1 Article

Multiobjective optimisation for the greener synthesis of chloromethyl ethylene carbonate by CO₂ and epichlorohydrin *via* response surface methodology

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10 Abstract: In this paper, a statistical analysis with response surface methodology (RSM) has been used 11 to investigate and optimise process variables for the greener synthesis of chloromethyl ethylene 12 carbonate (CMEC) by carbon dioxide (CO₂) and epichlorohydrin (ECH). Using the design expert 13 software, a quadratic model was developed to study the interactions between four independent 14 variables and the reaction responses. The adequacy of the model was validated by correlation 15 between the experimental and predicted values of the responses using an Analysis of Variance 16 (ANOVA) method. The proposed Box-Behnken Design (BBD) method suggested 29 runs for data 17 acquisition and modelling the response surface. The optimum reaction conditions of 353 K, 11 bar 18 CO₂ pressure and 12 h using fresh 12% (w/w) Zr/ZIF-8 catalyst loading produced 93% conversion of 19 ECH and 68% yield of CMEC. It was concluded that the predicted and experimental values are in 20 excellent agreement with ±1.55% and ±1.54% relative errors from experimental results for both the 21 conversion of ECH and CMEC yield, respectively. Therefore, statistical modelling using RSM can be 22 used as a reliable prediction technique for system optimisation for greener synthesis of chloromethyl 23 ethylene carbonate via CO2 utilisation. 24 25 26 27 28

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Keywords: ECH, epichlorohydrin; CMEC, chloromethyl ethylene carbonate; CO₂, carbon dioxide;
 MOF, metal organic framework; ZIF-8, zeolitic imidazolate framework; Zr/ZIF-8, zirconium/zeolitic
 imidazolate framework, RSM; Response surface methodology Optimisation.

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37 **1. Introduction**

38 Carbon dioxide (CO₂) chemistry has earned enormous interest in recent years due to its 39 abundance and inexpensive nature. It is a nontoxic, non-flammable, easily available, and typical 40 renewable C1 source of organic synthesis [1]. CO2 is an important "greenhouse" gas that has drawn 41 greater attention in line with the need for the development of green engineering and sustainable 42 society. In this regard, the development of environmentally benign and efficient synthetic of chemical 43 utilisation of CO₂ has been a subject of immense research in academia as evidenced by the rising 44 number of publications in all areas of CO₂ management [2]. Although CO₂ fixation is unlikely to 45 consume large quantities of CO₂ in the atmosphere, this measure can be regarded as a significant 46 strategy for the development of sustainable and safe processes [3]. With the intriguing applications 47 of organic carbonates, the use of CO₂ as a raw material to synthesize cyclic organic carbonates has 48 gained extensive attention in chemical industries [4].

Organic carbonates are versatile compounds used as raw materials for many industrial applications including raw materials for polycarbonates and polyurethane synthesis [5], green solvents [6], gasoline [7], fuel additives [8], electrolytes in energy storage devices [9], and fine chemical intermediates for pharmaceuticals [10], automobiles [11], electronics [1] and alternative for fuels [12]. Five most important organic carbonates which have attracted significant research interest in recent years include dimethyl carbonate (DMC), diethyl carbonate (DEC), glycerol carbonate (GC), propylene carbonate (PC), and ethylene carbonate (EC) [13].

56 Organic carbonates has unquestionably gained popularity within the context of CO₂ utilisation 57 campaign. However, one of the major challenges faced by chemical industries today is developing 58 the right catalyst with the viewpoint of greener and sustainable environment . In the last decades, the 59 use of homogeneous catalysts for the production of organic carbonates was prevalence [14]. This 60 includes quaternary ammonium salts [9,15], ionic liquids [16], alkali metal salts [17, 18], salen Cr(III) 61 complexes [19] [15], salen Co (III)complexes [14, 20], and salen Mn (III) complexes [21, 22]. Some of 62 the reasons for preference of homogeneous catalyst over solid heterogeneous catalyst include a high 63 turnover number (TON) [23, 22], higher catalytic activity and selectivity 18]. However, homogenous 64 catalyst have been identified with a number of environmental and economic drawbacks including 65 high cost of catalyst production [25], rigorous separation and purification of products [23, 24], 66 production of toxic species [27], use of co-solvent [9], problem of catalyst reusability [2] and catalyst 67 instability at room conditions [28]. As a result of these drawbacks, extensive research efforts in 68 catalysis have brought to spotlight the incredible advantages of heterogeneous catalyst for the 69 synthesis of organic carbonates [29]. Heterogeneous catalysts such as metal organic framework 70 (MOFs) catalysts offers several technical advantages such as stability, separation, handling and reuse 71 of the catalyst and reactor design.

72 Heterogeneous catalysis offers several technical advantages such as stability, separation, 73 handling and reuse of the catalyst and reactor design [22]. Metal organic framework catalyst (MOF), 74 is a new line of heterogeneous catalyst with tremendous results for synthesis of organic carbonates. 75 MOF catalysts, also known as multidimensional porous coordination polymers, are microporous 76 crystalline materials with exceptional properties such as ultrahigh specific surface area, enormous 77 pore spaces and ordered crystalline structure [30, 31]. MOFs have emerged as a suitable candidate 78 for the cycloaddition of CO₂ and epoxide in the synthesis of organic carbonate due to their 79 heterogeneity and reusability requirements [32]. The development of an efficient and stable Zr/ZIF-8 80 catalyst for the synthesis of chloromethyl ethylene carbonate (CMEC) from epichlorohydrin (ECH) 81 and CO2 is a promising greener technology for CO2 utilisation. Incorporating zirconium into ZIF-8 82 has undoubtedly increased ZIF-8 stability as well as the catalytic performance of Zr/ZIF-8 during the 83 series of experiments.

Within the context of Chemical Engineering, low product yields have been attributed to a number of factors including the use of unsuitable choice of catalyst [33], problems achieving the right optimum reaction conditions [27] and inappropriate application of other input parameters [34]. In recent years, optimising system variables to improve product yields have been the focus of many different fields of research. Response surface methodology (RSM) is a collection of statistical and mathematical techniques based on the multivariate non-linear model for optimising processes [35].RSM has received considerable interests in many industrial processes in an attempt to construct

91 empirical models able to correlate the statistical relationships (if any) between a set of variables

- 92 making up an industrial system [34]. Saada et al. [27] and Onyenkeadi et al. [36] have successfully
- 93 modelled and optimised the synthesis of organic carbonates with five independent variables at 3-
- 94 levels (3⁵) factorial design. Their results have been validated using regression analysis.

