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Full Length Review Article

ANALYTICAL QUALITY BY DESIGN (AQBD): NEW PARADIGM FOR ANALYTICAL METHOD DEVELOPMENT

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ARTICLE INFO ABSTRACT

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Key words: Analytical method, DoE, Design space, HPLC, Design of Experiments, AQbD, Modelling, Software DoE, Simulator. Quality of a finished product is gauged by compliance of certain predetermined specifications. This is ascertained by validated analytical procedures carried out by quality control personnel and laid down by the Quality Assurance (QA) department of a pharmaceutical company. In the present scenario, testing of the finished product alone is not sufficient, but emphasis is on 'Total Quality Management' through in-process testing and analysis. To achieve this goal, Quality by Design (QbD) concept has already been introduced and practised by all countries following guidelines of International Conference on Harmonization (ICH guidelines). Other features like Quality Risk Management, Pharmaceutical Quality System and Process Analytical Technology (PAT) guidelines are also being now introduced and integrated into analytical method development processes. They are very popularly accepted as AQbD (Analytical Quality by Design) concepts by the industry. Though not officially circulated, this new paradigm has attracted appreciation from all concerned and is evident by increasing publications in this field. The day may not be far off when this becomes official. Till then, certain observations and suggestions are compiled and presented through this review paper.

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INTRODUCATION

Quality should be built in by design, it cannot be tested in a product, is the main motto of 'Total Quality Management'. To achieve this goal of optimized quality product, the knowledge gained from pharmaceutical development studies and manufacturing provides the scientific background. The method optimization was earlier based on One Factor at a Time (OFAT) approach (Bhoop Bhupinder Singh *et al.*, 2013) where a single component was varied with time and its effect studied.

This approach was not much helpful as it neglected the effect caused due to interaction of more than one factors. Now a day, the approach followed is Quality by Design (QbD) which employs Design of Experiments (DoE) as important concept. DoE approach is a systematic, scientifically analysed better understandable approach. The figure 1 highlights the demerits of OVAT leading to use of DOE approach.

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Regulatory Control Guidelines emphasising QbD

The QbD approach which is based on scientific and methodical product development was included in the quality guidelines of International Conference on Harmonization (ICH) from 2005 onwards. This approach includes, ICH O8 Development), (Pharmaceutical 09 (Ouality Risk Management), and Q10 (Pharmaceutical Quality System) guidelines. The pharmaceutical products quality was also emphasised in Process Analytical Technology (PAT) guidelines for new pharmaceutical product development and quality. In 2004, USFDA agreed to include QbD in "Pharmaceutical cGMP 21st Century- A risk based approach" (ICH, 2009 and Sangshetti Jaiprakash et al., 2014).

Some key definitions as given by ICH Q8 are mentioned below:

Design space: "The multidimensional combination and interaction of input variables (e.g., material attributes) and process parameters that have been demonstrated to provide assurance of quality. Working within the design space is not considered as a change."



Fig. 1. Showing demerits of OFAT leading to DOE approach

Design of Experiments: "A structured, organized method for determining the relationship between factors affecting a process and the output of that process."

Process Analytical Technology (PAT): "A system for designing, analyzing, and controlling manufacturing through timely measurements (i.e., during processing) of critical quality and performance attributes of raw and in-process materials and processes with the goal of ensuring final product quality."

ICH Q9 guideline considers quality risk management as a valuable component of an effective quality system. Risk is defined as the combination of the probability of occurrence of harm and the severity of that harm. It is important to understand that product quality should be maintained throughout the product lifecycle. This further ensures the high quality of the drug product.

ICH Q10 guideline describes model quality management system for pharmaceutical manufacturing.

QbD Principles for Analytical Method Development

Analytical testing, is a critical step for pharmaceutical development processes like raw material analysis, in-process checking, release testing, stability studies. To ensure the quality product analytical method should also be in unison with the QbD and PAT. Thus, due stress should also be laid on regulatory guidelines for AQbD describing the development of method as per DoE including risk management system and details of quality systems required (Bhoop *et al.*, 2010).

Proposed key definitions for AQbD (Tang, Yubing, 2014 and Chatterjee, Sharmista, 2013)

According to ICH Q8, main terminology used in the process optimization are Quality Target Product Profile (QTTP), Design Space (DS) and Design of Experiments (DoE). The analogous terminologies for analytical method development used by quality experts are Analytical Target Profile (ATP), Method Operable Design Region (MODR) and Method Development Strategy (MDS).



Fig. 2. Comparative terminology for QbD and AQbD

The definition of these terms are given in the figure 3.



