How Experimental Design Optimizes Assay Automation

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An innovative blend of hardware, software and the right training in statistical know-how supercharges research automation.

Optimizing biological assay conditions is a challenging process that scientists face every day. The requirement is to develop high quality, robust assays that work across a range of biological conditions. The demand is to do this within a short development timeframe. In addition, automated systems are often required to accommodate large numbers of samples.

Setting up a model to systematically study all key experimental parameters, each across a defined range, is a challenge. Traditionally, the one-factor-at-a-time (OFAT) approach is used to study individual experimental conditions. This format is time consuming and tedious. More importantly, while measuring how changing a single factor will affect the assay, it leaves the experimenter blind to interactions that may exist between experimental factors. The information lost in OFAT designs may significantly reduce assay quality and robustness.

In light of this, scientists are adopting design of experiments (DOE) methodology. Using mathematical models, they evaluate experimental parameters in order to optimize assay conditions. Designs are created that evaluate both main effects and interactions between experimental factors such as sample concentration, reagent types, and incubation time. These experimental parameters represent only a few of the many influencing assay factors that can be studied using DOE.

Integrating DOE and automated liquid handling technology offers scientists the ability to design experiments that test a wider range of assay conditions. This allows for a clear understanding of the assay and its components so that improvements can be implemented and the assay optimized. Statistical software packages that create experimental designs are readily available. However, translating statistical designs to run on automated liquid handling systems is a complex endeavor. To simplify the task, Beckman Coulter has developed a software package to help automate DOE protocols on the Biomek® FX Laboratory Automation Workstation. SAGIAN[™] Automated Assay Optimization (AAO) software allows scientists to import designed experiments that are translated into corresponding Biomek FX methods.

Designed experiments are created in statistical software packages such as Design-Expert® software, developed by Stat-Ease, Inc. (Minneapolis, MN). Design-Expert software offers scientists a straightforward approach to creating a variety of design models such as two-level factorials, D-optimal designs, split-plot designs, and others. Beckman Coulter's AAO software guides the user through a wizard-like interface to specify experimental parameters such as labware, deck configurations and pipetting options to generate Biomek FX methods. Experimental results can be deconvoluted back into the original design format and transferred into Design-Expert software for analysis. Design-Expert provides in-depth analysis with interactive graphs to assist in interpreting assay results. Use of the AAO software enables the end-user to determine which key assay factors provide the maximal signal and enable the design of a robust assay.

Here is a brief overview of a typical process (Figure 1):

- 1) Researchers DESIGN the Assay experiment with Design-Expert.
- 2) Researchers IMPORT the Assay Design into AAO software, and then use it, along with the Biomek FX to:
 - Generate appropriately randomized plate maps
 - Configure and create testing methods
 - Run assays within the Biomek FX
 - Collect response data
 - Export the data to Design-Expert DOE software.
- 3) Researchers ANALYZE the statistical results with Design-Expert.

Use of this process enables the end-user to screen up to 1,000 individual variations of assay conditions. The use of Biomek FX automation eliminates months of tedious manual lab work while the AAO software reduces programming time from weeks to hours. In addition, Design-Expert software ensures that the maximum amount of information is obtained from the experimental runs.

TRAINING – AN ESSENTIAL ELEMENT FOR ULTIMATE SUCCESS

When AAO software was first introduced, Beckman Coulter trainers became aware that many researchers were not well grounded in DOE. This knowledge is vital for making the most of assay optimization. Needing an effective solution, Beckman Coulter called upon Stat-Ease experts to supplement the statistical aspects of their curriculum. Stat-Ease was selected as a training partner because their Design-Expert user interface—with its logical layout, sequence, and straightforward presentation of results—makes design decisions clear and conclusions succinct. Just as important to Beckman Coulter was Stat-Ease's commitment to quality training and customer satisfaction. Today, customers can take advantage of a dedicated 3-1/2 day course at Beckman Coulter's facilities. This unique class is designed to educate scientists on the process of using DOE with AAO software.