95 Several authors including AboElazayem et al. [37] and Saada et al. [27], have criticised the 96 traditional 'trial-and-error" optimisation methods and "one-factor-at-a-time" (OFAT) as time-97 consuming and considered quite expensive due to a large number of samples and experimental trials 98 involved. Another drawbacks identified with traditional optimisation methods is low overall 99 efficiency [38]. Sadeghi and Sharifnia [39], describes OFAT as a method that excludes the interactive 100 effects among the variables and does not express the complete effects of the parameters on the 101 process. In order to overcome these drawbacks, Yu and He [40] suggested multivariate statistical 102 techniques, which are full three-level factorial designs: Box-Behnken designs, central composite 103 designs and Doehlert designs.

104 A multivariate optimisation technique is a statistical tool for analysing complex non-linear 105 processes. This is especially useful when interactions are not known or optimal process parameters 106 are to be determined in order to make a process more robust [41]. It is cost-effective as fewer 107 experimental trials are required, high computational efficiency [39] and it requires very little or no 108 human experience to obtain an accurate and satisfactory results [27]. Therefore, the systematic 109 application of RSM optimisation for the catalytic conversion of epichlorohydrin (ECH) and carbon 110 dioxide (CO₂) to chloromethyl ethylene carbonate (CMEC) can be regarded as an innovative way of 111 CO₂ utilization

112 2. Experimental Methods

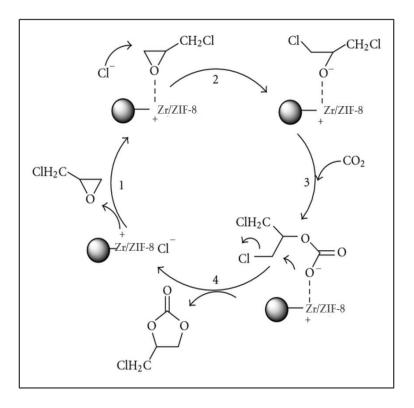
113 2.1. Chemicals and materials

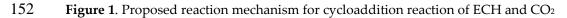
Acetone (99%), chloromethyl ethylene carbonate (99%), epichlorohydrin (purity; 99%), zinc nitrate hexahydrate (Zn(NO₃)₂·6H₂O (purity; 99%), dimethylformamide (purity; 99%) and zirconium (IV) oxynitrate hydrate (ZrO(NO₃)₂·6H₂O, 99.99%) were purchased from Sigma-Aldrich Co. LLC. Methanol (99%) and *n*-pentane 99.8%) were both procured from Fisher Scientific UK Ltd. ZIF-8 catalyst was purchased from Sigma-Aldrich Co. LLC under the trademark of Basolite Z1200. All chemicals and catalysts were used without further purification or pre-treatment

- 120
- 121 2.2 Catalysts preparation

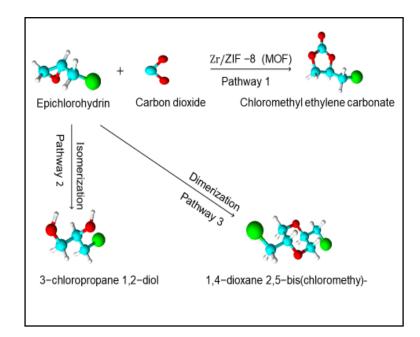
122 Zirconium-doped ZIF-8 (Zr/ZIF-8) was synthesised according to a method, which was 123 previously described elsewhere [42,43]. Briefly, 8 mmol of zinc nitrate hexahydrate (Zn(NO₃)₂·6H₂O, 124 purity 99.99%) and zirconium (IV) oxynitrate hydrate (ZrO(NO₃)₂·6H₂O, purity 99.99%) solutions in 125 a stoichiometric ratio of Zn: Zr =9:1 were dissolved in 6.2 mmol of methanol. A separate solution of 126 14.2 mmol of 2-methylimidazole and 600 mml of methanol was prepared in another flask which was 127 added by dropwise addition to the Zr-Zn based solution. The mixture conducted in an ambient 128 temperature under nitrogen gas flow was vigorously stirred for 6 hrs. The crystals were collected and 129 separated by centrifugation at 300 rpm for 30 min. The solution was washed thoroughly with 130 methanol three times and then dried at room temperature. The crystals were left to dry overnight at 131 373 K. The greyish-white powders of Zr-ZIF-8 sample were further washed with DMF for 24 h in 132 order to remove any excess of an unreacted organic linker. The solution was then heated at a 133 temperature of 373 K in order to activate it. The sample was allowed to cool down to room 134 temperature naturally before been capped in a vial and refrigerated, which was ready for use in 135 catalytic reactions.

137 On the basis of our experimental results and theoretical understanding, we proposed a plausible 138 reaction mechanism for the coupling reaction of ECH and CO₂. Figure 1 shows the reaction 139 mechansim was initiated by coordination of ECH with Lewis acid site Zn²⁺ to form the adduct of zinc-140 epoxide complex, then nucleophilic interaction on the electrophilic carbon of CO_2 (step 1). At the 141 same time, the acidic sites (unsaturated coordinative Zn or structural defects) of Zr/ZIF-8 interact 142 with the oxygen atom of an epoxide (step 2). The activated CO₂ attacks the less sterically hindered 143 carbon atom of epoxide, which results in the epoxide ring-opening (step 3). Finally, the ring-closure 144 step takes place between the O-anion and carbon atom in the intermediates to produce CMEC (step 145 4). Figure 2 shows the reaction pathways 1, 2 and 3 with some by-products. The decline in selectivity 146 and CMEC yield was expected because the gas chromatography mass spectroscopy (GC-MS) analysis 147 of the samples shows that 17.3% of 3-chloropropane 1,2-diol and 14.1% 2,5-bis (chloromethyl)-1,4-148 dioxane (by-products) have been formed at 353 K. Similar by-products and results have been 149 reported by Mousavi et al. [65]. This may explain in part why a drop in selectivity and yield of CMEC 150 was recorded.





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- 154



156 Figure 2. Reaction pathways for cycloaddition reaction of ECH and CO₂

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158 2.4 One-factor-at-a-time (OFAT) analysis

OFAT analysis was developed to determine the preliminary effective range of the selected parameters for statistical analysis. The effect of 4-single factors (temperature, pressure, reaction time and catalyst loading) were evaluated for the synthesis of chloromethyl ethylene carbonate. The OFAT analysis investigated all the four parameters in the following range: reaction temperature K (313, 323, 333, 343, 353, 363, 373); pressure (bar) (4, 6, 8, 10, 12, 14, 16); catalyst loading (%) (w/w) (5, 7.5, 10, 12.5, 15); reaction time (h) (4, 6, 8, 10, 12, 14, 16).

- 165
- 166 2.5 Experimental design
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Based on the OFAT results, a 3-level, 4-factor (3⁴) factorial design with 29 runs of experiments were suggested for this study in order to determine the responses (conversion and yield). In this design, all the four factors were varied simultaneously over a set of experimental runs. To avoid bias, the suggested set of experiments were carried out randomly and the four factors: temperature, pressure, catalyst loading and reaction time have been labelled as x_1 , x_2 , x_3 and x_4 respectively as shown in Table 1. The variables and their coded and uncoded values are presented with each levels and range as given below in Table 1 (i.e. -1, 0, 1).

