. A TTL that is classified as fully-developed has all associated behaviors available.

Additional details on the technology state elements including maturity can be found in Weiss (2012), Weiss and Schmidt (2011c).

2.1.4. Test resources

This category of inputs signifies the availability of the viable environments, tools, and personnel. They are defined as:

- **Environment** – The physical venue, supporting infrastructure, artifacts, and props that will support the test(s). The environment can influence the behavior of the personnel and can restrict which TTLs can be tested. MRED defines three different environments: lab, simulated, and actual.
- **Tools** – The tools, equipment, and/or technology that will collect quantitative and/or qualitative data during the test. tools also include the means to produce the necessary metrics from the captured data. Tools are defined based upon the nature of the metrics they are used to capture. This means that an evaluation may call for technical performance tools and/or utility assessment tools.
- **Personnel** – Individuals that will use the technology and indirectly interact with the technology. These include:
 - **Tech users** – Personnel that use the technology during the evaluation. These individuals are either identified as end-users, trained users, or technology developers.
 - **Team members** – Individuals that interact with tech users during the evaluation to realistically support the scenario that the technology is immersed.
 - **Participants** – Individuals that indirectly interact with the technology during an evaluation.

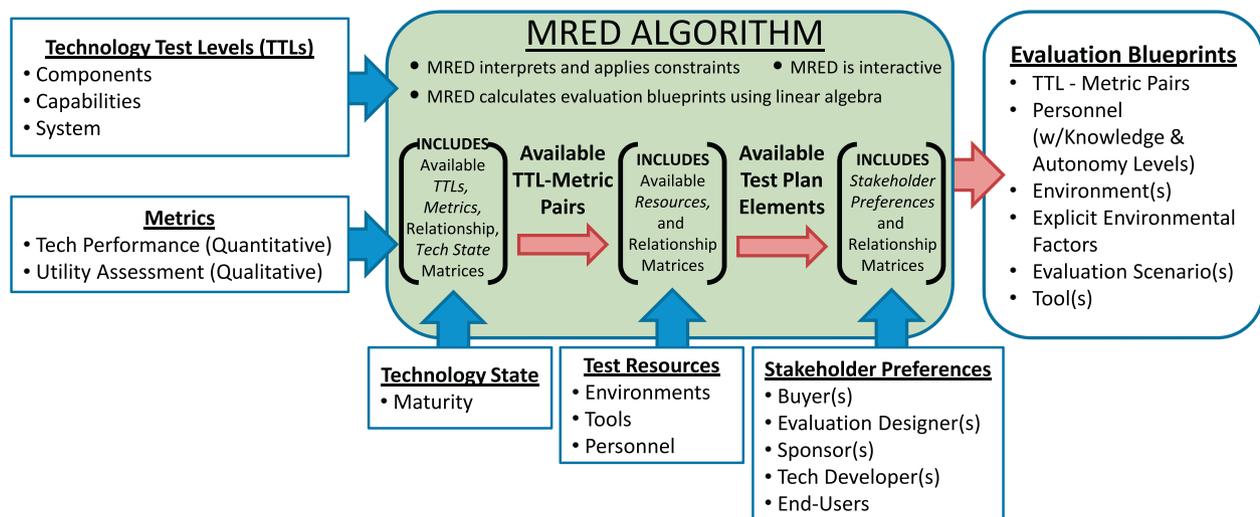


Fig. 1. MRED model with input and output (Weiss, 2012).

Test resources have been detailed in Weiss (2012), Weiss et al. (2010), Weiss and Schmidt (2010).

2.1.5. Stakeholder preferences

This last category includes preferences from five specific individuals (or groups) and was originally detailed in Weiss and Schmidt (2011b). The five individuals are:

- Buyer(s) – Stakeholder(s) purchasing the technology
- Evaluation designer(s) – Stakeholder(s) creating the test plans by determining and identifying the MRED inputs
- Sponsor(s) – Stakeholder(s) paying for the technology development and/or evaluation
- Technology developer(s) – Stakeholder(s) designing and constructing the technology
- User(s) – Stakeholder(s) that will be or is already using the technology

Stakeholders provide their preferences with respect to the TTL-Metric pairs,² environments, tools, personnel, explicit environmental factors, and evaluation scenarios (Weiss & Schmidt, 2010, 2011a).

2.2. Output evaluation blueprints

Each set of blueprints will include one (or more) TTL-Metric pairs, an Environment for testing, Tools to support the collection and analysis of data to generate the corresponding Metric(s) (Weiss & Schmidt, 2010), personnel including those who will test the technology and those who will execute the evaluations (Weiss et al., 2010; Weiss & Schmidt, 2011b), knowledge and autonomy levels for those Personnel who will directly and indirectly interact with the technology during the test (Weiss & Schmidt, 2011b) evaluation scenarios describing the type of exercises in which the technology will be immersed and explicit environmental factors which indicate the levels of feature complexity and feature density within the environment (Weiss & Schmidt, 2010).

2.3. Relationships

Relationships are a core element to MRED and are defined among the various inputs and between inputs and outputs. Relationships defined between the inputs and outputs have been discussed extensively in previous work. Several of the relationships among the inputs include:

- Components and capabilities – This relationship is the influence each component has on performing or realizing the capabilities within the system. It is defined in a single binary matrix.
- Metrics and TTLs – This relationship is defined in two binary matrices and indicates which metrics are applicable to each TTL. The first matrix (U_1) represents which technical performance metrics can be produced when testing the TTLs. The second matrix (U_2) represents which quantitative assessment metrics can be produced when testing the capabilities and the system.
- TTLs and environments – This relationship indicates which of the available environments each of the TTLs can be evaluated within. It is defined in three binary matrices. The first matrix (X_1) represents which components and capabilities can be evaluated within the lab environments; the second matrix (X_2) represents which TTLs (among all three types) can be evaluated within the simulated environments; and the third matrix (X_3) indicates which capabilities and the system can be evaluated within the actual environment(s).

² TTL-metric pairs are specific Technology test levels and metrics that are coupled together. Multiple TTLs can be coupled with the same metrics and vice versa.

