

Scalable Design and Development of Modified Release Hydrochlorothiazide Formulation Employing Quality by Design Approach

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Singhai *et al.*: Quality by Design based Scalable Formulation Development of Hydrochlorothiazide

Myocardial infarction, generally known as 'heart attack' occurs predominantly during the early morning hours and a cause of millions of death worldwide. Hydrochlorothiazide is the recommended drug for the prevention of heart disease, but the commercial market lacks its long action (>4 h) formulation. The endeavor of the present research was to develop a quality product profile of hydrochlorothiazide modified release tablets (~14 h release) by applying computational quality by design approach. Three independent factors were identified by qualitative and quantitative risk assessment. Selected dependent variables were cumulative percent of dissolved hydrochlorothiazide in 2, 5, 8 and 12 h. Graphical tools like half normal, normal and Pareto charts were used to manage model selection. The graphical relationship among the critical, independent variables was represented using contour plot and three-dimensional surface plot. Design space was identified by plotting overlay plot using three factors, two-level full factorial design. Outstanding correlation was observed between predicted and actual values. Similarity factor (F2) of reproducible trials was 78 and 79, and content uniformity was 100.9 % and 100.4 %. Average weight, hardness, thickness, diameter and friability were within acceptable limits. Quality by design approach, along with quality risk management tool furnished an efficient and effective paradigm to structure quality modified release tablets of hydrochlorothiazide.

Key words: Computational pharmaceuticals, design expert, hydrochlorothiazide, quality by design, two-level full factorial design, hypertension

Development of pharmaceutical dosage form has been progressive process and advanced from a traditional approach using One Factor at a Time (OFAT). The major flaw in OFAT approach is its inability to access factor interaction, which must anticipated in the pharmaceutical process and it covers a small fraction of total feasible factor space, leading to a copacetic formulation rather than a pre-eminent one^[1]. Regulatory agencies emphasize Quality by Design (QbD) based approach for product development to entrust quality in the product^[2].

Computational QbD based pharmaceutical development has two imperative steps; the first one is the identification of the Quality Target Product Profile (QTPP) and second includes the factors affecting QTPP^[3]. The first step identification of the QTPP deals with quality characteristics, ensuring the target product profile. The QTPP may include dosage form, intended use in the clinical, delivery system, route of administration, the strength of dosage form, container and closure system, factors affecting pharmacokinetics

(dissolution), quality criteria of drug product like stability, purity and drug release^[4]. Identification of QTPP is followed by the identification of factors which may instigate the QTPP and to further analyze those which do so perilously^[5]. These factors are the Critical Quality Attributes (CQAs) of product which eminently depends on the Critical Material Attributes (CMAs) of excipient used in product development along with Critical Process Parameters (CPPs) during manufacturing^[6].

One of the decisive and most influential elements for computational QbD is risk assessment. Risk assessment is a precious scientific approach utilized in quality risk management that can facilitate in distinguishing amid material attributes and process parameters which

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can potentially affect product CQAs. After initial risk assessment design space is established by the application of Design of Experiment (DoE). Design space as a multidimensional zone which abiding with all the specifications of CQAs during product shelf-life concerning CMAs and CPPs with prominent certitude^[7]. DoE is organized, economical mechanism to substantiate the outcome of input variables on the product quality attributes by minimizing the number of experiments^[8]. Another benefit of DoE is that it studies independent factors along with all possible factor interactions over a broad range of value without examining them directly^[9].

Despite the understanding of cardiovascular system development from initiation of embryo development progressively to heart development, Cardiovascular Diseases (CVDs) are the paramount reason for mortality almost world-wide^[10]. As per the report of the World Health Organization (WHO), CVDs will be the reason for more than 20.0 million deaths of individuals every year, by the 2030 y^[11].

Most of the prescribed medicines for the treatment of cardiac ailment include a combination of antihypertensive formulations with a suitable diuretic and Hydrochlorothiazide (HCTZ) is the leading one^[12]. The eight reports of Joint National Committee for Prevention, Detection, Evaluation and Treatment of High Blood Pressure have thickly influenced the prescription pattern of HCTZ for more than three decades. All reports recommend thiazide, thiazide-like drugs or thiazide-type diuretics as forefront or preferable therapy with usual dose ranging from 12.5 to 50 mg per day in single or divided dose as recommended^[13]. Low doses of thiazide and thiazide-like diuretics have been recommended as initial therapy for hypertensive patients by more recent Joint National Committee reports^[14]. HCTZ immediate release tablets alone have a market volume of approximately 31 million dollars in the United States of America (USA). In combination with other drugs, the market volume is approximately 588 million dollars in the USA only. However, HCTZ suffers from high dose requirement (12.5-50 mg/d) and also have a shorter half-life (~6 h)^[15].

Moreover, the existing doses do not cover most risk zone for heart attacks, i.e. early morning hours and last phase of the sleep, which is prerequisite to avoid/reduce the heart attack chances^[16]. The cardiovascular system follows a routine pattern having oscillatory nature and cardiovascular functions exhibit circadian changes.

There is a further elevation of blood pressure and heart rate due to catecholamines, which shows peak when a person wakes up in the morning^[17]. A wide array of techniques were reported to enhance the bioavailability of drugs to manage cardiovascular ailments^[18,19].

Furthermore, to maintain the blood concentration for longer period (to cover morning hours during sleep), higher and frequent dosing of HCTZ may result into severe side effects such as fluid-electrolyte imbalance, hyponatremia, hypokalemia, hyperuricemia and hypercalcemia^[20]. This craves an urgent need to develop low dose modified release HCTZ formulation which releases the desired concentration in the systemic circulation at the most risky time period that is early morning hours and last phase of sleep, to avoid heart attack chances. The development of modified release dosage form in this context may help in reducing the side effects of higher doses along with reducing dosing frequency for better patient compliance. Modified release dosage form is a mechanism which is in contrast to immediate release. The paradigm of drug release from modified release dosage form is deliberately altered to achieve desired therapeutic goals, better patient compliance and to change the bioavailability or rate of uptake of the drug by a body^[21].

Hydrophilic matrix technology is used to modify the release rate of HCTZ^[22]. Researches have already tried various naturally available materials like guar gum, xanthan gum, chitosan along with synthetic polymers such as Hydroxypropyl Methylcellulose (HPMC), carboxymethylcellulose sodium and polymethylmethacrylate^[23]. In our research, we used a combination of two matrixing agents to accomplish particular/desirable pattern of drug release and used matrix technology considering their preference in developing modified release pharmaceutical products at industrial level. In the present investigation we have applied computational QbD approach where QTPP of HCTZ Modified Release Tablets (MRT) was identified (Table 1). DoE was used technique to obtain the desired dissolution profile for HCTZ. Three factors, two-level (2³), the full factorial experimental design was employed to characterize and optimize three independent factors which were identified by qualitative risk assessment by leveraging prior knowledge, literature search and experience along with quantitative risk assessment using Failure Mode, Effects and Criticality Analysis (FMECA). Three critical factors which were found affecting the release rate of HCTZ MRT are a concentration of HPMC K4M, the concentration of

TABLE 1: QTPP FOR HCTZ MRT

QTPP Element	Target	Justification
Dosage form	Uncoated tablet	Pharmaceutical equivalence prerequisite
Dosage design	Modified release matrix tablet	Modified release design necessary to fulfill label claims
Dosage Strength	25 mg	Modified release tablet of lower strength to be developed
Route of administration	Oral	Pharmaceutical equivalence prerequisite: Identical route of administration as that of immediate release
Container closure system	Appropriate container and closure system to accomplish the target shelf life and to assure the integrity of the tablet	Polyvinyl Chloride (PVC)/Polyvinylidene Dichloride (PVDC), Alu Blister and High-Density polyethylene (HDPE) bottles
Drug product quality attributes	Content uniformity Dissolution	Pharmaceutical equivalence prerequisite: Complying similar or compendial or other relevant standards
Stability	Minimum 3 mo stability at room temperature 3 mo shelf-life at ACC (Accelerated Conditions)	Equivalent to or better than immediate release stability and also for commercialization

Note: QTPP is the first step of development using QbD approach. QTPP of HCTZ modified release formulation is tabulated above

HPMC K100M, and kneading time. The selected dependent variables (responses) were a cumulative percentage of dissolved HCTZ in 2, 5, 8 and 12 h. Design space was identified based on results of ten trials suggested by full factorial design. The element of menace or all the potential failure modes were beneath crucial levels after the implementation of the control strategy. Prediction of levels of three critical factors required to get desired dissolution data was provided by Design-Expert® software, version 10. Two reproducible trials were taken and analyzed for *in vitro* dissolution, content uniformity and physical characterization like hardness, thickness, average weight and friability.