175

176 **Table 1**. Experimental design variables and their coded levels

Variables	Code		Range and L	evels
		-1	0	+1
Temperature (K)	χ_1	313	353	373
Pressure (bar)	χ_2	4	8	16
Catalyst loading (w/w)	$\boldsymbol{\chi}_3$	5	7	15
Time (h)	χ_4	4	8	16

178 The total number of experiments (N) is given by Equation (1)

179

180 $N = k^2 + K + C_p$ (1)

181

182 Where, k is the number of independent variables, Cp is the replicate number of the centre point.

Table 2: Experimental design matrix with the actual and predicted responses

Run	Т	Р	t	Catalyst loading	_	Predicted		Predicted CMEC
	χ_1	χ_2	χ_3	χ_4	ECH conv.	ECH	yield (%)	yield (%)
	(K)	(bar)	(h)	(w/w)	(%)	conv. (%)		
1	313	4	8	7	42	46.33	16	14.63
2	353	8	16	5	67	68.17	33	32.29
3	353	8	8	7	84	84.00	64	64.00
4	313	16	16	7	58	59.88	29	31.67
5	353	8	8	7	84	84.00	64	64.00
6	353	8	4	5	52	55.67	26	26.46
7	353	4	16	7	75	72.96	40	41.04
8	313	8	8	5	54	55.79	23	24.88
9	353	16	16	7	93	93.29	65	66.04
10	313	8	8	15	58	56.46	31	30.38
11	353	16	8	5	86	81.21	36	35.00
12	373	16	8	7	86	81.67	45	46.13
13	373	4	8	15	75	82.33	54	57.63
14	353	16	8	15	88	91.38	68	68.00
15	373	8	4	7	68	62.38	38	33.33
16	353	8	8	7	84	84.00	64	64.00
17	373	8	16	15	90	85.38	64	60.67
18	373	16	8	5	54	59.29	26	28.88
19	313	16	8	7	90	82.67	55	51.13
20	373	8	8	15	86	87.96	64	64.38
21	353	4	4	7	68	64.46	35	36.21
22	353	8	8	15	84	84.00	64	64.00
23	353	8	8	7	84	84.00	64	64.00
24	353	16	4	15	70	75.79	35	36.21
25	313	8	4	15	52	52.88	23	24.33
26	353	8	16	15	89	85.33	65	64.29
27	353	4	8	5	66	58.88	37	33.50
28	353	4	8	15	77	78.04	44	43.00
29	373	8	4	15	69	67.83	35	35.46

186 2.6. Statistical analysis

187 The empirical mathematical model showing the effect of the independent variables x_1 , x_2 , x_3 and 188 x_4 on the predicted response Y was investigated using the second order polynomial regression 189 equation with backward elimination.

- 190 A quadratic equation derived using RSM for the model is shown using Eq. 2:
- 191

192
$$Y = b_o + \sum_{i=1}^n b_i x_i + \sum_{i=1}^n b_{ii} x_i^2 + \sum_{i=1}^{n-1} \sum_{j>1}^n b_{ij} x_i x_j + \mathcal{E}$$
(2)

193

where Y is the predicted response, x_i and x_j are the independent variables in coded levels $(i \neq j)$, b_i , b_{ii} , and b_{ij} are the coefficients for linear, quadratic and interaction effects, respectively, b_0 is the model coefficient constant, n is the number of factors, and \mathcal{E} is the model random error [46].

197 The adequacy of the predicted models was validated by a number of statistical tools such as 198 correlation coefficient (R^2), adjusted coefficient of determination (R^2_{adj}) and the predicted coefficient 199 of determination (R²_{pred}). The statistical significance of the predicted model was analysed by 200 (ANOVA) using a regression coefficient by conducting the Fisher's F-test at 95% confidence level [27]. 201 Design Expert 11 software (Stat- Ease Inc., Minneapolis, MN, USA) was used for the design of 202 experiment, regression and graphical analysis. Statistical significance of the results have been 203 presented by p < 0.05 and mean ± SE. The fit quality of the polynomial equation has been proved by 204 R².

205

206 2.7. Experimental procedures

207

208 In a typical cycloaddition reaction, chloromethyl ethylene carbonate (CMEC) was synthesised 209 from epichlorohydrin (ECH) and carbon dioxide (CO2) in a solvent free and co-catalyst free 210 conditions. A 25 mL stainless steel autoclave reactor equipped with a stirrer, thermocouple, heating 211 mantle and controller was initially charged with the required amount of limiting reactant ECH and 212 a known amount of Zr/ZIF catalyst. The reactor was then heated to a specific temperature and 213 continuously stirred. When the desired reaction temperature was reached, a known amount of liquid 214 CO₂ was injected to the reactor via SCF pump at an assumed t=0. The reaction mixture was left stirring 215 and monitored for a set period of time.

After the reaction was completed, the reactor was cooled down to room temperature using an ice bath, depressurized and then the reaction mixture was filtered. The catalyst was separated, washed with acetone and dried in a vacuum oven. The product obtained from the filtered reaction mixture was then analysed using gas chromatography (GC).

- 221 3. Results and Discussion
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- 223 3.1 Analysis of variance (ANOVA)

224 An analysis of variance (ANOVA) was performed using the Design Expert software in order to 225 investigate the fitness and significance of the model for each regression coefficient. The empirical 226 analysis of RSM model used to correlate the interactive relationship between the controlling factors 227 $(x_1, x_2, x_3 \text{ and } x_4)$ and the predicted response Y (conversion of ECH and yield of CMEC) are shown 228 in Table 2 above. The results of the experimental trials at various process conditions show the range 229 of the responses from 42 to 93% of ECH conversion and 16 to 68% of CMEC yield. This trend is 230 consistent with the results published by Saada et al. [27] and Onyenkeadi et al. [36]. The predicted 231 values sufficiently correlate with the observed values and fit the RSM model design for this study. 232 The best fitting model was established by a regression analysis using Design Expert software. Fitting

233 of the data to various models (linear, two factors interactions (2FI), quadratic and cubic polynomials) 234 and their following analysis of variance [ANOVA].

- 235
- 236 3.2 Development of regression model

237 In this study, the purpose of using the RSM was to generate a statistical model that demonstrate 238 mutual interaction between the responses and the effective variables. Through the experimental 239 matrix generated in a randomised run of experiments, the obtained responses are given using second 240 order polynomial regression equation with backward elimination as shown below. The equations 241 show the empirical relationship between the conversion of ECH and the yield of CMEC and the 242 experimental factors in coded forms.