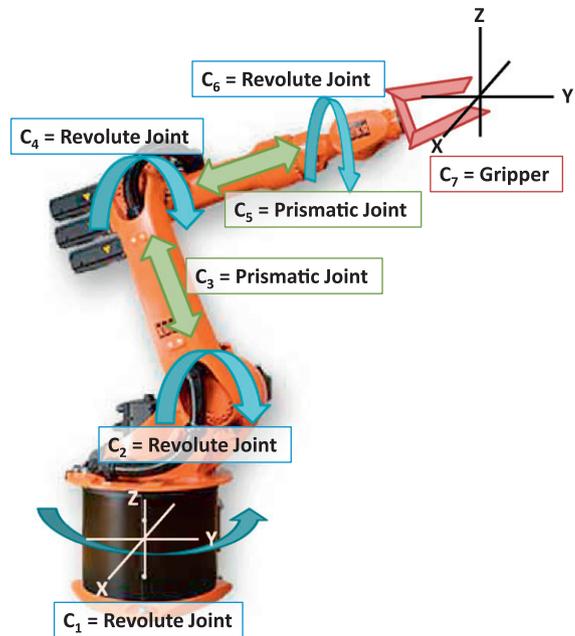


Fig. 2. Robotic arm¹⁴.

- Metrics and tools – This relationship denotes which tools are necessary to collect data in support of the candidate metrics and is defined in two binary matrices. Y_1 , the first matrix, indicates which tools are necessary to collect data in support of the candidate technical performance metrics; Y_2 denotes which tools are required to collect data in support of the candidate utility assessment metrics.

Before presenting the formalized MRED model an illustrative example is introduced. This example is refined throughout the formalization to highlight each step in the process.

3. Example – robotic arm

An example robotic arm is used to present the MRED process. The example robotic arm, shown in Fig. 2, is a System with 7 Components (C_1 , C_2 , C_4 and C_6 are revolute joints; C_3 and C_5 are prismatic joints; and C_7 is a gripper). These 7 Components function to provide 7 Capabilities (P_1 , P_2 , and P_3 are translation in X, Y, and Z of the end-effector; P_4 , P_5 , and P_6 are roll, pitch, and yaw of the end-effector; and P_7 is grasping). Note that the reference frame of these Capabilities is the coordinate frame at the tool point with respect to the base shown in Fig. 2. The TTLs, Metrics, and Technology State elements are discussed in Section 4 as MRED is applied to this example.

This robotic arm example is an abstract example and is not indicative of any specific system currently on the market. The original image used in Fig. 2 is modified to illustrate the MRED. The example, with stated Components and Capabilities, is designed to illustrate MRED. Likewise, this simple example does not include the many other factors that would likely be assessed in developmental testing (e.g., user interface, controller).

4. Process formalization

MRED's overall process is formally presented in this section. Each of the subsections provides detail on one or more of the specific steps within MRED. The robotic arm example is used to highlight the process.

Table 1
TTLs and metrics defined for robotic arm.¹⁵

c=	Rev 1 (C ₁)	Rev 2 (C ₂)	Pris 1 (C ₃)	Rev 3 (C ₄)	Pris 2 (C ₅)	Rev 4 (C₆)	Gripper (C ₇)	
p=	X (P ₁)	Y (P ₂)	Z (P ₃)	Roll (P ₄)	Pitch (P ₅)	Yaw (P₆)	Grasp (P ₇)	
φ = 7								
t=	Maximum force	Maximum linear velocity	Maximum torque	Maximum angular velocity	Range of motion	Maximum lift capacity	Speed	Force
α = 8								
a=	Responsiveness		Smoothness		Satisfaction			
β = 3								

4.1. TTLs, metrics, and relationships

MRED begins with the MRED operator³ inputting the available TTLs and corresponding metrics (both technical performance and utility assessment). The sets of τ components (c), φ capabilities (p) and the system (s) are defined as:

$$c = \{c_1, c_2, \dots, c_\tau\} \tag{1}$$

$$p = \{p_1, p_2, \dots, p_\phi\} \tag{2}$$

$$s = 1 \tag{3}$$

The sets of α technical performance metrics and β utility assessment metrics are expressed as:

$$t = \{t_1, t_2, \dots, t_\alpha\} \tag{4}$$

$$a = \{a_1, a_2, \dots, a_\beta\} \tag{5}$$

Table 1 applies these definitions to the robotic arm example. Note that this is a simplified example and presents a subset of the Metrics that could be potentially captured in evaluations of this technology. The first row of the table, “c=” defines the seven Components while the third row of the table denotes the seven Capabilities of the robotic arm. The fifth row, “t=” specifies eight example Technical Performance Metrics while the seventh row, “a=” states three example Utility Assessment Metrics.

This small quantity of Metrics is defined to maintain the simplicity of the robotic arm example. As similarly stated in Section 3 with Components and Capabilities, a more realistic example would contain a greater amount of quantitative and qualitative Metrics.

Next, the MRED operator defines two sets of relationships; the components and capabilities relationship matrix and the metrics and TTLs relationship matrices. The components and capabilities relationship matrix, O, is defined:

$$O = \begin{matrix} & p_1 & p_2 & \dots & p_\phi \\ \begin{matrix} c_1 \\ c_2 \\ \vdots \\ c_\tau \end{matrix} & \begin{bmatrix} o_{11} & o_{12} & \dots & o_{1\phi} \\ o_{21} & o_{22} & \dots & o_{2\phi} \\ \vdots & \vdots & \vdots & \vdots \\ o_{\tau 1} & o_{\tau 2} & \dots & o_{\tau\phi} \end{bmatrix} \end{matrix} \tag{6}$$

Values of O are either 0 or 1 where a 1 indicates that a specific component influences the function of a specific capability while a 0 indicates no such relationship exists. Table 2 presents the corresponding O matrix for the robotic arm example.

Two metrics and TTL binary relationship matrices are defined. U₁ indicates which of the quantitative technical performance metrics can be measured from each type of TTL. U₂ indicates which of the qualitative utility assessment metrics can be measured from the capabilities and the system. Table 3 presents the U₁ relationship matrix while U₂ would appear similarly.

Table 2
O Relationship matrix for robotic arm.