The primary objective of this research is to develop a modified release formulation of HCTZ lower strengths (12.5 and 25 mg) which can provide required *in vivo* dissolution during the last phase of sleep and early morning hours. Formulation is developed using a QbD approach. 2³ full factorial design was applied to optimize the formulation in a systematic way. Design space was established by statistical and graphical evaluation of DoE trials which provided final formula to achieve desired *in vitro* dissolution profile.

MATERIALS AND METHODS

HCTZ, Microcrystalline Cellulose ((MCC); Avicel pH 101), HPMC K 4M, Polyvinylpyrrolidone (PVP) K30, HPMC K 100M, aerosil-200, talc and

magnesium stearate were kindly provided by Alembic Pharmaceuticals Limited (Vadodara, Gujarat, India). All the solvents used were of analytical grade and approved by the Alembic Pharmaceuticals Limited (Vadodara, Gujarat, India) for the use in pharmaceutical product development.

Risk assessment analysis:

After defining the QTPP of HCTZ MRT (Table 1), risk assessment was performed to scrutinize the potential hazards and to evaluate the factors affecting CQAs. The most frequent approach for regimented risk assessment is the creation of Ishikawa fishbone diagram for identification of critical factors influencing final product attributes. Fig. 1 depicts fishbone diagram epitomizing effects of several process parameters, material attributes and other environmental conditions of CQAs of HCTZ MTR^[24].

Screening and establishment of CMAs and CPPs:

Process-wise brainstorming and qualitative risk assessment were performed to screen and establish CMA and CPP^[24]. In qualitative risk assessment, raw materials and process parameters attributes classified as low, medium and high risk based on their impact on the critical quality attribute (dissolution) using literature, prior knowledge and brainstorming. Identification of CMAs and CPPs by qualitative risk assessment is tabulated in Table 2 and Table 3, respectively.

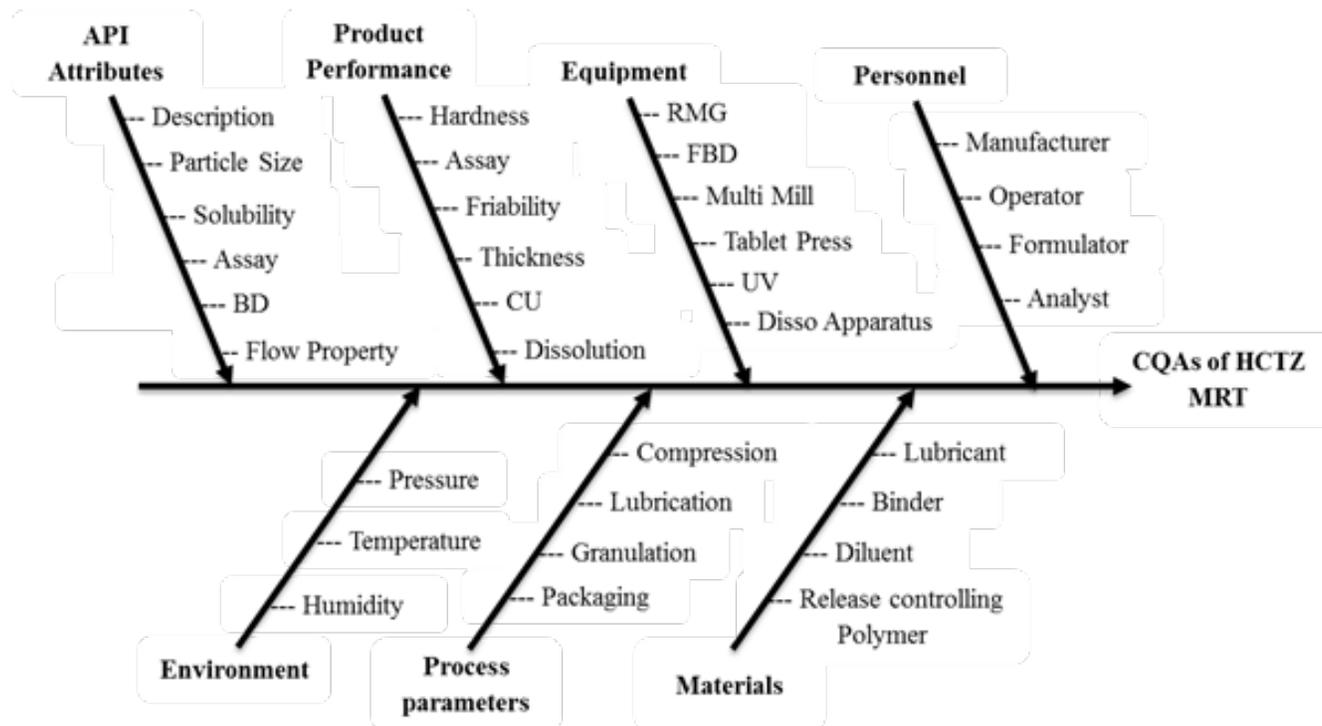


Fig. 1: Ishikawa/fishbone diagram

Note: Epitomizing effects of several process parameters, material attributes and other environmental conditions of CQAs of HCTZ MTR

TABLE 2: CMA-RAW MATERIAL, FUNCTION AND DISSOLUTION

Raw material	Function	Dissolution
MCC (Avicel pH 101)	Diluent	L
HPMC K 4M	Release controlling polymer	H
HPMC K 100M	Release controlling polymer	H
PVP K30	Binder	M
Colloidal silicon dioxide (Aerosi-200)	Glidant	L
Talc	Glidant	L
Magnesium stearate	Lubricant	M

Note: (L): Low, broadly acceptable risk. No additional investigation is required; (M): Medium, risk is accepted. Additional investigation may be necessary to reduce the risk and (H): High, risk is unacceptable. Additional investigation is a prerequisite to reduce the risk. CMA are defined with risk involved i.e. low risk, medium risk and high risk based on literature and experience. Materials identified with high risk were further studied using quantitative risk assessment using FMECA

TABLE 3: CPP-INPUT/PROCESS MEASURE PROCESS STEPS AND DISSOLUTION

Input/process measure	Process steps	Dissolution
Balance calibration/weighting range	Dispensing	L
Screen size	Sifting	L
Stirring speed	Binder preparation	L
Dry mixing	Granulation	
Impeller speed in dry mixing		L
Chopper speed in dry mixing		L
Binder addition		
Binder quantity		L

Rate of binder addition		L
Impeller speed during binder addition		L
Chopper speed during binder addition		L
Kneading		
Kneading time		H
Impeller speed during kneading		L
Chopper speed during kneading		L
Additional solvent quantity		M
Size of equipment		L
Equipment occupancy		L
Inlet temperature	Drying	L
Bed temperature		L
Exhaust temperature		L
Flap		L
Drying time		L
Equipment occupancy		L
Vibratory sifter sieve	Milling/sifting	L
Type of mill		L
The screen size of mill		M
Speed of mill		M
Type of blender	Blending	L
Size of blender		L
Equipment occupancy		L
Speed of blender		L
Blending time		L
Type of blender	Lubrication	L
Equipment occupancy		L
Speed of blender		L
Lubrication time		H
Type of machine	Compression	L
Type of tooling		L
No of punch set		L
Turret and feeder speed		L
Pre compression		L
Compression force		M

Note: (L): Low, broadly acceptable risk. No additional investigation is required; (M): Medium, risk is accepted. Additional investigation may be necessary to reduce the risk and (H): High, risk is unacceptable. Additional investigation is a prerequisite to reduce the risk

In qualitative risk assessment, six CPPs and four CMAs were identified having a medium and high risk for which investigation was required to reduce the risk. Remaining factors identified with low and broadly acceptable risk for which further investigation not

needed. We performed a quantitative risk assessment on these six identified CPP and four identified CMA using FMECA. Quantitative risk assessment using FMECA tabulated in Table 4.