243

244	$Y_1 = 84.15 + 8.75 x_1 + 8.86 x_2 + 7.22 x_3 + 7.500x_4 - 9.005 x_1x_2 + 7.25 x_1x_3 + 4.15 x_1x_4 - 2.150 x_2x_3$	
245	+ 2.10 x_2x_4 + 1.10 x_3x_4 - 11.45 x_{1^2} + 0.80 x_{2^2} - 7.10 x_{3^2} - 7.30 x_{4^2} (3)	
246		
247	$Y_2 = 64.15 + 9.10 x_1 + 6.30 x_2 + 10.30 x_3 + 8.70 x_4 - 12.15 x_1 x_2 + 7.25 x_1 x_3 + 5.25 x_1 x_4$	
248	+ 5.40 x_2x_3 + 6.30 x_2x_4 + 5.60 x_3x_4 - 14.40 x_{1^2} - 7.55 x_{2^2} - 12.75 x_{3^2} - 12.15 x_{4^2} (4)	
249		
250	Y_1 and Y_2 are the response variables: ECH conversion and CMEC yield. The independe	nt
251	variables are X_1 , X_2 , X_3 and X_4 re which are reaction temperature, pressure, catalyst loading and reaction	on
252	time, respectively. The results of interaction effects between the independent variables were deduced	ed
253	as follows: (temperature-pressure; x_1x_2 , temperature-catalyst loading; x_1x_3 , temperature-reaction	on
254	time; x_1x_4 , pressure-catalyst loading; x_2x_3 , pressure-time; x_2x_4 and catalyst loading -reaction time	ıe;
255	$\chi_3\chi_4$). Finally, the excess of each independent variable was represented as follows: (temperature	e-
256	temperature; χ_{1^2} , pressure-pressure; χ_{2^2} , catalyst loading-catalyst loading; χ_{3^2} and reaction time	_
257	reaction time; χ_{4^2}).	
258		

259 Table 3. Analysis of variance (ANOVA) of developed model for ECH conversion

	Sum of		Mean			
Source	square	Diff.	Square	F Value	p-value	Significance
Model	5014.09	14	362.01	11.21	< 0.0001	HS
<i>x</i> ₁ -temperature	827.75	1	827.75	26.02	0.0001	HS
<i>x</i> ₂ -pressure	854.08	1	854.08	27.10	< 0.0001	HS
x3-catalyst loading	871.33	1	871.33	18.68	0.0006	HS
<i>x</i> ⁴ -reaction time	619.00	1	619.00	21.58	0.0005	HS
$\chi_1\chi_2$	308.25	1	308.25	9.44	0.0060	HS
X1X 3	177.00	1	177.00	4.98	0.0283	S
$\chi_1\chi_4$	58.00	1	58.00	1.95	0.1842	NS
X 2 X 3	18.25	1	18.25	0.62	0.4451	NS
X2X4	38.25	1	38.25	1.29	0.2754	NS
X3X4	5.15	1	5.15	0.19	0.6691	NS
χ_{1^2}	789.39	1	789.39	25.73	0.0001	HS
χ_{2^2}	4.16	1	4.16	0.15	0.7030	NS
χ_{3^2}	353.82	1	353.82	11.13	0.0049	S

χ_{4^2}	336.95	1	336.95	9.40	0.0061	S
Residual	448.08	14	34.86			
Lack of Fit	448.08	10	44.81	0.44	0.56	NS
Pure Error	0.000	4	0.000			
Cor Total	5553.17	28				

261 S: significant.

262 NS: not significant.

263 HS: highly significant

264

265 Table 4. Analysis of variance (ANOVA) of developed model for CMEC yield

	Sum of		Mean			
	square	difference	Square	F Value	p-value	Significance
Model	7335.55	14	431.90	68.68	< 0.0001	HS
<i>x</i> ¹ -temperature	1023.00	1	1023.00	139.85	< 0.0001	HS
<i>x</i> ₂ -pressure	468.75	1	468.75	60.53	< 0.0001	HS
x3-catalyst loading	1260.75	1	1260.75	162.80	< 0.0001	HS
<i>x</i> ₄ -time	901.33	1	901.33	116.39	< 0.0001	HS
$\chi_1 \chi_2$	576.00	1	576.00	74.38	< 0.0001	HS
$\chi_1 \chi_3$	225.00	1	225.00	29.05	< 0.0001	HS
$\chi_1 \chi_4$	100.00	1	100.00	12.91	0.0029	HS
$\chi_2 \chi_3$	119.00	1	119.00	15.62	0.0014	HS
$\chi_2 \chi_4$	146.25	1	146.25	20.18	0.0005	HS
$\chi_3 \chi_4$	128.25	1	128.25	17.08	0.0010	HS
χ_1^2	1258.78	1	1258.78	176.11	< 0.0001	HS
χ_2^2	347.29	1	347.29	42.52	< 0.0001	HS
χ_{3}^{2}	897.34	1	897.34	128.27	< 0.0001	HS
χ_4^2	897.05	1	897.05	120.62	< 0.0001	HS
Residual	104.24	14	7.87			
Lack of Fit	104.24	10	10.43	1.35	0.325	NS
Pure Error	0.000	4	0.000			
Cor Total	7444.79	28				

266

267 S: significant.

268 NS: not significant.

269 HS: highly significant

270

271 3.3. Statistical analysis of regression model

The response model calculated for this study has demonstrated a high degree of accuracy with an R^2 of 0.9973 and an R^2_{adj} of 0.9954 at a confidence level of 95 %. This agrees well with the result of

274 [37] where the determination coefficient values, R^2 and R^2_{adj} , for the reliability of the model fitting,

were calculated to be 0.9932 and 0.9658, respectively. Mäkelä et al. [47], also suggested that a good model fit should yield an R^2 of at least 0.8. Furthermore, the values of R^2 and R^2_{adj} are close to 1.0. This demonstrates that a mutual correlation exists between the experimental and the predicted values. Therefore, the statistical significance of the second-order polynomial equation for this design shows that the regression model is statistically significant (*P*<0.0001) and the lack of fit test is non-significant (p>0.05) relative to the pure error.

281 The following assumptions have been used to conclude the statistical adequacy checking of the 282 model based on the ANOVA results. The first assumption is the similarity between the predicted and 283 actual data of the two models as shown in Figure 3. This demonstrated that the variations between 284 Figures 3a and 3b are statistically non-significant (NS) and the predicted model can be said to show 285 a high level of accuracy and the adequacy. Another assumption is the normality of the residuals. The 286 plot of residuals has been investigated using normal plot where most of the points approximately 287 form a straight line as shown in Figures 4a and 4b. This shows that residuals for both ECH conversion 288 and CMEC yield are in normal distribution. This assumption is consistent with the report of Mäkelä 289 [47]. Thirdly, the randomisation of the residuals have also been assessed using a plot between the 290 residuals versus predicted responses. The random distribution in Figure 5 shows lack of clear 291 structure with a normal distribution at zero mean and variance [48]. It can be observed in Figures 5a 292 and 5b that points above and below the diagonal line show areas of over or under prediction with no 293 definite structure.