Components	Capabilities						
	X (P ₁)	Y (P ₂)	Z (P ₃)	Roll (P ₄)	Pitch (P ₅)	Yaw (P ₆)	Grasp (P ₇)
Rev 1 (C ₁)	1	1	0	0	0	1	0
Rev 2 (C ₂)	1	1	1	1	1	0	0
Pris 1 (C ₃)	1	1	1	0	0	0	0
Rev 3 (C ₄)	1	1	1	1	1	0	0
Pris 2 (C ₅)	1	1	1	0	0	0	0
Rev 4 (C ₆)	0	0	0	1	1	1	0
Gripper (C ₇)	0	0	0	0	0	0	1

$$U_1 = \begin{matrix} & c_1 & \dots & c_\tau & p_1 & \dots & p_\phi & s \\ \begin{matrix} t_1 \\ t_2 \\ \vdots \\ t_\alpha \end{matrix} & \begin{bmatrix} u_{1,1,1} & \dots & u_{1,1,\tau} & u_{1,1,\tau+1} & \dots & u_{1,1,\tau+\phi} & u_{1,1,\tau+\phi+1} \\ u_{1,2,1} & \dots & u_{1,2,\tau} & u_{1,2,\tau+1} & \dots & u_{1,2,\tau+\phi} & u_{1,2,\tau+\phi+1} \\ \vdots & \vdots & \vdots & \vdots & \vdots & \vdots & \vdots \\ u_{1,\alpha,1} & \dots & u_{1,\alpha,\tau} & u_{1,\alpha,\tau+1} & \dots & u_{1,\alpha,\tau+\phi} & u_{1,\alpha,\tau+\phi+1} \end{bmatrix} \end{matrix} \tag{7}$$

$$U_2 = \begin{matrix} & p_1 & \dots & p_\phi & s \\ \begin{matrix} a_1 \\ a_2 \\ \vdots \\ a_\beta \end{matrix} & \begin{bmatrix} u_{2,1,1} & \dots & u_{2,1,\phi} & u_{2,1,\phi+1} \\ u_{2,2,1} & \dots & u_{2,2,\phi} & u_{2,2,\phi+1} \\ \vdots & \vdots & \vdots & \vdots \\ u_{2,\beta,1} & \dots & u_{2,\beta,\phi} & u_{2,\beta,\phi+1} \end{bmatrix} \end{matrix} \tag{8}$$

Fig. 3 presents a screenshot of the Matlab interface that was developed to realize the interactive element of this effort. This screen capture presents the input of the O, U₁ and U₂ matrices.

4.2. Technology state

The MRED Operator now inputs the technology state information (maturity) for the components according to Fig. 4. This step also includes inputting the technology state information for the capabilities and the system, if explicitly known. maturity (m) is defined in three vectors: m₁ corresponds to the maturity of the τ components, m₂ corresponds to the maturity of the φ capabilities and m₃ for the System. Values for these vectors input by the MRED operator are either 1 (fully-developed) or 0 (immature) (Weiss & Schmidt, 2011a). Table 4 presents the Maturity vectors for the robot arm where the first row indicates the values m₁ vector, the second row indicates the values of the m₂ vector, and the third row indicates m₃.

When maturity is unknown for the capabilities and system (m₂, m₃), MRED calculates these vectors. The maturity for the capabilities is presented in the normalized Eq. (8).

$$m_{2_j} = m_1 \text{Col}_i(O) / \sum_{i=1}^{\tau} o_{ij} \tag{9}$$

Like m₁, values of m₂ will range from 0 to 1. maturities less than 1 indicate an immature capability, which may or may not be available for testing given its specific state. A value of 1 indicates a fully devel-

³ The term MRED operator is defined as the individual that inputs data and information into MRED. This is usually the evaluation designer facilitator who is guiding the blueprint generation process.

Table 3
U₁ relationship matrix for robotic arm.

Metrics – technical performance	Technology test levels (TTLs)							P ₁	P ₂	P ₃	P ₄	P ₅	P ₆	P ₇	System (S)
	C ₁	C ₂	C ₃	C ₄	C ₅	C ₆	C ₇								
Max force	0	0	1	0	1	0	1	1	1	1	0	0	0	0	0
Max linear velocity	0	0	1	0	1	0	0	1	1	1	0	0	0	0	0
Max torque	1	1	0	1	0	1	0	0	0	0	1	1	1	0	0
Max angular velocity	1	1	0	1	0	1	0	0	0	0	1	1	1	0	0
Range of motion	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1
Max lift capacity	0	0	0	0	0	0	1	0	0	0	0	0	0	0	1
Speed	0	0	0	0	0	0	0	0	0	0	0	0	0	1	1
Force	0	0	0	0	0	0	0	1	1	1	0	0	0	1	1

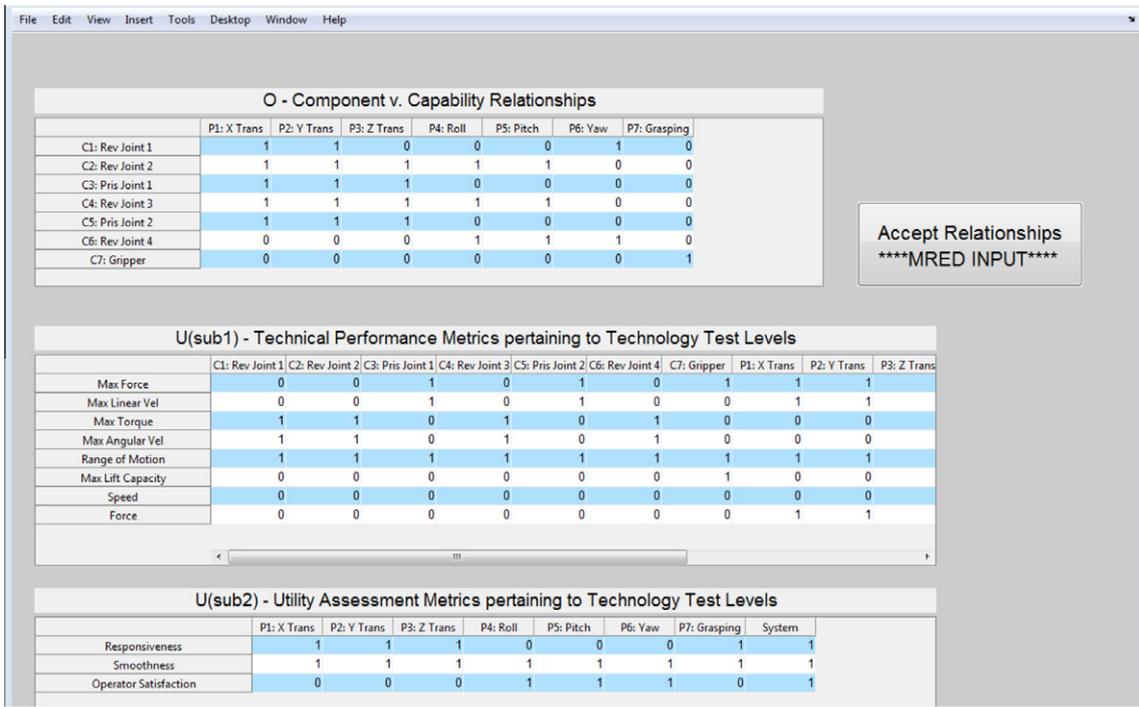


Fig. 3. Matlab interface showing O, U₁, and U₂ Inputs.