TABLE 4: QUANTITATIVE RISK ASSESSMENT USING FMECA

PP/MA	Effect/suggested contingency/Comment	P	S	D	RPN	RR
Kneading time	Varying chopper speed along with impeller speed effects granules size, shape, structure and flow property. Optimizing granulation parameters will avoid batch to batch variation	4	4	2	32	Medium
Additional solvent quantity	Solvent quantity is required in optimum amount for uniform granules. Additional solvent quantity will be optimized to avoid batch to batch variation	4	2	2	16	Low
Screen size of mill	Variation in screen size may result in variation in particle size of granules. This will effect granulometry and powder flow property	4	2	2	16	Low
Speed of mill	Variation in speed of mill may result in variation in particle size of granules. This will effect granulometry and powder flow property	4	2	2	16	Low
Lubrication time	An extended release formulation with matrix technology will not be impacted by lubrication time	3	2	2	12	Low
Compression force	Higher force may result in capping of tablets and lower compression force may result in high friability. Hence compression force will be optimized	4	2	2	16	Low
HPMC K4M	HPMC K4M and HPMC K100M are used as a release controlling polymer. The concentration of HPMC needs to be controlled; variation in concentration will result in varied dissolution profile	4	4	4	64	High
HPMC K100M		4	4	4	64	High
PVP K30	PVP K30 is used as a binder. Binder concentration may impact the dissolution profile for immediate release formulations. For modified release, it will not have an impact on dissolution as a concentration in very low 3 % as compared to release controlling polymer	4	2	2	16	Low
Magnesium stearate	Magnesium stearate is used as a lubricant. It is reported in literature that magnesium stearate is hydrophobic and may delay the dissolution of a drug from a solid dosage form. Since the concentration is very low 1 % it will not have any impact on dissolution profile	2	2	2	8	Low

Note: (PP/MA): Process Parameters and Material Attributes; (P): Probability of cause impacting on the response; (S): Severity on response; (D): Detection of failure and (RR): Risk Rating

There are five steps of performing FMECA which includes determining failure mode; assessing severity (S); assessing probability number (P), assessing detection number (D) and calculating Risk Priority Number (RPN)^[25]. This quantitative risk assessment resulted in the identification of three critical factors, i.e. concentration of hydrophilic polymers and kneading time, which can impact response (dissolution rate)^[26]. Other process parameters and material attributes were kept constant for all experimental runs to minimize the noise in the process.

Full factorial design:

After identification of 3 critical factors with medium and high risk by quantitative risk assessment, 2³ full factorial design was employed to optimize MRT of HCTZ. In this design, we considered three factors (independent variables) A, B and C each studied at two levels. This eight treatment combination can be demonstrated geometrically as a cube, as shown in fig. 2. The eight treatment combination of 2³ design has seven degrees of freedom, three of them are correlated with main effects, i.e. A, B and C while remaining four

are correlated with interactions; two-way interactions with AB, BC, AC and three-way interactions with ABC^[27].

Three factors (independent variables) which were identified critical by qualitative and quantitative risk assessment were a concentration of HPMC K100M (A), the concentration of HPMC K4M (B) and kneading time (C). These independent variables were studied at two levels, i.e. high and low. Levels for the selected independent variables were determined based on the available literature, previous formulation development experience and feasibility trials. The range of three independent variables was; HPMC K4M is ranging from 10 mg to 50 mg; HPMC K100M is ranging from 10 mg to 50 mg; kneading time ranging from 60 s to 360 s. Design expert provided 10 experimental runs (2³=8 experimental runs and two center points). The chosen dependent variables (responses) were a cumulative percentage of dissolved HCTZ in 2, 5, 8 and 12 h. *In vitro* drug release prediction of HCTZ MRT was done using Wagner Nelson method and de-convolution approach in our previous laboratory work^[28]. Required dissolution profile is tabulated in Table 5.

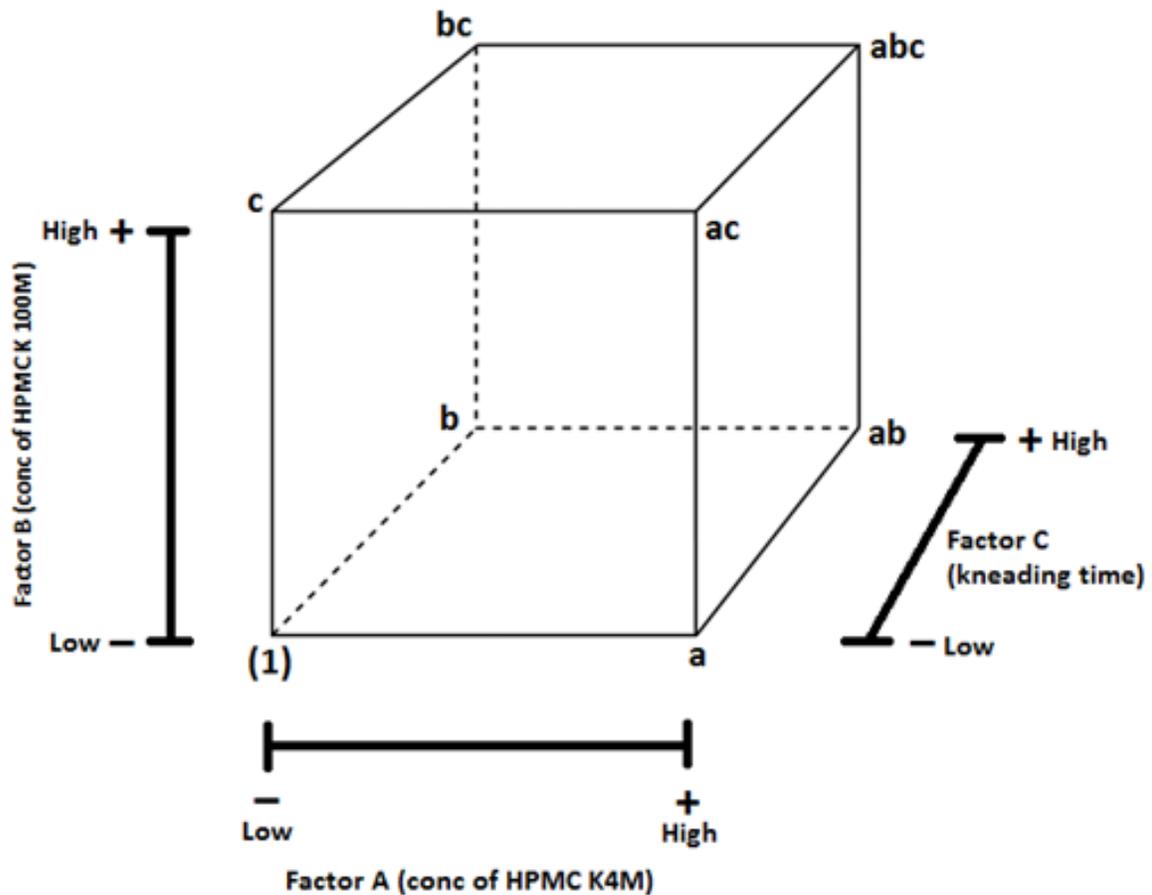


Fig. 2: Geometric view of 2^3 full factorial design

Note: Factor a, b and c are concentration of HPMC K4M, concentration of HPMC K100M and kneading time respectively

TABLE 5: REQUIRED DISSOLUTION PROFILE

Time (h)	<i>In vivo</i> dissolution (%)
0	0
1	16
2	28
3	37
4	45
5	53
6	61
7	68
8	74
9	80
10	85
11	90
12	94
13	97
14	101

Note: Modified release formulation of HCTZ is not available in market. Hence required *in vitro* profile was calculated using Wagner Nelson method and De-convolution approach. A separate research article is published for this calculation. Final results are taken from that article

Setting dissolution specification:

After calculating required *in vitro* drug release profile, we move ahead to set dissolution specification considering it as a critical part during the development of new pharmaceuticals. The results predicted by the design expert should comply with the specifications, to ensure that the target is achieved. We included four points in the specification of *in vitro* dissolution with $\pm 10\%$ deviation from the mean dissolution profile. In detail, one early time point to exclude dose dumping and to characterize a loading/initial dose, typically 20 % to 30 % dissolved. At least one point to ensure compliance with the shape of the dissolution profile, around 50 % dissolved. One to ensure that the majority of the active substance has been released ($Q=80\%$). If the maximum amount dissolved is less than 80 %, the last time point should be the time when the plateau of the dissolution profile has been reached^[29]. Based on these recommendations, a dissolution acceptance criterion is tabulated in Table 6. This required *in vitro* dissolution specification will become a dependent variable (response) while performing DoE.

Analytical method development:

HCTZ maximum absorption (λ_{max}) was determined in purified water as solvent using Ultraviolet ((UV) spectroscopy; Shimadzu; UV 1700). Linearity for the standard solution was checked at different concentrations including 10 %, 50 %, 80 %, 100 %, 120 % and 150 %. Calibration curve of HCTZ in de-aerated water is provided in fig. 3.