294

295 3.4. Model Fitting and adequacy checking

296 In order to verify the model for fitting and adequacy test at 95% confidence level, it was 297 necessary to apply analysis of variance (ANOVA). As shown in Tables 3 and 4, the ANOVA results 298 indicated a good model fit with the model F-value is 0.44 (Table 3) and the probability > F of less than 299 0.0001 implied that this model was significant. The lack of fit test (non-significant: p>0.05) was also 300 considered a good statistical indicator for the model adequacy checking as it relates the residual error 301 to the pure error from the replica design point [49]. As indicated in ANOVA Tables 3 and 4, the 302 conversion of ECH and CMEC yield was significantly (p<0.05) influenced by the interactive and 303 quadratic effects of all the independent variables.

- 304
- 305 3.5 *Response surface plots analysis*

After the regression models had been built and model adequacy checking was tested, 3D response surface plots and their corresponding 2D contour plots were drawn for a model equation. Different shapes of the contour plots indicate different levels of interaction between two variables. For example, an oval plot represents significant interactions between the two selected variables while a circular plot means otherwise [50]. According to Rabiee et al. [51], 3D response surface promotes understanding of system behaviour. It is also significant in recognising the characters of response surface [52].

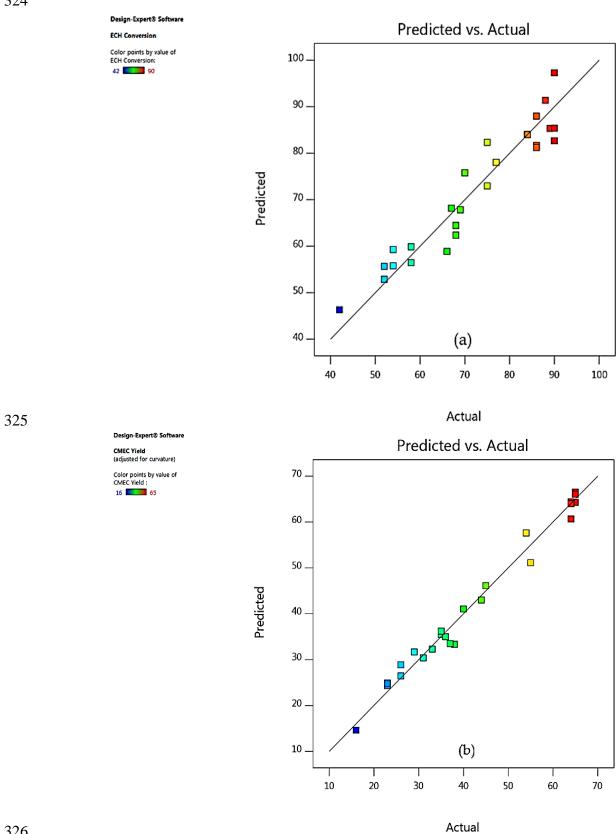
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314 4.0. Effect of one factor at a time experiments on responses (OFAT)

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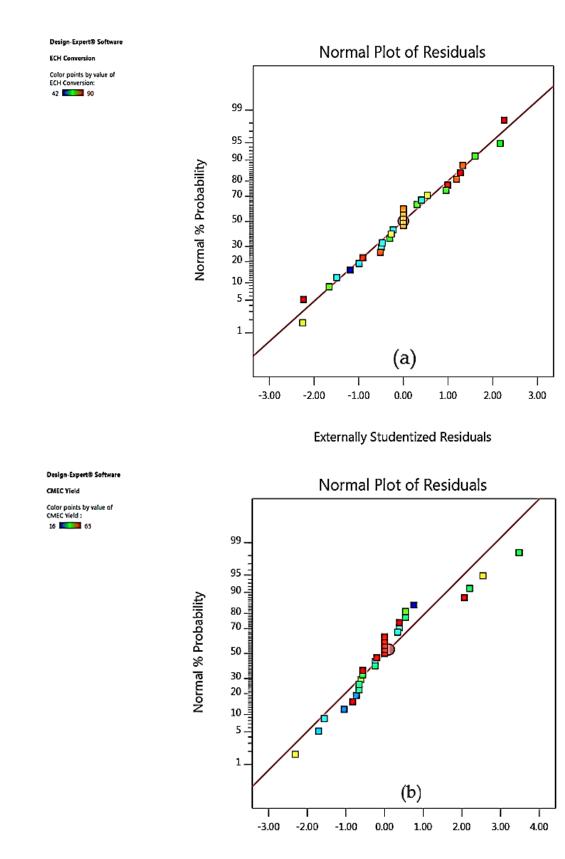
The effects of individual reaction variables (temperature, pressure, time and catalyst loading) and their interactions on reaction responses (conversion and yield) have been investigated using the 3D-surface and 2D-contour plots generated from the predicted quadratic model as evidenced in Figures 6 to 9. The experiments have been carried out by varying one reaction parameter at a time while keeping other parameters constant at the following reaction conditions: reaction temperature 353 K, CO₂ pressure 11 bar, reaction time 12 h, catalyst loading 12% (w/w).

- 322
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327 Figure 3. Predicted *versus* actual values models for (a) ECH conversion and (b) CMEC yield.



Externally Studentized Residuals

Figure 4. Normal plot of residuals for (a) ECH conversion and (b) CMEC yield.



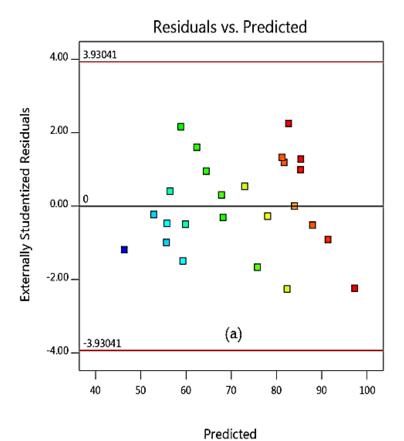
ECH Conversion

Color points by value of ECH Conversion: 42 90

Design-Expert® Software

65 16

CMEC Yield Color points by value of CMEC Yield :



332

Residuals vs. Predicted 3.93041 4.00 **Externally Studentized Residuals** 2.00 0 0.00 -2.00 (b) -3.93041 -4.00 Т Т Т Т Т L . 60 10 20 30 40 50 70 Predicted

333

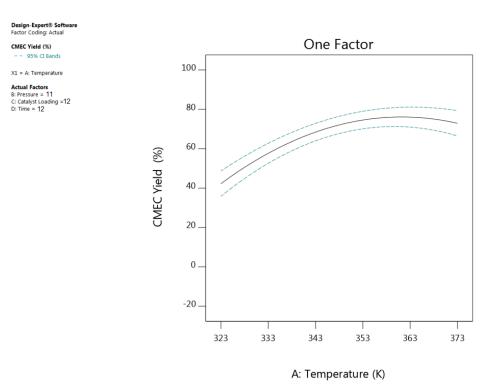
334 Figure 5. The plot of residuals versus predicted response for (a) ECH conversion and (b) CMEC

335 yield.