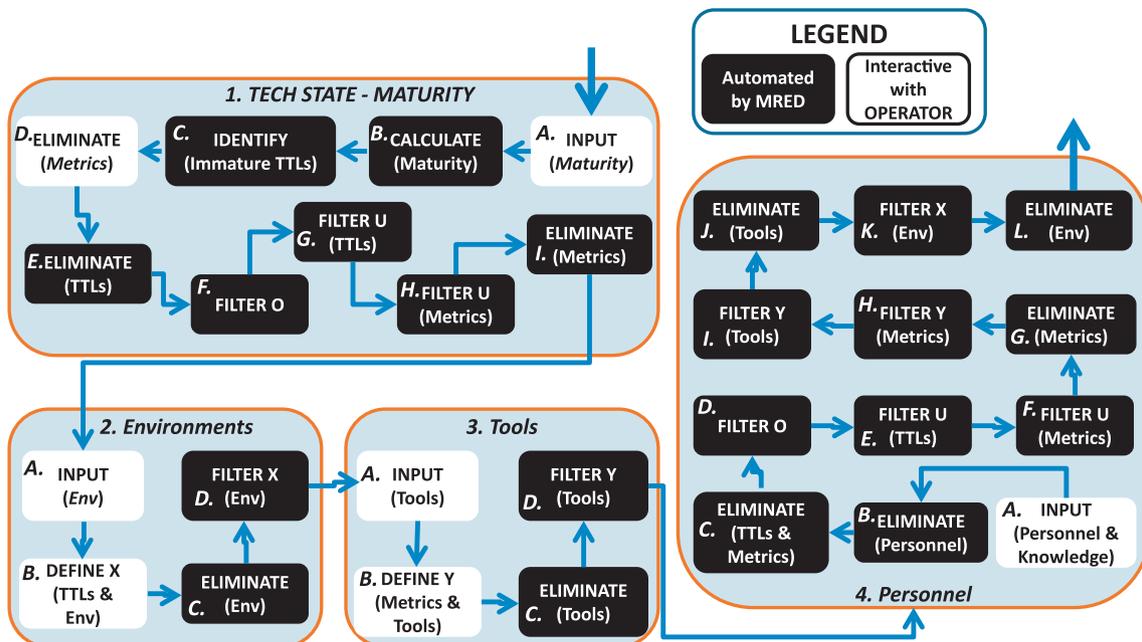


Fig. 4. MRED constraint handling and element filtration process.

Table 4
Maturity for robotic arm.

$m_1 =$	1	1	1	1	1	0	0
$m_2 =$	1.00	1.00	1.00	0.67	0.67	0.67	0.00
$m_3 =$	0.71						

oped capability which denotes that a capability is ready for all potential tests.

MRED estimates the maturity of the system as the average of the individual capabilities' maturities. Similar to capability maturity, the system maturity value is used to indicate whether the system is fully developed (maturity equal to 1) or immature (maturity less than 1). this is presented for maturity in eq. (9).

$$m_3 = \left(\sum_{i=1}^{\varphi} m_{2_i} \right) / \varphi \tag{10}$$

The system maturity ranges from 0 to 1, similar to the capability maturities, where its values are interpreted in the same manner. Table 4 presents the m vectors for the robotic arm example. Note that the capability and system maturities were calculated using Eqs. (8) and (9).

Next, MRED alerts the MRED operator which TTLs are immature (Step C of Box 1 in Fig. 4). The MRED operator removes the relationships between those metrics and TTLs in U_1 and U_2 if a TTL's immaturity does not allow the corresponding metric to be captured (Step D of Box 1 in Fig. 4).

4.3. Constraint-handling process

Rejecting candidate TTLs, or any other blueprint element, is a non-trivial process that requires several steps. One way to consider this process is the elimination of elements due to constraints. It's a process that will be repeated several times. This process is composed of the following steps:

- INPUT (Element) – The MRED Operator inputs the stated information into the MRED algorithm.
- DEFINE matrix (Element1 & Element2) – The MRED Operator defines of various relationships among blueprint elements, those of which that are outlined throughout Section 4. DEFINE X (TTLs – Env) means that the X matrices are defined relating TTLs to the candidate Environments (X is defined in the following section).
- ELIMINATE (Element) – This step requires the removal of specific blueprint elements from their respective sets. For example, ELIMINATE (TTLs) would involve removing specific components from c , capabilities from p , and updating s to either be 0 or remain 1. This step involves decrementing the appropriate counters when blueprint elements are eliminated.

Table 5
 X_1 relationship matrix for robotic arm.

X_1	Lab environments		
	Controls lab	Robotics lab	Force/torque lab
C_1	1	0	1
C_2	1	0	1
C_3	1	0	1
C_4	1	0	1
C_5	1	0	1
P_1	0	1	0
P_2	0	1	0
P_3	0	1	0
P_4	0	1	0
P_6	0	1	0

- FILTER Matrix (Element) – This step involves removing either the rows or columns corresponding to the indicated Element within the noted relationship matrix. A row or column within a matrix is removed for one of the reasons listed below:
 - The corresponding Element was removed as a candidate during the preceding elimination step.
 - The corresponding Element no longer has any relationships with its counterpart Element in the relationship matrix (ices) which is indicated by the sum of the row or column being equal to 0.

FILTER U (TTLs) means that those columns within the U matrices that correspond to eliminated TTLs or that have no available Metrics for measurement are removed. The only exception to this notation is FILTER O which calls for the removal of rows and/or columns corresponding to eliminated components and/or capabilities.

Fig. 4 presents MRED's constraint handling and element filtration process as the Technology state and available resources (environments, tools, and personnel) are input. since maturity has been defined for all TTLs at this point, the steps (A through E) in box 1 (Fig. 4) are executed.