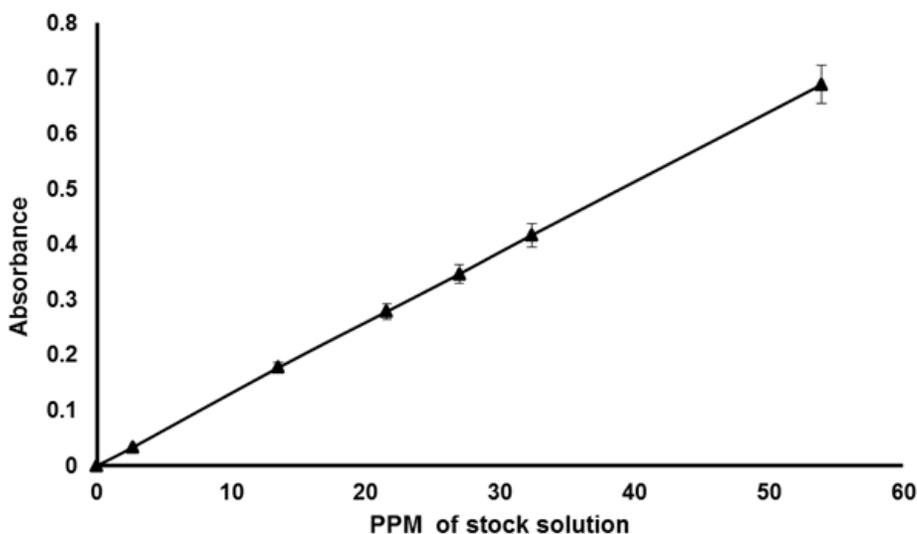
Flow properties:

Flow property of powder is one of the vital quality attributes for the development of a robust formulation. Poor flow property often results in weight variation of tablet affecting other CQAs of MRT. In the current study, compendial methods of the angle of repose, Carr's compressibility index and Hausner's ratio were used to characterize flow^[30]. Tapped density was determined using tap density tester (Electrolab). Angle of repose was determined using LFA ART 1 tester.

TABLE 6: REQUIRED *IN VITRO* DISSOLUTION SPECIFICATIONS

Response	Unit	Time (h)	Target	Acceptance criteria	Comment
Dissolution	%	2	30 %	Not more than 35 %	Based on the dissolution profile calculated using the deconvolution method and Wagner nelson equation to meet the <i>in vivo</i> profile
	74	5	50 %	40 % to 60 %	
	74	8	75 %	65 % to 85 %	
	74	12	90 %	Not less than 85 %	

Note: A dissolution acceptance criterion was determined based on European Medicines Agency (EMA) guideline. As per guidance for industry, the basis of *in vitro* dissolution specifications should be the performance of the clinical/bioavailability lots. These specifications may sometimes be widened so that stability lots along with scale-up lots meet the specifications associated with the clinical/bioavailability lots. This approach is based on the use of the *in vitro* dissolution test as a quality control test without any *in vivo* significance. In our experiment, we dually followed the protocols stated for a commercial product

**Fig. 3: Calibration curve of HCTZ in de-aerated water**

Granulation and tableting:

Due to the HCTZ fluffy nature, it has a poor value of compressibility index, Hausner's ratio and angle of repose and therefore very poor flow property and compressibility. Hence, the direct compression process cannot be used for manufacturing of HCTZ tablets. Granulation process will be required to improve the flow property, compressibility and tablet ability as discussed earlier. Using weigh balance (Mettler Toledo) accurately weigh HCTZ along with MCC and HPMC K100M were sifted using 40# sieve in a vibratory sifter (Star Trace; STVS45), this is known as a dry mix. In a separate vessel, PVP K30 was added in purified water under continuous stirring (Stirrer RPM: 500; Remi Motors; RQM-122/R) until a clear solution of the binder was obtained. Dry mix was transferred to Rapid Mixer Granulator (RMG) of capacity 5 l (Sara Engineering; Good Manufacturing Practice (GMP) Laboratory Model), and granulation was performed with a binder solution. Only kneading time was varied and all other parameters such as dry mixing time, binder addition time with impeller and chopper speed were kept constant. Granules were dried in Fluidized

Bed Dryer (FBD) (Chitra; CMPL/FBD 2 Kg) at 70° to get desired Loss On Drying (LOD), not more than 2.5 % using a halogen moisture analyzer (Mettler Toledo; HR73). Dried granules were sifted using 20# sieve in a vibratory sifter (Star Trace; STVS45). Granules retained at 20# sieve were milled using multi-mill (Chitra; MIWI-MM-GMP) equipped with 1.2 mm stainless steel, the screen at medium speed with knives forward. Dried granules were mixed in Conta-blender (Bectocem Loedige; GMP Laboratory Model) for 10 min at 16 rpm. Then, HPMC K4M, talc and aerosil-200 were sifted using a 40# sieve, followed by addition into the Conta blender and mixed with dried granules for 10 min at 16 rpm. Magnesium stearate was sifted separately with a 60# sieve and then added to Conta-blender and mixed with the pre-lubricated blend for 5 min at 16 rpm. This lubricated blend was compressed into a tablet using 8.5 mm round shape standard concave punches using double rotatory compression machine (CADMACH®; CTX-26 single rotatory tablet press) at an average weight of 230 mg. The compositions for the formulation of the factorial design batches F1 to F10 are shown in Table 7.

TABLE 7: COMPOSITIONS FOR FORMULATION OF THE FACTORIAL DESIGN BATCHES F1 TO F10

Excipients	F1 (mg)	F2 (mg)	F3 (mg)	F4 (mg)	F5 (mg)	F6 (mg)	F7 (mg)	F8 (mg)	F9 (mg)	F10 (mg)
HCTZ	25	25	25	25	25	25	25	25	25	25
MCC 101	132	172	132	132	132	172	92	132	92	132
HPMC K100M	10	10	30	50	10	10	50	50	50	30
PVP K30	6	6	6	6	6	6	6	6	6	6
Water	q.s.									
HPMC K4M	50	10	30	10	50	10	50	10	50	30
Aerosil 200	1	1	1	1	1	1	1	1	1	1
Talc	4	4	4	4	4	4	4	4	4	4
Magnesium stearate	2	2	2	2	2	2	2	2	2	2
Total	230	230	230	230	230	230	230	230	230	230
Kneading time (s)	60	360	210	60	360	60	360	360	60	210

Note: (q.s.): quantity sufficient

Characterization of HCTZ MRT tablets:

Tablet hardness or crushing strength: Tablet breaking or crushing strength was determined by Erweka hardness tester (TBH 125, ERWEKA GmbH Heusenstamm, Germany). A sample size of 10 tablets was used for each determination and crushing strength of the tablets was averaged from these determinations with the corresponding standard deviation.

Tablet friability: Tablet friability was determined by a United States Pharmacopoeia (USP) to conform friability tester (Erweka type TAR 220 Erweka, Heusenstamm, Germany). Tablet equivalent to 6.5 g, i.e. approximately 30 tablets were placed in the friabilator drum that was rotated 100 times at 25 rpm and the weight loss of the tablets was recorded. Percent (%) tablet friability calculated from the following equation (1):

$$\% \text{ Friability} = (W_i - W_f) / W_i \times 100 \quad (1)$$

Where W_i is the initial weight of tablets and W_f is the weight of tablet after the test

Average weight, diameter and thickness determination: 20 tablets were weighed individually and the average weight of a tablet was determined in milligram (mg). The diameter and thickness of the tablet was determined using Vernier Calipers (Aerospace Digimatic Vernier Caliper) for 10 tablets and the average was determined.

Content uniformity: Content uniformity of tablet was determined by pulverizing individual tablets in a mortar-pestle to a fine powder. The consequent powder was dissolved in 100 ml of purified water. It was sonicated for 20 min. 1 ml of aliquot was withdrawn and further diluted with water to 10 ml. The sample was filtered using a 0.45 μm filter and analyzed for drug content at 271 nm using a UV spectrophotometer (Shimadzu; UV 1700)

In vitro drug release studies: *In vitro* dissolution study on all HCTZ MRT was performed using USP 28 dissolution testing apparatus 2 (paddle). The dissolution test was performed using 900 ml of deaerated water (dissolution medium), at $37 \pm 0.5^\circ$ at 75 rpm on 6 units. A sample (10 ml) of the solution was withdrawn from the dissolution apparatus at regular interval for 12 h and the samples were replaced with fresh dissolution medium to mimic the *in vivo* conditions. The samples were filtered through a 0.45 μ membrane filter. The absorbance of these solutions was measured at 271 nm using a UV/visible double-beam spectrophotometer

(Shimadzu; UV-1601; Country: Japan).