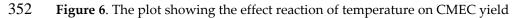
336 4.1.1 Effect of reaction temperature

337

338 To a significant extent, it is largely agreed that a directly proportional relationship exists between 339 temperature and CMEC yield as shown in the results of ANOVA in Table 4. The influence of reaction 340 temperature on CMEC yield has been investigated by varying temperature over the range of 323 K 341 to 373 K. As evidenced in Figure 6, CMEC yield increased steadily from 40% to 68% as temperature 342 increased from 323 K to 353 K. However, a gradual decrease in CMEC yield was observed at higher 343 temperature values beyond 353 K. This may be due to the formation of diols and dimers of 344 epichlorohydrin above optimum temperature [53]. Saada et al. [27] explained that higher reaction 345 temperatures caused a shift in the equilibrium to the reactant side and resulted in a reduced DMC 346 yield. The same temperature effect was also reported by Kilic et al. [54], they have observed that as 347 they increased the reaction temperature from 348 K to 373 K (while keeping other variables constant), 348 there was a corresponding increase in ECHC yield from 65.8% to 97.0%. However, further increase 349 in temperature beyond 373 K, caused a slight decrease both in the ECHC yield and catalyst selectivity. 350

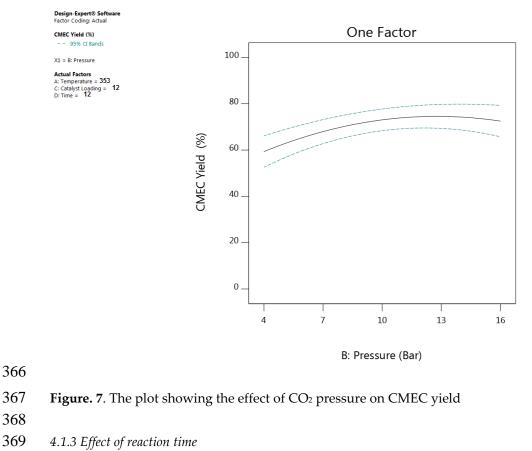


351



- 353 4.1.2. Effect of CO₂ pressure
- 354

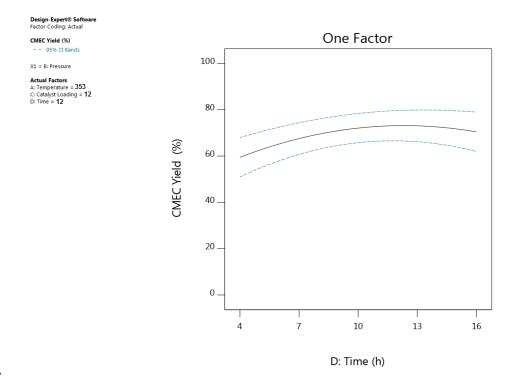
355 ANOVA Table 4 demonstrates the dependence of CO₂ pressure on CMEC yield, since CO₂ acts 356 both as reactant and reaction medium simultaneously [55]. As indicated in Figure. 7, when CO₂ 357 pressure was increased from 8 to 11 bar, the CMEC yield also increased from 50% to 68%. Conversely, 358 with the CO₂ pressure of 11.5 bar, a 59% CMEC yield was recorded indicating a declining effect. 359 Zhong et al. [56] demonstrated the effect of variation in CO₂ pressure on organic carbonates. They 360 have enhanced more propylene carbonate (PC) yield when CO₂ pressure was increased from 1 MPa 361 to 3 MPa. However, when CO₂ pressure was further increased to 4MPa, they observed that the 362 concentration of propylene oxide (PO) in gas phase had decreased as a result of dilution by CO₂ and 363 consequently resulted in a reduced PC yield. It is therefore concluded that the optimum CO₂ pressure 364 based on OFAT analysis for this set of experiments was 11 bar of CO₂ pressure.

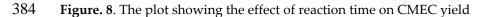


371 Reaction time is one of the crucial factors in a catalytic reaction. Figure 8 shows a direct 372 proportionality effect between reaction time and the CMEC yield; the yield increased gradually as 373 reaction time increased until it reaches 68% in 12h. Further increase in reaction time beyond 12 h, 374 resulted in a continuous decline in CMEC yield as shown in Figure 8. This could be as a result of 375 formation of polymerised CMEC caused by prolonged reaction time [8]. A similar phenomenon was 376 also reported by Onyenkeadi et al.[36], where increasing in reaction time from 8 to 16 h was directly 377 proportional to butylene carbonate (BC) yield. However, prolonged reaction time beyond this time 378 resulted in decrease in BC yield. 379

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385 4.1.4 Effect of catalyst loading

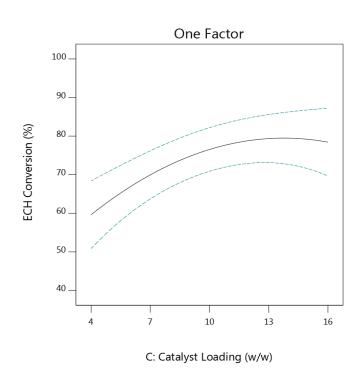
386 The effect of catalyst loading on CMEC yield was investigated by varying Zr/ZIF-8 loading from 387 5 to 15% (w/w). As shown in Figure 9, it can be observed that as catalyst loading was increased, 388 CMEC yield also increased proportionally from 42% reaching a maximum of 68% at 12% (w/w) 389 catalyst loading. It was then decreased progressively when the amount of catalyst was further 390 increased to 13% (w/w), indicating that optimum catalyst loading had been exceeded. It would be 391 expected that the number of active sites available for the reaction of ECH and CO₂ would increase as 392 catalyst loading increases [57]. However, Han et al. [58] argued that an excessive increase in catalyst 393 loading tends to provoke formation of undesirable side-products (in their experiment, a by-product 394 of diglyceride (GDL) or triglyceride (GTL) was formed), thereby causing a drop in glycerol 395 monolaurate (GML) selectivity as they increased the amount of catalyst beyond 2% (w/w). Similarly, 396 in the present work, increase in the amount of catalyst loading beyond the optimum level was 397 unfavourable to the reactive system resulting in a reduced CMEC yield. Therefore, the optimum 398 catalyst loading for this reactive system is 12% at a reaction temperature of 353 K for 12 h at 11 bar of 399 CO₂ pressure.