Figure 1: Diagram of information flow.

To maximize the return on time invested in the Biomek AAO training sessions, we recommend that attendees take a refresher course in basic statistics, such as analysis of variance (ANOVA). Stat-Ease offers a web-based "PreDOE" refresher that will quickly bring everyone up to speed.

Let's take a brief look at a collaborative AAO/DOE example that Stat-Ease principal and statistical consultant Pat Whitcomb provides Biomek FX users during training. This simple hypothetical case illustrates the process and flow of information when using DOE with AAO software.

An assay-development group wants to use DOE to study a mouse-cell fluorescent-assay system. The objective of the study is to find the maximum signal by evaluating three factors that they suspect may affect it. The three factors selected are:

-Number of cells (5,000 vs. 10,000)

-Amount of stimulant (5 vs. 10 microliters)

-Amount of ligand (5 vs. 10 microliters)

The general procedure is as follows: Cells are pipetted into a 96-well plate where stimulant is added to induce the mouse cells to express a biomarker. The wells are incubated for two hours and a fluorescently tagged ligand is added to bind to the biomarker. Finally, the liquid in each of the wells in the 96-well plate is adjusted to the same level with media and then the plate is read using a fluorescence plate reader.

The design is first set up in Design-Expert software. All combinations of the two levels of three factors create eight possible combinations. Given the substantial amount of variation in the process, replications of the design will be required to determine if any of the factors substantially affect the response. The DOE software can help determine the appropriate number of replicates; in this case, five replicates are sufficient (Figure 2). The design is then imported into the AAO software.

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Crossed 2 Level Factorial Design													
Mixture	Design for 2 to 15 factors where each factor is varied over 2 levels. Useful for estimating main effects and interactions. Fractional factorials can be used for screening many factors to find the significant few. The color codin											dina	
Response Surface	represents the design resolution: Green = Res V, Yellow = Res IV, and Red = Res III.												
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Figure 2 - Design-Expert software is used to create the design of experiments (DOE) file.

At this point, the researcher uses AAO to create the method (procedure) that the Biomek FX will follow (Figure 3).



Figure 3 - AAO software introductory screen. Users import their Design-Expert file into AAO software and generate Biomek FX methods.

In AAO software, the user specifies the plate type (Figure 4, 96-well), the buffer information, the pipetting procedures, the incubation period, and the order in which the procedure will take place. AAO provides the brains and Biomek FX provides the muscle to eliminate tedious manual pipetting and automate complicated liquid handling operations.





The method is generated (Figure 5) and executed on the Biomek FX and the final readings are obtained from a standard fluorescence plate reader. This data is transferred back to Design-Expert software for the researcher to analyze.





Figure 5 – Screenshots of the generated Biomek FX method. The transfer step highlighted indicates how experimental factors are pipetted into the experimental plate.

The analysis of a two-level factorial design such as this involves the use of a tool called a halfnormal plot of effects (Figure 6). Any statistically significant factors are easily revealed as outliers on this plot. This case study revealed a statistically significant interaction between the amount of stimulant (B) and the amount of ligand (C). After generating the appropriate analysis of variance as confirmation of the effects plot, model graphs were generated to show the final results (Figure 7). This interaction graph reveals that the experimenter should avoid the combination "B-, C-"which causes a significant reduction in fluorescence. The other combinations are acceptable.



Figure 6: Half-normal plot of effects used to select significant effects – the "outliers" on the graph.



Figure 7: Interaction graph shows the combinations of stimulant and ligand that yield the best fluorescent values.

There is no doubt that, given today's accessibility to high speed computing, we will see everincreasing application of DOE to all aspects of product development and quality control. The development of effective software combined with timely, targeted training simplifies and automates efficient DOE studies and enables more cost-effective discovery. The tiresome and frustrating onefactor-at-a-time process is yielding to the more informative, efficient and effective world of statistical design of experiments.

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