Analysis of responses via computational design expert tool:

Final dissolution results of 10 QbD trials were incorporated in design expert software (version 10) and all four responses were analyzed. The analysis was performed by interpretation of graphs along with statistical interpretation. The graphical interpretation was done by plotting different graphs like half normal plot, normal plot and Pareto chart. The fit of half normal and normal plot was used to determine the significance of the effect. The significant effects deviate from the line where as non-significant effect tend to fall on the straight line. The addition or dropping of terms was done based on Shapiro-Wilk p-value of different terms (main factor, two-way interactions and three-way interaction). After the selection of critical factors, statistical evaluation was performed using Analysis of Variance (ANOVA) for the selected factorial model. A p-value of the model and selected factors should be less than 0.05 ($p < 0.05$) and lack of fit value should be non-significant. Modeling statistics were also studied where the difference between adjacent R^2 value and predicted R^2 value should not be more than 0.2. The adequate precision, which is a measure of signal to noise ratio, should be >4 . After ANOVA, diagnostic plots were studied including normal plot of residuals, residual vs. predicted, residual vs. run, predicted vs. actual, residual vs. factor. In Box-Cox plot for power transform, it was ensured that current lambda (λ) value should be near to best-suited λ value and should lie between a 95 % confidence interval.

Establishment of design space:

After completion of the analysis of all four responses, factors affecting each response were identified. Based on the analysis; evaluation was performed in design expert. To calculate the design space, the criteria of the CQAs was set to a minimum, maximum or range. The CQA dissolution at 2, 5, 8 and 12 h was set according to dissolution specification. Range of independent factors was set in the same range, which was used to predict the design space which was set during DOE. The desirability function was determined. Desirability is an objective function that ranges from zero outside of the limits to one at the goal. The value is completely dependent on how closely the lower and upper limits are set relative to the actual optimum. The goal of optimization is to find a good set of conditions that will meet all the goals, not to get to a desirability value of 1.0. Desirability is

simply a mathematical method to find the optimum^[31]. Here each response is associated with its own partial disability function^[32]. Contour plots, Three Dimensional (3D) surface plots and overlay plots were also plotted. Contour plots are topographical maps which are drawn using 3D data. The 3D plot is a companion to counter plot which represents response in 3D. It is useful in a regression analysis where the relationship among one dependent and two independent variables is viewed^[27]. Multiple regression assumes that the surface is perfectly flat. Hence the surface plot helps to determine whether multiple regression is appropriate or not visually. The 3D surface plot is a projection of the contour plot giving shape in addition to the color and contour^[33]. Optimal or best conditions derived from such plots. An overlay plot is a combined contour plot. The contour plots or response surface plots are superimposed over each other to get the best compromise visually.

Reproducible trials and *in vitro* drug release:

Two reproducible trials taken with these predicted values of selected solution (HPMC K4M 22 mg, HPMC K100M 21 mg and kneading time 120 s). All other factors kept constant and similar manufacturing process was used to prepare reproducible batches. *In vitro* dissolution study was performed.

RESULTS AND DISCUSSION

One of the decisive and most influential elements for QbD is risk assessment. Fishbone diagram (fig. 1) illustrates different critical factors which can likely affect the CQAs of HCTZ MRT. However, it is impractical to analyze and control the impact of all these factors on the quality attributes of HCTZ MRT. Thus it is mandatory to choose only those factors which are recognized to have a substantial impact on quality attributes of products to illustrate and recognize extensive proportion of experimental variations.

Process-wise brain storming of material attributes and process parameters suggested that concentration of release controlling polymers HPMC K4M and HPMC K100M have a very high impact on dissolution, hence are classified into high risk which is unacceptable and additional scrutiny must need to reduce the risk. Whereas concentration of binder PVP K30 and lubricant magnesium stearate was classified into medium risk, which is tolerable but additional inspection may be needed to reduce the risk. Concentrations of remaining excipients were classified into low risk, which is broadly acceptable and no further investigation is required.

Qualitative risk assessment was performed using FMECA on 10 critical factors identified during qualitative risk assessment, which may impact the CQA's. RPN was calculated based on the possibility of cause and its severity on response and control on the cause for all 10 CMA's and CPPs. RPN of concentration of two release controlling hydrophilic polymers was found to be high (64) hence and kneading time was found to be medium (32). For remaining CMAs and CPPs, the RPN number was low (≤ 16) for which no further action was required.

λ_{\max} of HCTZ in purified water was found to be 271 nm. The nanogram per ml concentration (ppm) values for respective concentration of 10 %, 50 %, 80 %, 100 %, 120 % and 150 % was found to be 2.696, 13.480, 21.568, 26.960, 32.352 and 53.920. Bulk density of HCTZ was found to be 0.34 g/ml. Tapped density of Active Pharmaceutical Ingredient (API) was found to be 0.65 g/ml. The compressibility index of HCTZ was 47 %, Hausner ratio was 1.88, angle of repose value was 67.4° suggest that API is having a very, very poor flow property and compressibility.

Tablet hardness for all 12 batches was found to 20±3 kp. Tablet friability for all 12 batches was found to be nil. The average weight of tablet of all 12 trials was found in the range of 227 mg to 234 mg. The average diameter of the tablet of all 12 trials was found in the range of 8.35 mm to 8.55 mm. The average thickness of tablet of all 12 trials was found in the range of 3.73 mm to 3.83 mm. Content uniformity was found within limit of 97 % to 103 % for all 12 batches maximum with acceptance value of 5.0. The individual value of two reproducible batches (F11 and F12) is tabulated below in Table 8.

Tablets prepared were analyzed for *in vitro* dissolution study. Results of dissolution data for batches F1 to F10 are presented in Table 9. Results of reproducible trials F11 and F12, compared with predicted values, are tabulated in Table 10. These results are graphically represented in fig. 4. MRT formulation has been subjected to extensive research. Numerous combinations of independent variables generated responses originated which were analyzed using design expert software. As discussed earlier interpretation of model in this research was done graphically and statistically as well and different graphs were obtained for all responses. Interpretation for response 1 (dissolution at 2 h) is described below. Interpretation for the remaining 3 responses, i.e. dissolution at 5 h, 8 h and 12 h was performed in a similar fashion.

TABLE 8: CONTENT UNIFORMITY RESULTS

Tablet No	Batch No: F11	Batch No: F12
1	100.30 %	99.90 %
2	101.10 %	101.50 %
3	100.60 %	99.60 %
4	99.90 %	99.70 %
5	101.20 %	100.70 %
6	98.30 %	100.60 %
7	102.40 %	101.40 %
8	101.20 %	99.30 %
9	102.00 %	100.80 %
10	102.20 %	100.10 %
Average	100.90 %	100.40 %
Minimum	98.30 %	99.30 %
Maximum	102.40 %	101.50 %
Relative Standard Deviation (RSD)	1.21	0.77
Acceptance value	2.9	1.8

TABLE 9: RESULTS OF DISSOLUTION DATA FOR BATCHES F1 TO F10

Time (h)	F1 (%)	F2 (%)	F3 (%)	F4 (%)	F5 (%)	F6 (%)	F7 (%)	F8 (%)	F9 (%)	F10 (%)
2	18	38	27	22	15	42	6	20	7	26
5	38	62	45	45	30	65	10	42	11	47
8	60	90	69	66	55	95	32	63	34	71
12	75	98	90	83	70	101	44	81	46	92

TABLE 10: RESULTS OF DISSOLUTION DATA FOR BATCHES F11 AND F12

Time (h)	Predicted (%)	F11 (%)	F12 (%)
0	0	0	0
2	30	28	27
5	51	53	50
8	77	76	74
12	90	94	92
F2 (similarity factor)	-	78	79

Note: After application of DOE (2³ full factorial design), design space was determined using statistical and graphical evaluation of results. Software predicted 77 solutions which can help to achieve desired dissolution profile. One of the solutions with maximum desirability was selected and two reproducible batches were manufactured. Similarity factor (F2 value) of these two reproducible trials was compared with predicted response of selected solution. F2 values found satisfactory and required *in vitro* dissolution profile was obtained