400

Design-Expert® Softwa Factor Coding: Actual ECH Conversion (%)

- - 95% CI Bands X1 = C: Catalyst Loading

Actual Factors A: Temperature = 353 B: Pressure = 11 D: Time = 12



402

403

404 **Figure. 9.** The plot showing the effect of catalyst loading on CMEC yield

405

406 5.0 Interactive effect of process variables on responses

407

408 The interaction effect of each pair of reaction variables have been investigated using ANOVA 409 results, 3D surface and 2D contour plots. The interaction effect of some process variables on ECH 410 conversion and CMEC yield produce different effect at different levels of other variables. Therefore, 411 3D plots have played a crucial role in making accurate predictions about process optimisation [59]. 412 From ANOVA Table (3 and 4), it can be observed that all the four reaction parameters are deemed 413 significant and can affect the process response tremendously at different levels of interaction. Hence, 414 the interactive effect of process variables has a direct influence on the system optimisation. The 415 interaction effect between a pair of variables would be negligible if the contour plot of the response 416 surface is circular. Conversely, the interactions effect would be significant if the contour plot is 417 elliptical [60]. Therefore, instead of studying single variable (as in conventional method) the 418 interactions were investigated which is significant for a comprehensive optimisation study

419

420 5.1 Interactive effect of temperature and pressure

421

422 As depicted in Figure. 10 and the ANOVA Tables 3 and 4, the interaction effect of reaction 423 temperature and CO₂ pressure has played significant roles in both ECH conversion and CMEC yield 424 (while keeping reaction time and catalyst loading at their optimum: 12 h and 12 % (w/w) 425 respectively). At lower reaction temperature (e.g. at 323 K), increase in the CO₂ pressure from 4 to 16 426 bar increases the CMEC yield from 47 to 68%. However, at higher reaction temperature beyond 427 353 K showed a negative effect on CMEC yield (Figure. 10a), this could possibly be as a result of 428 formation of by-products at elevated temperature as indicated in the reaction mechanism (Figure 1). 429 Furthermore, at a different level of interaction between temperature and pressure (e.g. from 358 K to 430 373 K and 13-16 bar), a notable effect was also recorded where there was a gradual decline in the 431 CMEC yield indicating optimum condition had been exceeded. This shows that variation in reaction 432 temperature had a negative effect on both responses at higher values. Therefore, the temperature-

- 433 pressure relationship has significant effect on process responses. Similarly, the elliptical shape of the
- 434 2D contour plot in Figure. 10b exemplifies a mutual interactive effect of the reaction variables on 435 responses.
 - Design-Expert® Software Factor Coding: Actual Actual Factors C: Catalyst Loading = 12 D: Time = 12 80 60 40 CMEC Yield (%) 20 0 -20 373 16 363 13 353 10 343 A: Temperature (К) B: Pressure (Bar) 333 4 323

CMEC Yield (%) 16 65

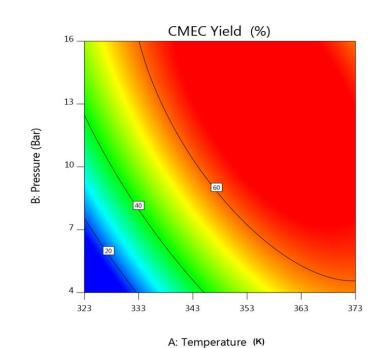
X1 = A: Temperature X2 = B: Pressure

Design-Expert® Softw Factor Coding: Actual

CMEC Yield (%)

X1 = A: Temperatur X2 = B: Pressure Actual Factors C: Catalyst Loading = 12 D: Time = 12

16 65



- 438 Figure 10. (a) 3D response surface and (b) contour plot of reaction temperature and pressure versus
- 439 CMEC yield

440 5.2. Interactive effect of temperature and time

441

442 Figure 11 illustrated the interaction effect of reaction time and temperature on CMEC yield 443 (while keeping other two variables at their optimum: catalyst loading: 12 % (w/w), CO₂ pressure: 11 444 bar). The surface plot suggested that the CMEC yield was highest (68%) at a reaction time of 12 h and 445 temperature of 353 K indicating that an increase in the reaction temperature from 313 K to 353 K 446 favours ECH conversion and consequently enhancing CMEC yield as shown in Figure 11a. However, 447 increase in reaction temperature beyond 353 K at 12 h of reaction time was unfavourable to the 448 reactive system causing a marginal drop in CMEC yield from 68% to 65%. Onyenkeadi et al. [9] 449 reported that formation of oligomers and isomers are possible at extended reaction time at higher 450 temperature. Product quality and stability may also be affected due to chemical degradation or losses 451 by thermal decomposition at higher reaction temperature [8]. Response surface and contour plots of 452 Figure 11 clearly shows that CMEC yield had a linear effect with increasing reaction temperature 453 until the optimum condition was achieved. This phenomenon agrees with the Arrhenius law [61]; 454 higher temperature results in a higher conversion rate and consequently leading to higher CMEC 455 yield. It can be concluded from the ANOVA Table 4 that the reaction temperature was found to be a 456 highly influencing parameter on both the conversion of ECH and CMEC yield as evident from low 457 p-value (< 0.0001).

458

459 5.3. Interactive effect of temperature and catalyst loading

460

461 The overall CMEC yield has been significantly influenced by the interaction between the catalyst 462 loading and reaction temperature while CO₂ pressure and time have been kept at optimum values of 463 11 bar and 12 h respectively. For example, Figure.11 shows that at lower catalyst loading of 5% (w/w), 464 only 34% of CMEC yield was recorded as a result of low ECH conversion at low catalyst loading. The 465 CMEC yield increased steadily up to 68% as reaction temperature increased at moderate levels of 466 catalyst loading from 333 K to 353 K. This phenomenon could be attributed to the increase in the 467 catalyst surface area, which provides more contact area between the limiting reactant ECH and the 468 active sites of the catalyst. Higher catalyst loading gives higher ECH conversion resulting in higher 469 CMEC yield, an effect which is more pronounced at higher temperatures. However, at higher 470 temperature above 353 K, a marginal decrease in CMEC yield was observed, which may be due to 471 catalyst deactivation at very high temperature [10]. The contour plot in Figure 12b with elliptical 472 shape demonstrated the significant and combine effect of the catalyst loading and reaction 473 temperature. The result has also supported lower p-value (0.0005) of the interaction $\chi_1 \chi_3$ term. As 474 shown in Figure 12a, at any designated value of reaction temperature from 333 K to 353 K, the CMEC 475 increased proportionally with catalyst loading. This observation was also supported by low p-value 476 (< 0.0001).