4.4. Resources

4.4.1. Environments

The process outlined in Fig. 4 continues into box 2. The MRED operator now inputs the three types of candidate environments that are available for evaluation. Specifically, the MRED operator notes the γ lab environments (e_1), the δ simulated environments (e_2), and the ε actual environments (e_3). Now that the Environments and their counters are input, the four specific steps (A. INPUT, B. DEFINE X, C. ELIMINATE, and D. FILTER X) in box 2 are engaged. Eq. (10) presents the X_1 matrix, which is defined as the binary relationship matrix between Components and Capabilities to the available Lab Environments. Similar binary relationship matrices, X_2 and X_3 , defined for the Simulated and Actual Environments, are not shown for brevity.

$$X_1 = \begin{matrix} & e_{1_1} & e_{1_2} & \dots & e_{1_\gamma} \\ \begin{matrix} c_1 \\ \vdots \\ c_\tau \\ p_1 \\ \vdots \\ p_\varphi \end{matrix} & \begin{bmatrix} x_{1_{1,1}} & x_{1_{1,2}} & \dots & x_{1_{1,\gamma}} \\ \vdots & \vdots & \dots & \vdots \\ x_{1_{\tau,1}} & x_{1_{\tau,1}} & \dots & x_{1_{\tau,\gamma}} \\ x_{1_{\tau'+1,1}} & x_{1_{\tau'+1,2}} & \dots & x_{1_{\tau'+1,\gamma}} \\ \vdots & \vdots & \dots & \vdots \\ x_{1_{\tau+\varphi,1}} & x_{1_{\tau+\varphi,2}} & \dots & x_{1_{\tau+\varphi,\gamma}} \end{bmatrix} \end{matrix} \tag{11}$$

Table 5 presents X_1 corresponding to the robotic arm example. Note that two Components (C_6 and C_7) have been eliminated for their immaturity. Likewise, two Capabilities (P_5 , and P_7) have been eliminated based upon the MRED Operator's assessment of the Metrics

Table 6
 Y_1 Relationship matrix for robotic arm.

Technical performance metrics	Tools		
	Tension sensor	Dynamometer	LADAR
Max force	1	1	0
Max linear velocity	0	0	1
Max torque	0	1	0
Range of motion	0	0	1
Max lift capacity	1	0	0
Speed	0	0	1
Force	1	1	0

that could not be captured (with respect to these *Capabilities*) given the immaturity of these two *Capabilities*.

Once the remaining steps are completed in box 2, it is time to input and refine the available *Tools*.

4.4.2. Tools

A process now occurs for the *Tools* (shown in box 3 in Fig. 4) similar to what was just performed for *environments*. The *MRED operator* inputs the *Tools* that are available for evaluation in sets d_1 (corresponding to the ζ tools available to support *technical performance metrics*) and d_2 (corresponding to the η *utility assessment metrics*). now that these inputs are in place, the three step candidate elimination process begins by defining the Y relationship matrices between *metrics* and the available *Tools* (that support the measurement of these *metrics*). Y_1 is presented in Eq. (11).

$$Y_1 = \begin{matrix} & d_{1_1} & d_{1_2} & \dots & d_{1_\zeta} \\ \begin{matrix} t_1 \\ t_2 \\ \vdots \\ t_\alpha \end{matrix} & \begin{bmatrix} y_{1,1,1} & y_{1,1,2} & \dots & y_{1,1,\zeta} \\ y_{1,2,1} & y_{1,2,2} & \dots & y_{1,2,\zeta} \\ \vdots & \vdots & \vdots & \vdots \\ y_{1,\alpha,1} & y_{1,\alpha,2} & \dots & y_{1,\alpha,\zeta} \end{bmatrix} \end{matrix} \quad (12)$$

Table 6 presents the Y_1 for the robotic arm example. Once the steps are complete in box 3 of Fig. 4, it is time to input the available *Personnel*. This leads to further eliminating and filtering of the remaining candidate blueprint elements.

4.4.3. Personnel

The *MRED Operator* inputs the available *personnel* and their greatest *technical* and *operational knowledge* levels before moving to the first elimination step (A.) in box 4 of Fig. 4. Input *personnel* are captured in the matrix N defined in Eq. (12).

$$N = \begin{bmatrix} n_{1,1} & n_{1,2} & n_{1,3} \\ n_{2,1} & n_{2,2} & n_{2,3} \\ n_{3,1} & n_{3,2} & n_{3,3} \\ n_{4,1} & n_{4,2} & n_{4,3} \\ n_{5,1} & n_{5,2} & n_{5,3} \end{bmatrix} \quad (13)$$

where...

- Row₁(N) corresponds to *tech-users: end-users*

Table 7
Personnel Restrictions by *TTLs* and *Metrics*.

	Applicable goal types for participation				
	Technical performance			Utility assessment	
	Component	Capability	System	Capability	System
<i>tech user: end-user</i>	NO	YES	YES	YES	YES
<i>tech user: trained user</i>	YES	YES	YES	YES	YES
<i>tech user: tech developer</i>	YES	YES	YES	NO	NO

- Row₂(N) corresponds to *tech-users: trained users*
- Row₃(N) corresponds to *tech-users: tech developers*
- Row₄(N) corresponds to *team members*
- Row₅(N) corresponds to *participants*
- Col₁(N) corresponds to presence of personnel (0 – Unavailable, 1 – Available)
- Col₂(N) corresponds to *technical knowledge* (0 – None, 1 – Low, 2 – Medium, 3 – High)
- Col₃(N) corresponds to *operational knowledge* (0 – None, 1 – Low, 2 – Medium, 3 – High)

MRED Operator inputs the above information via user-interface such as the Matlab example shown in Fig. 5.

MRED eliminates the *Personnel*, *TTLs*, and *metrics* (4.B. in Fig. 4). Table 7 presents the constraints specifying which *tech users* can evaluate the various *TTLs* in support of the two types of *metrics* (Weiss & Schmidt, 2011b, 2012).

Elimination of *TTLs* and *Metrics* at the next step not only satisfies the *personnel* constraints, it also eliminates those *TTLs* and/or *Metrics* that are no longer needed based upon the *environment (s)* and/or *tool (s)* that were eliminated in the preceding steps. This creates a domino effect causing further steps to occur. This process concludes at the upper right corner of the box 4 within Fig. 4.