Fig. 3. Key definitions for AQbD

Steps involved in Analytical Method development in unison with QbD (Sangshetti Jaiprakash *et al.*, 2014; Candioti Luciana Vera *et al.*, 2014; Karmarkar *et al.*, 2011 and Debrus *et al.*, 2013)

The first step in designing of analytical methods by using the principle of QbD is the selection of the type of analytical method and the various factors affecting the method. These factors can be classified as primary parameters and secondary parameters. This step involves the study of primary parameters. The parameters are then prioritized based on the extent of the effect caused on analysis. This phase is followed by Screening phase which, calculates approximately the effects of secondary parameters on selected responses (like resolution and selectivity in case of HPLC). The model which can be used for this stage are Two Levels Full Factorial, Two Levels Fractional Factorial, Plackett- Burman. The next step is response surface generation by using any of the method from Central Composite Design, Box-Behnken Design, Full Factorial Design at three levels, Doehlert Matrix Design or D- Optimal design. This stage is followed by the optimization stage which employs the use of computer software as well virtual screening to determine MODS.

This approach when applied to HPLC analytical method development includes four main steps: The first step is to determine primary parameters like screening of column chemistry, organic modifier, pH of buffer and mobile phase. This is followed by next step where the selectivity optimization is confirmed through changes in gradient time and mobile phase temperature. Finally, column geometry optimization to get sufficient resolution and MODS is determined. The optimization process is a continuous process and should be monitored from time to time for efficient outcome. Figure 4 gives the schematic representation of the steps involved in analytical method development.

A simple example is selection of conditions for chromatographic method development on the basis of structure of drug defining physicochemical properties like logP, logD, pKa etc. The advent of computer technology has reduced the time required for calculation and results are more precise with the use of statistical methods for treatment of data. The various statistical methods used can be Multiple Linear Regressions (MLR), Partial Least Square (PLS) or Principal Component Analysis and other tools like Analysis of Variance (ANOVA), student's t-test, Pearson coefficient are also used whenever required.



Fig. 4. Showing steps involved in the DOE and designs employed for Screening and Response Surface Steps

Computer softwares used in optimization of parameters and generation of MODS (Bhoop Bhupinder Singh *et al.*, 2013 and Debrus *et al.*, 2013)

The method development based on structure defining physicochemical parameters is in vogue.

Table 1. Computer Softwares u	sed for HPLC and DoE.
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Software for Chromatography	Software for DoE
DryLab	Fusion AE
(Molnár Institute, Germany)	(S-Matrix, United States)
ACD/LC and GC Simulator	MODDE
(ACD/Labs, Canada)	(Vicenza, Italy)
ChromSword	Design Expert
(ChromSword Group, Latvia)	(State-Ease Inc., USA)
Osiris	Modde
(Datalys, Grenoble, France)	(Umetrics,Sweden)
	JMP
	(SAS Institute Inc.)
	Unscrambler
	(CAMO, Norway)

This is made much easier by the use of computer based programmes. The given Table 1 shows some of the softwares used for chromatographic and DOE simulations.

Review of some publications for Analytical Methods employing DoE concept

The information from various publications using concept of QbD and PAT including DoE concept for the development of the analytical method for assay and determination of stability has been compiled in Table 2. The main parameters selected for the collation are the screening along with optimization parameter.

These are the two main steps which are foundation of the further decision making. The models or designs used for screening as well as response surface designing are also compiled. The computer software packages, if used are also included as important parameter for designing.

S. No.	Name of drug	Class of drug	Type of Analytical method	Stages	Parameter's considered	Design / Model	Software used	Ref.
1.	Amitriptyline and its main impurities	Tricyclic Antidepressant	Solvent-Modified Micellar Electrokinetic Chromatography	 Screening phase 	 Applied voltage Concentration and pH of the background electrolyte Concentration of the surfactant, cosurfactant and organic modifiers 	 Response surface methodology by Doehlert Design. DS by Monte-Carlo simulations 	 Nemrod-W package for knowledge space 	[10]
				 Scouting phase 	• CE operative modes for maximum selectivity	 Robustness assessment by Blockett Durmon design 	 MODDE 9.1 package (Vicenza, Italy) 	
2.	Ginkgo biloba L.	Plant Material	Direct analysis in real time mass spectrometry (DART- MS)	 Screening phase 	 Concentration of ginkgolides in the loading solution Loading flow rate 	2-factor, 3-level full factorial design with two additional replicates on the center point	 Design Expert8.0 (State-Ease Inc., USA) Data analysis by Matlab7.9 	[11]
				 Optimization Phase 	 Adsorption Capacity 		software (The Mathworks Inc., USA)	
3.	Divided in different groups	Antibiotics	HPLC UPLC	 Screening Phase 	 pH of the aqueous part of the mobile phase Gradient time Temperature of chromatographic column 	 D-optimal design Design Surface Bayesian model Monte-Carlo predictive 	 HPLC calculator v3.0 (University of Geneva, Switzerland) Algorithm for DS written in R 2.13 (free-ware) e-noval® V3.0 software (Arlenda.Belgium) 	[12]
				 Optimization 	 Retention time 			
4.	 Phthalic Acid Vanillic Acid Isovanillic Acid Aspirin Furosemide Doxepin Terbinafin Atorvastatin Clopidogrel 	Model drugs	HPLC	Phase	 Resolution Gradient time Temperature pH of the aqueous eluent Stationary phase 	Column design spaceElution design space	 ColumnMatch (Molnár-Institute, Germany). DryLab 2010 (Molnar Institute, Germany) 	[13]