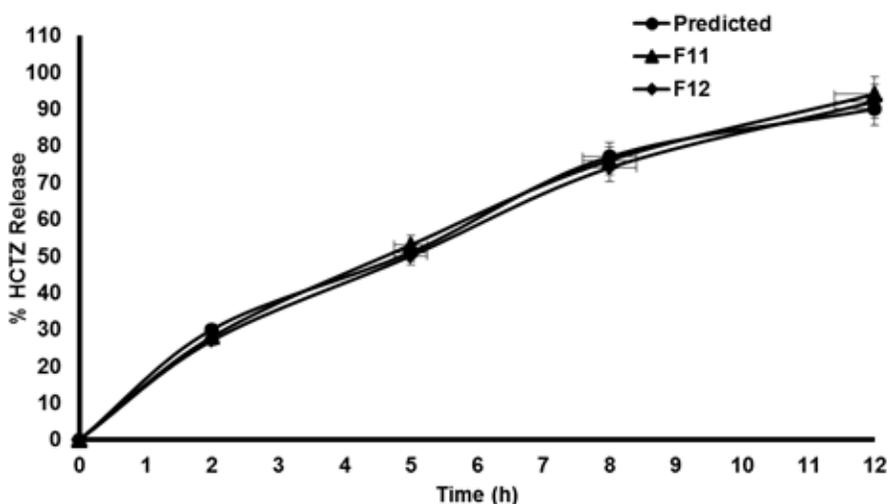


Fig. 4: Dissolution rate of reproducible batches F11 and F12

Note: All results are mean \pm SD (n=6), (—●—): Predicted; (—▲—): F11; (—◆—): F12

In half normal (fig. 5) plot large effects (absolute values) like factor A (HPMC K4M) and factor B (HPMC K100M) appeared in the upper right section of the plot. These factors are found to be farther from 0. Hence these factors have the largest magnitude. While other factor C (kneading time) and interaction effects two way interaction and three-way interaction were near to 0, hence do not exert any significance on responses. Shapiro-Wilk p-value was >0.10 and maximum when factor A and factor B were selected. Shapiro-Wilk p-value was decreased when any third factor or interaction effect was selected. Hence only factor A and B found to be most significant in this case.

In normal plot (fig. 6) factor A (HPMC K4M) and factor B (HPMC K100M) were found to be farthest from the line and hence were statistically significant. These factors exert a negative impact as they are on the left side of the line. Negative effects mean as was a decrease in response when their concentration was increased. Shapiro-Wilk p-value was >0.10 and maximum when factor A and factor B were selected. Shapiro-Wilk p-value decreased when the third factor, i.e. factor C (kneading time) or interaction effect of AB and BC, were selected. Hence only factor A and B were selected and seemed to be most significant.

Ahead, the Pareto chart confirmed the findings of half normal plot and normal plot. It is a bar chart where bars are organized from the highest frequency of occurrence to the lowest frequency of occurrence. In this case, it depicts the factors having a significant impact on CQAs in descending order. Factors which are exceeding the Bonferroni limit are almost certainly significant, while factors beyond the T-value limit are possibly

significant. Whereas factors below the T-value limit are non-significant. Fig. 7 depicts Pareto chart where significant factors, i.e. concentration of HPMC K4M and HPMC K100M were found above the Bonferroni limit whereas non-significant factors were below it. Among significant factors concentration of HPMC K100M has a more significant impact as compared to HPM K4M as t value is more.

Box-Cox plot for response 2 is shown in fig. 8, the blue line showed the current transformation. In this case, it points to a value of 1 for “ λ ” which illustrate the power applied to the response values. A λ of 1 demonstrates no transformation. The green line demonstrates the best λ value, while the red lines demonstrate the 95 % confidence interval surrounding it. In this case, current λ value is 1, which is within 95 % confidence interval (blue line is in between two red lines). The best-suited λ value is 0.6 (green line). Since best-suited λ value and current λ value were very near to each other, the software recommends no transformation.

Range of dissolution results for all four time points was 7 % to 42 % for response 1 (dissolution rate at 2 h); 10 % to 65 % for response 2 (dissolution rate at 5 h); 32 % to 95 % for response 3 (dissolution rate at 8 h) and 44 % to 101 % for response 4 (dissolution rate at 12 h). The following linear equation is multiple linear regression analysis by the best fit method to describe the dissolution profile of HCTZ MRT.

$$\text{Dissolution rate at 2 h} = +47.22500 - 0.36250 A - 0.47500 B \quad (2)$$

$$\text{Dissolution rate at 5 h} = +79.25000 - 0.54375 A - 0.78125 B \quad (3)$$

Design-Expert® Software
DR 2 Hr

▲ Error estimates

Shapiro-Wilk test

W-value = 0.947

p-value = 0.713

A: HPMC K 4 M

B: HPMC K 100 M

C: Kneading Time

■ Positive Effects

■ Negative Effects

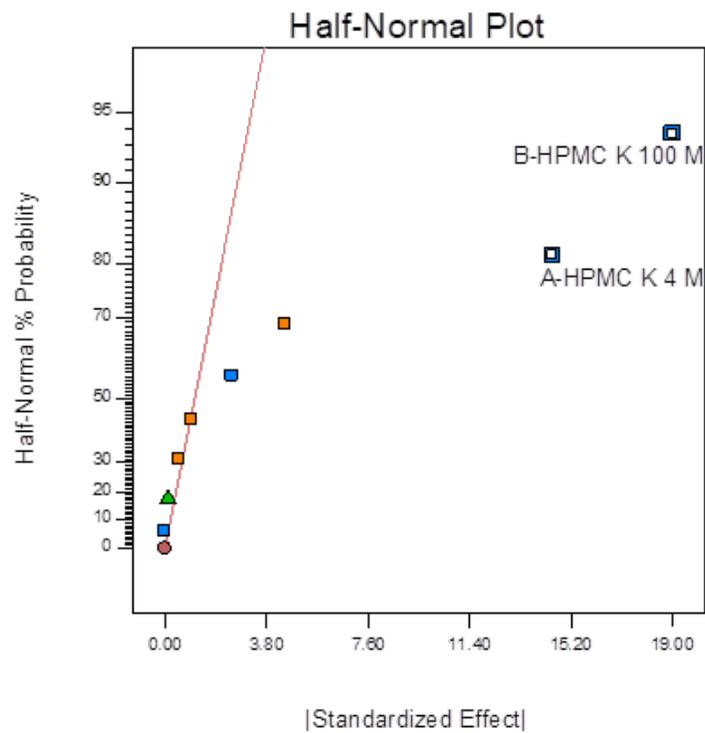


Fig. 5: Half-normal plot for response 1 (dissolution rate at 2 h)

Note: Plot large effects (absolute values) like factor A (HPMC K4M) and factor B (HPMC K100M) appeared in the upper right section of the plot

Design-Expert® Software
DR 2 Hr

Warning! Pure error terms not shown

Shapiro-Wilk test

W-value = 0.854

p-value = 0.240

A: HPMC K 4 M

B: HPMC K 100 M

C: Kneading Time

■ Positive Effects

■ Negative Effects

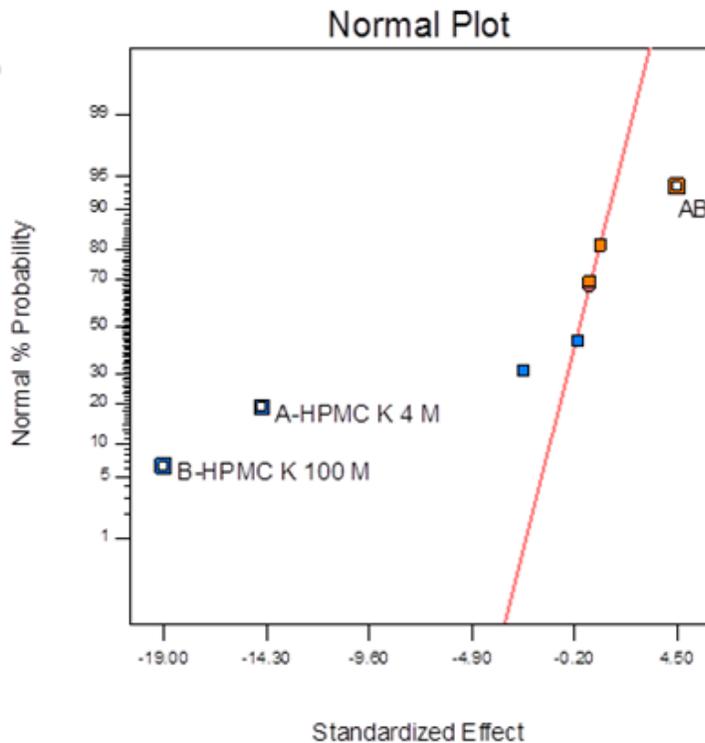


Fig. 6: Normal plot for response 1 (dissolution rate at 2 h)

Note: Factor A (HPMC K4M) and factor B (HPMC K100M) were found to be farthest from the line; (■): Positive effects; (■): Negative effects