4.5. Stakeholder preferences

The next phase of *MRED* is to capture *stakeholder preferences*. *MRED* captures preferences from the pertinent *stakeholders* on an

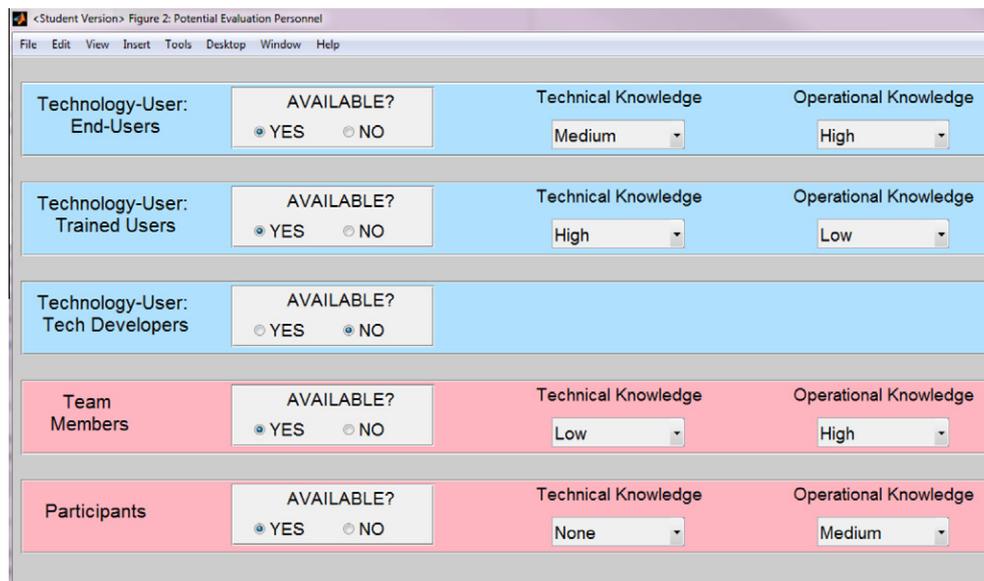


Fig. 5. Matlab user-interface depicting the available *personnel* and their greatest knowledge levels.

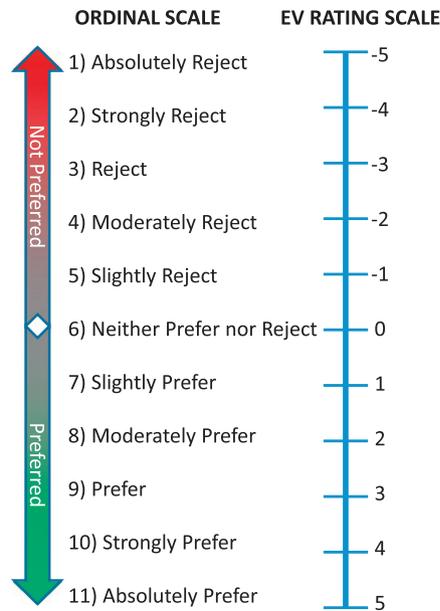


Fig. 6. Scales used for stakeholder preference capture and handling.

11-point, ordinal, linguistic scale to signify their preference for, neutrality toward, or preference against a specific evaluation blueprint element (when solicited for pairing with other blueprint elements) (Weiss and Schmidt, 2013). This scale ranges from absolutely prefer to absolutely reject and is presented in Fig. 6. These linguistic preferences are then mapped to a corresponding 11-point evaluative voting scale. MRED applies Hillinger's evaluative voting method to handle *stakeholder preferences* (Hillinger, 2004). Evaluative voting takes the numerical scores of each *stakeholder* across an alternative and produces an average score. The average for each alternative is calculated.

For example, applying the EV-11 scale to MRED would be asking the *stakeholders* to score each of the available *TTL-metric pairs* with respect to their preference for evaluating a specific *TTL-metric pair*. If a *stakeholder* chooses not to vote on a specific element (due to a lack of information), the vote remains at the default of 'NV' to indicate they are recusing themselves from scoring that specific element. This is different from the Hillinger's EV method. MRED only averages in a score of '0' if a *stakeholder* actively scores a specific element as neutral. The rationale behind this decision is that neutral preferences have a mathematical impact on the overall scores, where their lack of inclusion can present misleading data. In addition, the standard deviation is calculated for all preferences across each alternative. The meaning of these values are that they present the level of *stakeholder* agreement for a given alternative; the smaller the standard deviation, the more the *stakeholders* agree upon the particular preference score for an alternative.

There are numerous benefits to integrating evaluating voting with MRED to capture *stakeholder preferences* (Dummet, 1998; Dym, Wood, & Scott, 2002; Hillinger, 2004; Sukhatme & Bekey, 1995). They are:

- Rating process (as opposed to ranking process)
- Enables *stakeholders* to abstain from voting
- Minimizes the burden placed on the *stakeholders* by minimizing the quantity of information to be collected
- Accounts for preferences of multiple *stakeholders*
- Captures ordinal preferences and produces interval measurements
- Capture preferences of alternatives such that comparisons can be made of preferences of the same alternative from one evaluation to the next

- Expresses strength of preference
- Standard deviation presents level of agreement among *Stakeholders*

MRED employs evaluative voting in a three-step, iterative process, with one exception (noted below). The three primary steps are QUERY, SCORE, ELIMINATE, with the fourth being GROUP. In terms of the Evaluative Voting approach, these steps are defined as:

- QUERY – MRED queries *Stakeholder Preferences* ($-5, -4, \dots, -1, 0, 1, \dots, 4, 5$) for each blueprint element (e.g. *TTL-metric pair*). These are captured in matrices for further use.
- SCORE – MRED applies evaluative voting strategy to score each blueprint element where scores range from -5 to 5 .
- GROUP (*TTL-metric pairs*, only) – MRED operator groups *TTL-metric pairs* by *TTLs* or *Metrics*. This is done at the operator's discretion based upon the specific pairs that score above the set threshold (e.g. >0).
- ELIMINATE (for *TTL-metric pairs*) – MRED eliminates those *TTL-metric pairs* that score below the pre-determined threshold (and are not grouped with higher-scoring *TTL-metric pairs*) from further consideration.
- ELIMINATE (for all other blueprint elements) – MRED assigns the highest scoring blueprint element to the corresponding group of *TTL-metric pairs* and removes all other candidates from consideration for evaluation with this specific grouping.

MRED begins evaluative voting in the upper left box, I., by determining the preferred *TTL-metric pairs*. Table 8 presents the first step of querying the *Stakeholders* for their specific preferences according to the 11-point evaluative voting scale.