Table 2.	Highlighting	the various	important	n arameters	studied in	1 DoE
1 4010 -	,	the fullous	important	parameters	studied in	

5.	Luliconazole in bulk and cream formulation	Antifungal drug	HPLC	 Screening phase 		Factorial designMultiple Regression equation	ColumnMatch (Molnár-Institute, Berlin, Germany)	[14]
	Tormulation				Acid HydrolysisAlkali degradation	• 3 variables at two levels	 DryLab 2010 (Molnár-Institute, Germany) 	
						 2 variables at two levels 		
					Oxidative degradationDry heat degradationWet heat degradation			
				 Optimization phase 				
6.	Hydrolyzed Protamine sulfate peptides	Biotechnologica l Products	RP-HPLC	 Screening Phase 	 Mobile phase pH Flow rate Column temperature Injection volume Methanol concentration 	 Plackett–Burman experimental design Multivariate regression Pareto ranking analyses Boy, Bahukan design 	NA	[15]
				 Optimization phase 	Peak ResolutionUSP tailing	- box-bennken design		
7.	 Histamine Paroxetine Cetirizine Caffeine Pseudoephedrin 	Model drugs	Supercritical Fluid Chromatography	 Screening 	 Nature of stationary and mobile phase 	 4 factors central composite design Polynomial equation using multiple linear equation Monte–Carlo simulations 	 Chemstation (Agilent) Empower3(Waters) HPLC calculator JMP10.0.0 (SAS Institute) 	[16]
	e Serotonin Dopamine DL- Norepinephrine			 Robust method optimization 	 Concentration of TFA dissolved in methanol Temperature 			
8.	AcetaminophenPhenylephrineChlorpheniramine	Common-cold pharmaceutical formulation	HPLC	 Screening stage 	 pH of the aqueous part Gradient time	Plackett and Burman designFull factorial designFractional factorial design	 In-house computer software 	[17]
				 Optimization Designs 	 Selectivity 	 D optimal design Central Composite Designs 		
9.	<i>Spirospermum</i> <i>penduliflorum</i> Thouars (Menispermaceae)	Vasorelaxantap orphine alkaloids (dicentrine and	HPLC-UV	Screening stageValidation	 Mobile phase pH Initial proportion of methanol Gradient slope 	 Full factorial design of 36 experimental condition Multiple linear equations 		[18]
	1 1	neolitsine)			1	1 1		

10.	API and P4NX99- D, the P4NX99 molecule	Coded drug and impurities	Stability-indicating LC- MS method	 Optimization of the method for the determination of impurities and the API Optimization of the method taking into account the aged matrix 	LC factors Flow rate Injection volume MS factors Cone temperature Capillary temperature Nebulizer gas Desolvation gas Cone voltage Capillary voltage	 Polynomial Regression Monte Carlo simulations for error propagation Grid search method 	 RStudio v 0.96 a Integrated Development Environment (IDE) e.noval software v3.0 (Arlenda, Belgium) 	[19]
11.	Ebastine and its pharmaceutical formulations	Antihistaminic	Stability-indicating UHPLC	Screening Phase	 Dwell time Gradient time Temperature Ternary composition of the eluent Flow rate Start and end concentration of the gradient 	 2-D resolution maps 3-D resolution cube	DryLab (Molnar Institute, Germany)	[20]
12.	Atomoxetine	Treatment of Attention Deficit Hyperactivity Disorder	HPLC impurity method	 Optimization Screening phase	 Selectivity pH of mobile phase Buffer concentration Organic solvent concentration Ion-Pair concentration Column temperature 	Five-factor, two-level fractional factorial design with four centerpoints		[21]
				 Optimization 				
13.	Darifenacin and degradation	M3 selective receptor	RP-UPLC	phase	 Temperature, % organic ratio Buffer pH 	Central Composite Design	DesignExpert version 8.0.7.1(Stat- Ease, Inc., USA)	[22]
14.	produs	15 Antipsychotic Basic Drugs	RP-LC	Initial screeningSelectivity optimization	 Column chemistry Column chemistry Mobile phase pH Organic modifier Changes in gradient time Mobile phase temperature 	 Stepwise Regressions Error propagation by Monte Carlo Simulations 	Fusion AE 9.6 (Matrix Softwares)	[23]
				 Robust optimization 	Resolution			
15.	Pramipexole	 Parkinson's Disease Restless Legs Syndrome 	RP-HPLC	-	 Gradient time Temperature pH of aqueous eluent Flow Rate Start and end concentration of organic mobile phase 	Multi-Factorial Design Space	DryLab (Molnár-Institute, Germany)	[24]