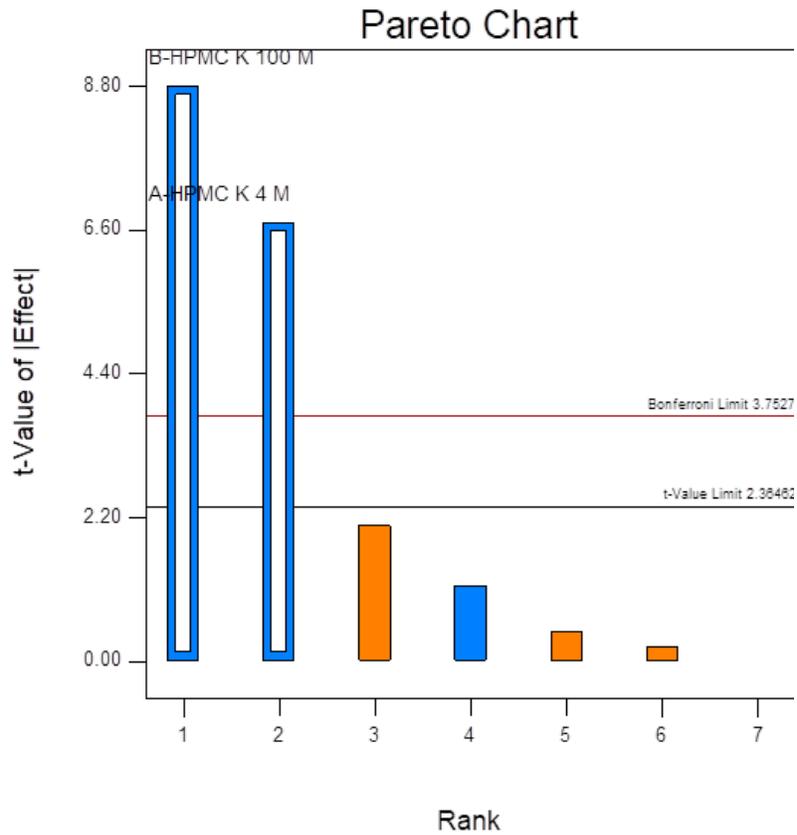


Fig. 7: Pareto chart for response 1 (dissolution rate at 2 h)

Note: The Pareto chart confirmed the findings of half normal plot and normal plot

Design-Expert® Software
DR, 2 Hr

Lambda
Current = 1
Best = 0.6
Low C.I. = -0.08
High C.I. = 1.31

Recommend transform:
None
(Lambda = 1)

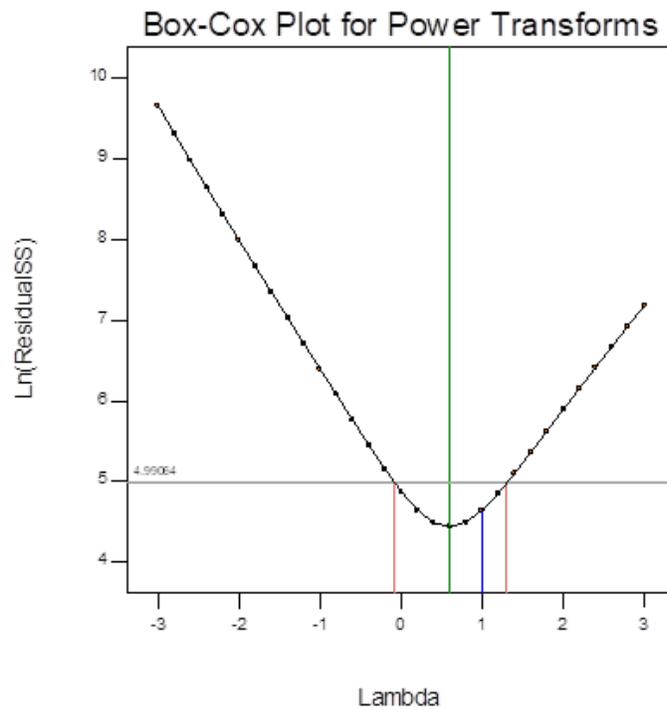


Fig. 8: Box Cox plot for power transform-response 1 (dissolution rate at 2 h)

Note: The blue line showed the current transformation

Dissolution rate at 8 h $h=+110.75000-0.65625A-0.83125B-0.012500C$ (4)

Dissolution rate at 12 h $h=+118.87500-0.56250A-0.80000B$ (5)

Two out three selected independent variables i.e. concentration of HPMC K4M and HPMC K100M, were found to have statistically significant effect ($p < 0.05$) on dissolution rate at 2 h, 5 h and 12 h. The model F value for response 1 was 38.30; response 2 was 65.36 and response 4 was 21.62. Lack of fit F value for response 1, 2 and 4 was found to be 34.63, 12.77 and 41.12, respectively. For dissolution rate at 8 h third factor, i.e. kneading time was also found significant in half normal plot, normal plot, Pareto chart and in linear equation (4). But p value of this factor C was 0.275 greater than acceptable limit of 0.05 which also impacted the overall F-value of the model which was found to be 61.77. Lack of fit value was 11.51 and difference between "Predicted R²" and "Adjusted R²" was 0.0113. Thus ANOVA was re-calculated by dropping kneading time from the calculation. The reduced model results were improved significantly. Overall F value of the model increased to 86.49. Slight improvement observed in lack of fit value which was found to be 11.94. No major variation observed in the difference between "Predicted R²" and "Adjusted R²". New linear equation for response 3 was calculated.

Dissolution rate at 8 h $h=+108.12500-0.65625A-0.83125B$ (6)

Thus for all 4 responses, only two independent factors were found a critical, i.e. concentration of HPMC K4M and HPMC K100M. Based on these data desirability graph, contour plot, 3D surface plot and overlay plot were designed.

Desirability graph was obtained, which is shown in fig. 9. Desirability value of both critical, independent variables was 1 whereas for kneading time it was found to be 0. For individual responses, it was > 0.85 . Further composite desirability of 0.91 was obtained by combining individual desirability. Desirability ranges from zero outside of the limits (not desired) to one at the goal (maximum desirability)^[34]. The values of responses obtained from the optimized formulation are in close agreement with the predicted values by the desirability function, indicating that the statistical model passes the validity test.

Contour plot illustrated the graphical relationship among three numerical variables (HPMC K4M, HPMC K100M and kneading time) in two dimensions where one variable is on the vertical axis (HPMC K4M) and other on the horizontal axis (HPMC K100M). The colour gradient and isolines (lines of constant value) represent the third variable (kneading time). Warmer colours like orange in the contour plots correspond to the high value, whereas the cooler colours like blue corresponds the lower values. The contour lines are the border between different colours. Contour plot for response 1, 2, 3 and 4 is represented in fig. 10.

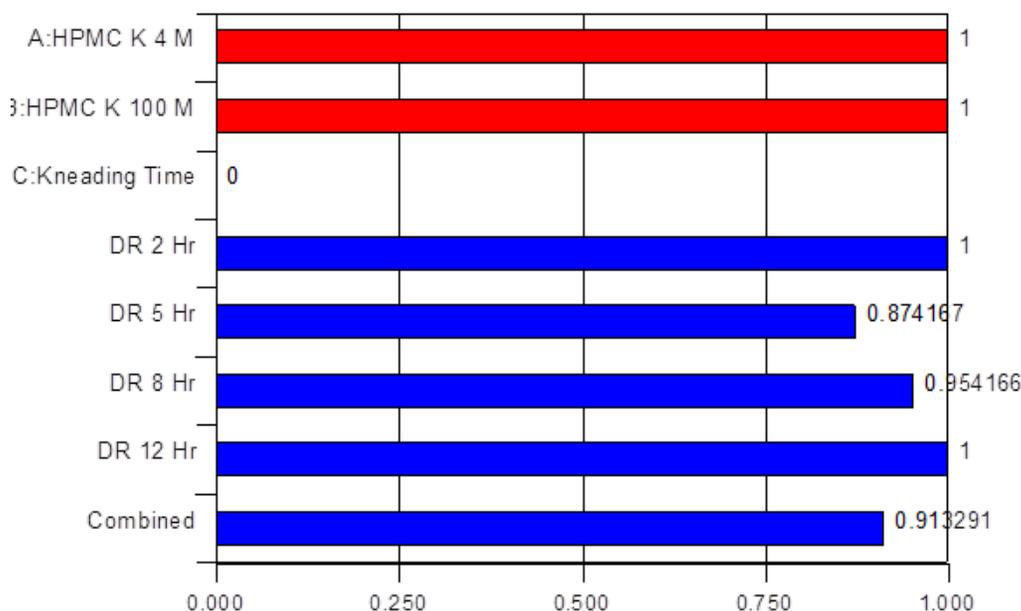


Fig. 9: Desirability graph

Note: Desirability value of both critical, independent variables was 1 whereas for kneading time it was found to be 0