Table 8 shows the *stakeholder preferences* while Table 9 presents the scores of these preferences. In this specific case, the MRED operator defined the threshold for test consideration to be at 0. This means that any *TTL-metric pairs* scoring at or below 0 would be eliminated from further consideration. The next step would be to group *TTL-metric pairs* together to alleviate some of the burden on the *stakeholders* as they provide their preferences regarding the remaining blueprint elements (*personnel, environment, etc.*) for each group of *TTL-metric pairs*. Pairs can either be grouped by *TTL* (e.g. all of the metrics for P_3 are grouped together so *Stakeholders* only provide a single set of preferences for ' P_3 – Range of motion,' ' P_3 – Max force,' and ' P_3 – Max linear velocity'), by *Metric* (e.g. all of the *TTLs* required to produce the 'range of motion' *metric* are grouped together) or a combination of the two at the MRED operator's discretion. An exception to grouping by *metric* would be if the same *metrics* are to be captured across different types of *TTLs*, as is the case in this example. Specifically, 'range of motion' is an important *metric* for both *components* and *capabilities*.

Based upon the grouping, the scores, and how expensive it may be to evaluate a specific *TTL* or collect data for a specific *metric*, the MRED operator may choose to include a *TTL-metric pair* whose score was below the threshold. Based upon the data shown in Table 9, it is reasonable that the MRED operator could choose to test ' C_2 – range of motion' considering that it did not score much below 0 and range of motion *metrics* are already being captured for three other *TTLs*.

MRED provides traceability by capturing and storing all of the *Stakeholders' preferences* throughout this process. This information can easily be retrieved further into the blueprint development process and beyond, if necessary. This preserves each *Stakeholder's individual preference* in the event that the MRED operator wanted to review a subset of the *Stakeholder's preferences* or to apply a weighting factor (discussed further in Section 5).

Table 8
stakeholder preferences of TTL-Metric Pairs.

TTL-Metric pairs	Stakeholder preferences				
	Buyer	Eval designer	Sponsor	Tech Dev	User
C ₁ – Max torque	NV	Mod Reject	Slightly Pref	Slightly Rej	NV
C ₁ – Max angular velocity	NV	Strongly Rej	Neither	Slightly Pref	NV
C ₁ – Range of motion	NV	Slightly Rej	Slightly Pref	Mod Prefer	NV
C ₂ – Max torque	NV	Mod Reject	Slightly Pref	Mod Reject	NV
C ₂ – Max angular velocity	NV	Strongly Rej	Neither	Slightly Pref	NV
C ₂ – Range of motion	NV	Strongly Rej	Slightly Pref	Mod Prefer	NV
C ₃ – Max force	NV	Strongly Pref	Mod Prefer	Strongly Pref	NV
C ₃ – Max linear velocity	NV	Strongly Pref	Strongly Pref	Strongly Pref	NV
C ₃ – Range of motion	NV	Abs Prefer	Abs Prefer	Strongly Pref	NV
C ₄ – Max torque	NV	Prefer	Mod Prefer	Abs Prefer	NV
C ₄ – Max angular velocity	NV	Strongly Pref	Neither	Abs Prefer	NV
C ₄ – Range of motion	NV	Abs Prefer	Abs Prefer	Abs Prefer	NV
C ₅ – Max force	NV	Strongly Pref	Mod Prefer	Abs Prefer	NV
C ₅ – Max linear velocity	NV	Prefer	Prefer	Abs Prefer	NV
C ₅ – Range of motion	NV	Abs Prefer	Abs Prefer	Abs Prefer	NV
P ₁ – Max force	Mod Prefer	Strongly Pref	Prefer	Prefer	Neither
P ₁ – Max linear velocity	Slightly Pref	Prefer	Mod Prefer	Prefer	Strongly Pref
P ₁ – Range of motion	Strongly Pref	Prefer	Abs Prefer	Abs Prefer	Abs Prefer
P ₁ – Force	Prefer	Slightly Pref	Mod Reject	Prefer	Strongly Pref
P ₁ – Responsiveness	Slightly Pref	Prefer	Mod Prefer	Prefer	Strongly Pref
P ₁ – Smoothness	Abs Prefer	Mod Prefer	Strongly Pref	Mod Reject	Abs Prefer
P ₂ – Max force	Mod prefer	Prefer	Prefer	Prefer	Neither
P ₂ – Max linear velocity	Slightly Pref	Prefer	Mod Prefer	Prefer	Strongly Pref
P ₂ – Range of motion	Strongly Pref	Prefer	Abs Prefer	Abs Prefer	Abs Prefer
P ₂ – Force	Prefer	Slightly Pref	Mod reject	Prefer	Strongly Pref
P ₂ – Responsiveness	Abs Prefer	Mod prefer	Strongly Pref	Mod Reject	Abs Prefer
P ₂ – Smoothness	Abs Prefer	Mod Prefer	Strongly Pref	Mod Reject	Abs Prefer
P ₃ – Max force	Abs Prefer	Abs Prefer	Abs Prefer	Strongly Pref	Strongly Pref
P ₃ – Max linear velocity	Strongly Pref	Strongly Pref	Abs Prefer	Prefer	Strongly Pref
P ₃ – Range of motion	Strongly Pref	Abs Prefer	Abs Prefer	Abs Prefer	Abs Prefer
P ₃ – Force	Prefer	Slightly Pref	Mod Reject	Prefer	Strongly Pref
P ₃ – Responsiveness	Slightly Pref	Prefer	Mod Prefer	Prefer	Strongly Pref
P ₃ – Smoothness	Abs Prefer	Mod Prefer	Strongly Pref	Mod Reject	Abs Prefer

Table 9
Evaluative voting scores of stakeholder preferences for TTL-metric pairs.

Evaluative voting		
TTL-metric pairs	Average	Std dev
C ₄ – Range of motion	5.00	0.00
C ₅ – Range of motion	5.00	0.00
P ₃ – Range of motion	4.80	0.45
C ₃ – Range of motion	4.67	0.58
P ₃ – Max force	4.60	0.55
P ₁ – Range of motion	4.40	0.89
P ₂ – Range of motion	4.40	0.89
P ₃ – Max linear velocity	4.00	0.71
C ₃ – Max linear velocity	3.67	0.58
C ₅ – Max force	3.67	1.53
C ₅ – Max linear velocity	3.67	1.15
C ₃ – Max force	3.33	1.15
C ₄ – Max torque	3.33	1.53
C ₄ – Max angular velocity	3.00	2.65
P ₁ – Smoothness	2.80	2.95
P ₂ – Responsiveness	2.80	2.95
P ₂ – Smoothness	2.80	2.95
P ₃ – Smoothness	2.80	2.95
P ₁ – Max linear velocity	2.60	1.14
P ₁ – Responsiveness	2.60	1.14
P ₂ – Max linear velocity	2.60	1.14
P ₃ – Responsiveness	2.60	1.14
P ₁ – Max force	2.40	1.52
P ₂ – Max force	2.20	1.30
P ₁ – Force	1.80	2.39
P ₂ – Force	1.80	2.39
P ₃ – Force	1.80	2.39
C ₁ -Range of motion	0.67	1.53
C ₂ -Range of motion	-0.33	3.21
C ₁ -Max torque	-0.67	1.53
C ₁ -Max angular velocity	-1.00	2.65
C ₂ -Max torque	-1.00	1.73
C ₂ -Max angular velocity	-1.00	2.65

Table 10
Groupings of TTL-metric pairs.