16.	Furosemide	Diuretic	RP-HPLC	 Primary Parameter Selection 	 Organic modifier Buffer pH Gradient time 	• IV optimal design and cubic model for individual design	DesignExpert version 8.0.7.1(Stat- Ease, Inc., USA)	[25]
				 Secondary Parameter Screening 	 Initial hold time Initial % organic modifier Final % organic modifier 	 Taguchi orthogonal array 		
				 Method Optimization 	• Flow rate	 Face centred central composite design 		
17.	4- dimethylaminopyri dine impurity in	Genotoxic impurity	LC-MS/MS	 Initial screening 	For HPLC Flow Gradient	 Regression Analysis 	Modde 9.0.0.0 (Umetrics, Sweden)	[26]
	glucocorticoids				 Injection Volume For MS Cone Voltage Collision Energy 	 Fractional Factorial Quadratic model, Central Composite Face 		
				 Optimization 	 Separation of peaks peak prea Length of analysis signal to poise ratio 			
18.	API and P4NX99- D		Liquid Chromatography (LC)	 Screening phase 	 Organic modifier % pH of mobile phase Column time 	D-optimal mixture design Polynomial regression	 RStudio v0.96, Integrated Development Environment (IDE) a payal v3.0 (Arlanda, Palgium) 	[27]
				 Optimization of the method for the determination of impurities and the API Optimization of 	 Country type Analyzer resolution Accuracy Signal noise ratio Signal spikes in total ion current 	 Forynomial regression response modelling Monte Carlo simulations for error propagation 	- e.noval v3.0 (Altenda, Belgium)	
				the method taking into account the				
19.	Bovine serum albumin	Biological product	UPLC	 Screening Phase 	 Acetonitrile (%) Formic Acid (%) Boiling Time 	Multivariate data-analysis	Modde 8.0.2 software (Umetrics, Sweden)	[28]
				 Optimization Phase 	 Percentage Bovine Serum Albumin Loss 			
20.	Zileuton racemate in bulk and tablet Formulation	Inhibits 5- Lypoxygenase	RP-HPLC-PDA	 Screening phase 	 Methanol content Flow rate Concentration of 	Central Composite Design (CCD) and Response Surface Methodology	Design Expert (Stat-Ease Inc., US)	[29]
	1 criticitation			 Optimization phase 	orthophosphoric acid	 Multiple Linear Regression (MLR) and ANOVA 		