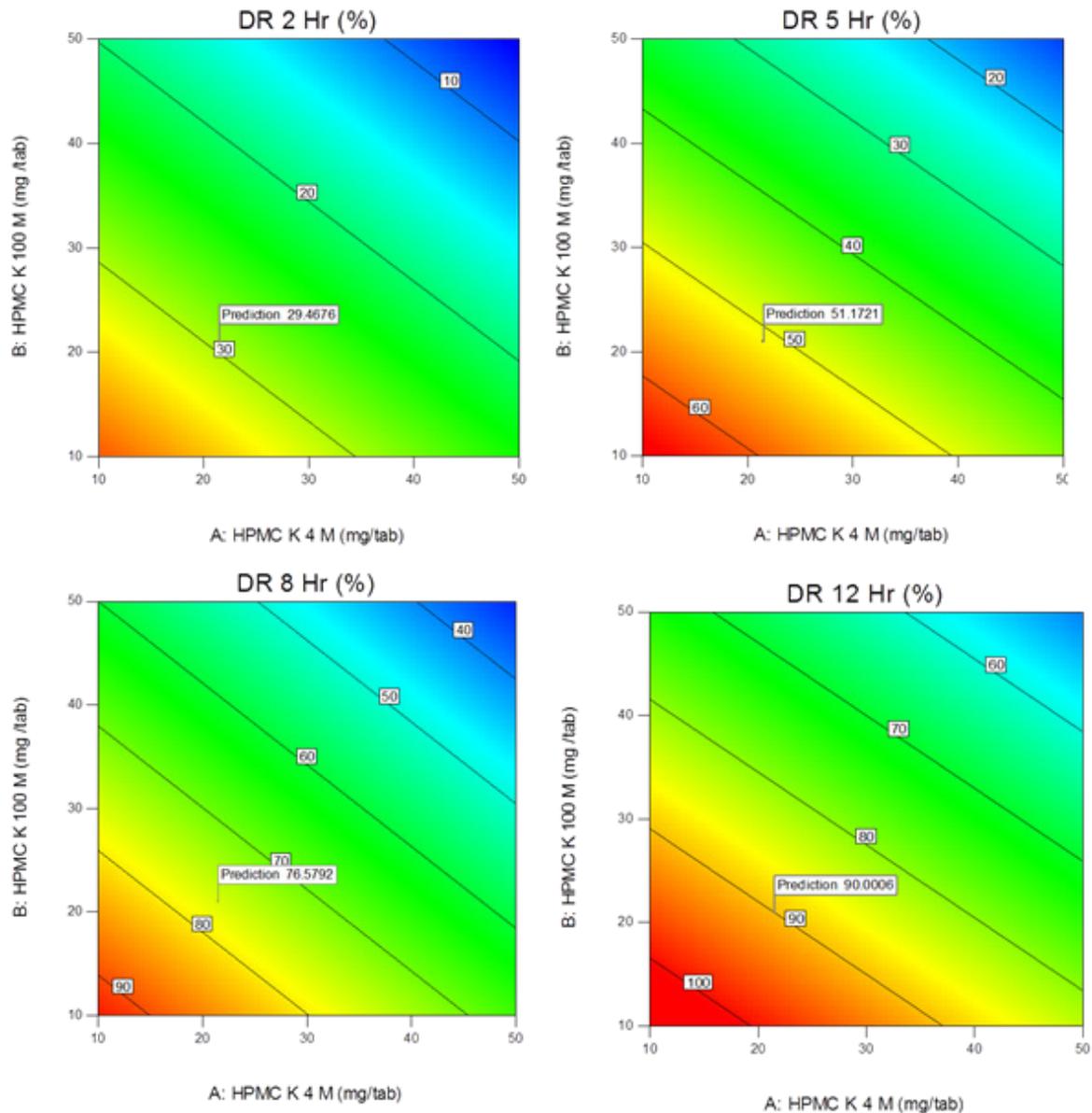


Fig. 10: Contour plot, response 1 (dissolution at 2 h); response 2 (dissolution at 5 h); response 3 (dissolution at 8 h) and response 4 (dissolution at 12 h)

3D surface plot illustrated the relationships among two critical, independent variables (HPMC K4M and HPMC K100M) in three dimensions (fig. 11). Based on regression analysis and 3D surface plot it was identified that increasing the concentration of polymers from 10 gm to 50 mg had little impact on response 1 and major impact on response 2, 3 and 4. The 3D surface plot for all responses is not curved. This predicts that the model is not quadratic or cubic for any response. The red zone in the 3D surface plot represents the maximum value of dissolution obtained during 10 development trials, while the blue zone represents the lowest value obtained. Most of the area of the plot is green, which depicts results in acceptable limits.

The overlay plot provides the design space to work, in

another word the operating window or sweet spot. In this plot (fig. 12), the yellow area indicates the area in which the optimized formulation can be formulated. This is the design space created for HCTZ MRT. Batches manufactured by varying the concentration of critical, independent variables in this yellow portion will provide the required dissolution results. Notice that regions not meeting our specifications are shaded out. The plot establishing ideal operating conditions reaching maximum from the best-fitted model with a map of contour lines follows a direction of movement along the path of maximum response from a reference point. Maximum and minimum boundaries are set for desirable values and the zone is emphasized where all responses are acceptable.

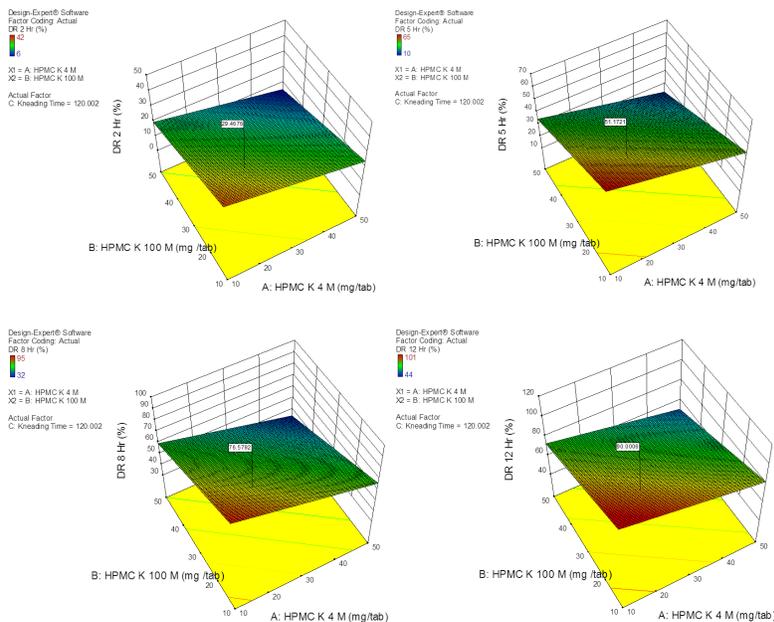


Fig. 11: 3D surface plot, response 1 (dissolution at 2 h); response 2 (dissolution at 5 h); response 3 (dissolution at 8 h) and response 4 (dissolution at 12 h)

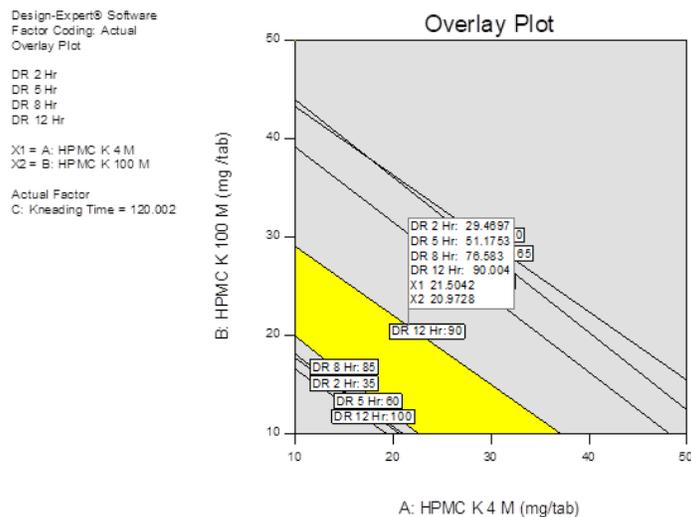


Fig. 12: Overlay plot, it provides the design space to work; in another word the operating window or sweet spot

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Conflict of interests:

The authors declared no conflict of interests.

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