METRIC GROUPINGS	GROUP	TTLs	Pair Average	GROUP	TTLs	Pair Averages
	Range of Motion	Max Force	C ₃	4.67	Max Linear Vel.	P ₃
P ₃			4.60	C ₃		3.33
P ₂			4.00	P ₂		2.20
C ₁			0.67	P ₃		3.80
		C ₂	-0.33		P ₂	2.00
				Max Angular Vel.	C ₃	3.67

Table 10 presents example groupings of TTL-metric pairs based upon the stakeholder preferences and scores generated from evaluative voting.

Once the groupings are in place and the least-preferred TTL-metric pairs are eliminated, the presence of the necessary evaluation personnel is determined by repeating a similar QUERY -> SCORE -> ELIMINATE process.

Obtaining stakeholder preferences during this test plan design process is just as crucial as getting feedback from stakeholders during product design. Evaluation designers are often not as informed as end-users on the practical applications, as knowledgeable of technological limits as technology developers so it's important to attain wide-ranging perspectives, or in tune with higher-level programmatic goals from the sponsor's perspective.

Now each stakeholder is asked to provide their personnel preferences for each grouping of TTL-metric pairs. Table 11 provides the stakeholder preferences and evaluative voting scores for personnel for the 'range of motion' grouping. Similarly, stakeholder preferences would be captured and scored for the other metric groupings. since this table relates to the presence of specific personnel, Ta-

Table 11
Stakeholder preferences for Personnel for 'range of motion' metric grouping.

Stakeholder preferences	Capability – Range of motion, smoothness, responsiveness grouping					Evaluative voting	
	Buyer	Eval	Sponsor	Tech dev	User	Average	STD DEV
Tech user: End-user	Strongly Pref	Slightly Pref	Strongly Pref	Mod Pref	Abs prefer	3.20	1.64
Tech user: Trained User	Strongly Rej	Slightly Rej	Strongly Rej	Reject	Abs Reject	–3.60	1.67
Team member	Neither	Strongly Rej	Slightly Pref	Strongly Rej	Prefere	–0.80	3.11
Participant	Mod Pref	Mod Reject	Abs Rej	Strongly Rej	Mod Pref	–1.40	3.29

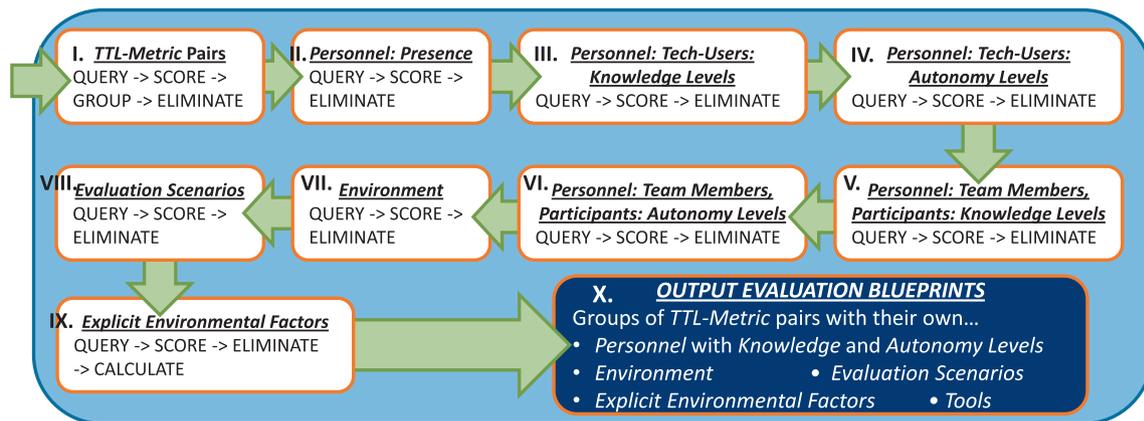


Fig. 7. Evaluative voting approach to capturing stakeholder preferences in MRED.

Table 11 states that the stakeholders prefer that the end-users be the technology users during tests to capture 'range of motion' data and that trained users and technology developers are less desirable (given both their lower score and their average scores being less than 0). Additionally, the stakeholders prefer that both team members and participants be involved in the 'range of motion' evaluations since their respective scores are above 0. In the case of the robotic arm example, the MRED operator may reasonably define team members to be other robot operators on the floor. Likewise, participants could be other employees that work near or around the robot yet would not have any direct interaction with it.

The QUERY -> SCORE -> ELIMINATE process continues with all of the remaining blueprint elements, as shown in Fig. 7, for each grouping. At the conclusion of this process, each grouping contains a complete set of evaluation plans that specify the TTLs to be evaluated, the metrics to be captured, the necessary evaluation personnel and their corresponding knowledge and autonomy levels, the environment (s) in which to evaluate the technology, the evaluation scenarios to drive the tests, the explicit environmental factors, and the required tools.

5. Conclusion and future work

The MRED process is formalized and demonstrates its potential as an automatic test plan generator. Among its contributions, this paper highlights the overall process including the objective removal of test plan elements given various constraints and relationships. The paper also presents an application of an iterative process of evaluative voting that is intertwined with the capture of stakeholder preferences.

An item of future work is to compare the impact of implementing preference capture and use strategies to confirm that evaluative voting is adequate for this application. Calculating cost of individual sets of evaluation blueprints is another area of exploration. Weighting of individual stakeholder preferences may be another valuable contribution to this effort since some Stakeholders may have greater importance than others in the program and/or others may have specific expertise regarding specific evaluation

blueprint elements. Finally, Table 9 shows several situations that still require MRED Operator discretion, yet MRED provides clarity. Specifically, a TTL-Metric pair scored just below the '0' threshold for evaluation consideration while another pair scored just above this same threshold. MRED presents their standing within all of the scores, yet it's the MRED Operator who must ultimately decide if MRED holds firm to this threshold or not. Future efforts could expand MRED to automatically address this issue.

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