21.	Separation of curcumin,	Malaria	HPLC	 Screening phase 	 Percentage of organic modifier 	 Full Factorial Design 	 Empower2.0 forWindows 	[30]
	arteether, tetra- hydrocurcumin and dihydroar- temisinin			 Optimization phase 	Flow rate of the mobile phaseColumn temperature		 e-noval® V3.0 software(Arlenda, Belgium). 	
22.	 Noradrenergic Dopaminergic Serotonergic Compounds from Mouse Brain Tissue 	Multiple Neuropsychiatri c Disorders	Reversed-Phased Ion- Pair With Amperometric End-Point Detection	 Screening phase 	 Modifier Methanol concentration pH of mobile phase Column temperature Ion-Pair counter concentration Voltage of detector 	Two-Level Fractional Factorial Experimental Design	JMP® 8.0.1 software (SAS Institute Inc.)	[31]
				 Optimization 	ResolutionAnalysis time			
23.	Six organotin compounds	Toxins in water	Headspace-Solid-Phase Micro-Extraction (HS- SPME) combined with Gas dependence	 Screening 	Extraction efficiency Pre- incubation time Incubation temperature 	Plackett–Burman design (Screening method)	MINITAB program.	[32]
			Tandem Mass Spectrometry (GC– MS/MS)		 Agriator speed Extraction time Desorption temperature Buffer (pH , concentration and volume) Head space volume Sample salinity Preparation of Standards 	 Central Composite Design (CCD) 		
				 Optimization 	 Ultrasonic time Desorption time in injector GC-IT-MS/MS Excitation voltage Excitation time Ion source temperature Isolation time Electron energy 	• Full Factorial Design		
24.	BEL097 BEL174	Coded drugs	HPLC with polysaccharide-based stationary phase	 Screening phase 	 Trifluoroacetic acid (TFA) concentration n-Hexane concentration Column temperatures 	 Central Composite Design (CCD) 	JMP v 8.0.2 (SAS Institute, Tervuren, Belgium)	[33]
				 Optimization phase 	 Resolution or separation criterion 	 Monte Carlo simulations 		
25.	SulfadiazeneSulfacetamideSulfathiazole	Antibiotics	HPLC	Screening phase	 Pump flow rate Gradient time Gradient slope Column oven temperature Maximise resolution 	 Experimental Error Transformation Regression Outlier Residuals 	Fusion AE (Matrix software)	[34]
				 Optimization phase 	 Minimize retention time 	 Pareto Ranking Analyses 		

26.	Vancomycin	Antibiotics	UPLC	 Rapid Screening 	Column chemistryBuffer pHOrganic mobile phase	 Rank Response Variable Monte Carlo Simulation Process Capability Statistics 	Fusion (Matrix)Empower 2 software	[35]
				 Optimization 	 Pump flow rate Gradient time Final % organic Column temperature 			
27.	Linagliptin	Diabetes Type II	Stability indicating HPLC	 Screening 	 % Organic component Column chemistry Gradient time Run time 	Monte Carlo Simulation	 Fusion AE (Matrix Software) Agilent 1200 Infinity Series Method Development Solution 	[36]
				Optimization	 Selectivity Factor 			
28.	 Coenzy me Q10 Ascorbi c Acid 	Nutraceutical	Microemulsion Electrokinetic Chromatography Method (MEEKC)		 Capacity Factor Mixture Components Buffer Surfactant–Cosurfactant Oil 	 I-optimality criterion MPV models Special-cubic mixture model		[37]
	 Folic Acid 				Process Variables Voltage Buffer Concentration 			
29.	Compound A	Coded Sample	HPLC	 Instrumentation and chromatographic Conditions System suitability test Intermediate precision study Robustness study 	 Buffer pH % Acetonitrile (ACN) pH of Mobile Phase Detector Wavelength Column Temperature Flow Rate Buffer Concentration Column Types 	Fractional Factorial Design	JMP® software	[38]
30.	Almotriptan and its main Impurities	Migraine Headaches	Capillary Electrophoresis (CE)	 Scouting Phase 	 CE operative modes Addition of pseudo stationary phases Additives to the background electrolyte 	 Monte-Carlo simulations MPV D-optimal design 	MODDE (Umetrics, Sweden)	[39]
				 Screening Asymmetric Matrix 	 Process Variables (PVs) Voltage Temperature Buffer Concentration Buffer pH Mixture Components (MCs) Borate Buffer, n-Heptane as Oil Sodium Dodecyl Sulphate/N-Butanol As Surfactant/Cosurfactant 			

Conclusion

The paradigm shift from OFAT to QbD (DoE) has supported the pharmacy professionals to cater the needs of combative Quality Assurance. Discerning the importance of analytical methods in pharmaceutical formulation development, the same principles should be applied to analytical method development also. The main endeavour of review is to focus on the use of aforementioned Design of Experiment concept in Research and Development and afterwards translation to Quality Assurance Department. The number of research publications reviewed in the paper endorses the fact. The designing increases the confidence in the method developed, as it covers all the aspects and compiles the results categorised under the Design Space. The initial process is costly but ultimately becomes cost effective in case of errors and risks. The benefits of Analytical Quality by Design concept are enormous. The main is during regulatory registration, the changes within the design space for the formulation development do not require refilling. So, to make the process of change in analytical method for registered product unproblematic, regulatory agencies should issue the guidelines pertaining to Analytical Quality by Design. The awareness in the professionals can be ensured by conducting various training programmes, workshops and awareness campaigns. Another important aspect is use of computer software for accurate statistical analysis of data. Cheaper reliable software accessibility will be appreciable. Thus, concluding with the remarks that Analytical Quality by Design is in infancy recently, will grow with regulatory control to its full potential.

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