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Design-Expert® Software Factor Coding: Actual



X1 = A: Temperature X2 = D: Time

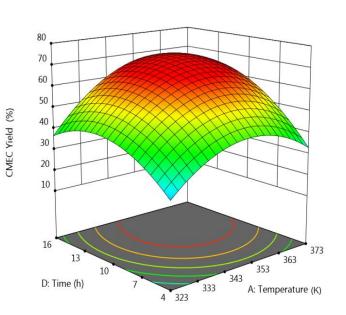
Design-Expert® Software Factor Coding: Actual

CMEC Yield (%)

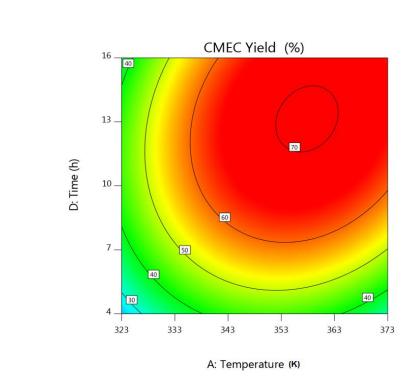
X1 = A: Temperature X2 = D: Time Actual Factors B: Pressure = 11 C: Catalyst Loading = 12

16 65

Actual Factors B: Pressure = 11 C: Catalyst Loading = 12



490



491

492

493 **Figure. 11.** (a) 3D response surface and (b) contour plot of reaction temperature and time *versus*

494 CMEC yield

Design-Expert® Software Factor Coding: Actual

CMEC Yield (%) 16 65

X1 = A: Temperature X2 = C: Catalyst Loading

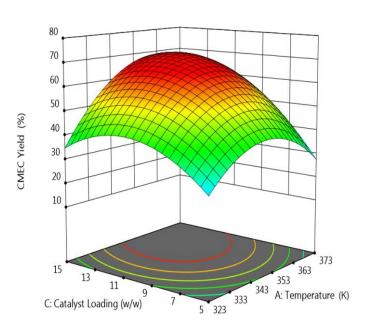
Actual Factors B: Pressure = 11 D: Time = 12

Design-Expert® Software Factor Coding: Actual

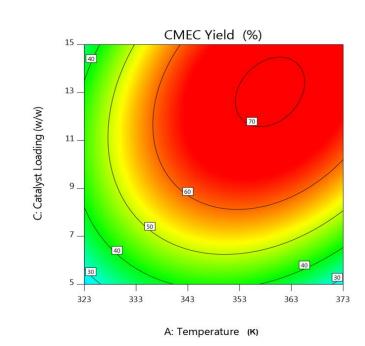
65

X1 = A: Temperature X2 = C: Catalyst Loading Actual Factors B: Pressure = 11 D: Time = 12

CMEC Yield (%)



495 496



498 **Figure. 12**. 3D response surface and contour plot of reaction temperature and catalyst loading *versus*

- 499 CMEC yield.
- 500
- 501
- 502

503 5.4. Interactive effect of time and pressure

504

505 Similar to the previous observation of the interaction effect of temperature and pressure, Figure. 506 13 demonstrates the interaction effect of CO₂ pressure and time on CMEC yield while maintaining 507 reaction temperature and catalyst loading at 353 K and 12 %(w/w) respectively. For example, at a 508 shorter reaction time of 4 h, there was a negligible effect of CO₂ pressure in the CMEC yield. Figure 509 13a shows that optimum reaction time of 12 h was observed at a CO₂ pressure of about 12 bar with a 510 68% of CMEC yield. It has been observed in Figure 13 that the CMEC yield reached a maximum at a 511 reaction time of 12 h, thereafter, it was stable. A further increase in reaction time beyond this value 512 caused a sharp drop in CMEC yield as indicated in surface plot of Figure 13b.

513

514 5.5. Interactive effect of time and catalyst loading

515

516 The contour and 3D surface plots in Figure 14 show the interaction effect between the reaction 517 time and the catalyst loading at a constant temperature of 353 K and CO₂ pressure of 12 bar. The 518 contour plots show less curvature up to 7 h of reaction time, which implied less influence of catalyst 519 loading on CMEC yield between the reaction time of 2 to 6 h. However, a maximum CMEC yield of 520 68% was achieved at higher catalyst loading and reaction time of 12 % (w/w) and 12 h respectively. 521 A declining effect was observed in Figure 14a as the catalyst loading goes above 12% (w/w). This 522 reflects that the optimum catalyst loading had been exceeded. A similar trend was reported by 523 Onyenkeadi et al. [9] on declining effect of catalyst loading beyond the optimum reaction time. 524 Increase in the amount of catalyst loading can increase the number of active sites on the catalyst 525 surface, and consequently, increases number of radicals (see S1). However, excessive increase of 526 catalyst concentration beyond the optimum reaction time can result in a catalyst deactivation [8]. This 527 phenomenon is totally in agreement with the recent reports of Feilizadeh et al. [62]

528

529 5.6. Interactive effect of catalyst loading and pressure

530

531 The exponential interaction effect between catalyst loading and pressure at a constant reaction 532 time of 12 h and a temperature of 353 K is presented in Figure 15. However, the interaction produced 533 a different effect on CMEC yield at different levels of interaction (i.e. different levels of interaction 534 produce different effect on the ECH conversion). For example, Figure 15 shows that at the start of the 535 reaction, 5 % (w/w) of catalyst loading at 7 bar of CO_2 pressure produced an increasing effect on the 536 CMEC yield. As the catalyst loading was further increased from 5% to 10% (w/w), the CMEC yield 537 was observed to increase steadily from 40% to 68% corresponding to an increase in CO₂ pressure 538 from 7 to 11 bar. The CMEC yield was highest (68%) at a maximum catalyst loading of 12 % (w/w), 539 when the CO₂ pressure was maintained at 11 bar as shown in Figure 15. However, a negative effect 540 of excessive increase in CO₂ pressure was observed on CMEC yield (a drop to 64%) at this level of 541 interaction between catalyst loading and pressure. This phenomenon can be attributed to catalyst 542 deactivation at increased CO₂ pressure beyond the optimum. A similar experience was reported 543 earlier by Zhang et al. [63]. The group have recorded a higher propylene carbonate (PC) yield with a 544 fixed amount of immobilized ionic liquid/ZnCl2 at a CO2 pressure of 1.5 Mpa, however, a lower PC 545 yield was observed at a higher CO₂ pressure of 2 MPa. Furthermore, they claimed that this 546 phenomenon occurs when acidic CO₂ dissolves in basic epoxide to form a liquefied CO₂-epoxide 547 complex, thereby inducing catalyst deactivation.

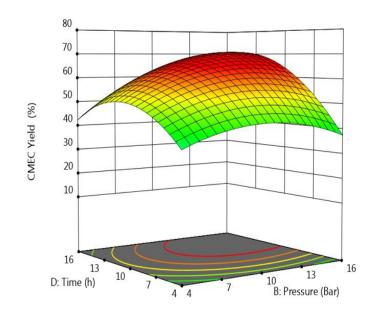
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CMEC Yield (%)

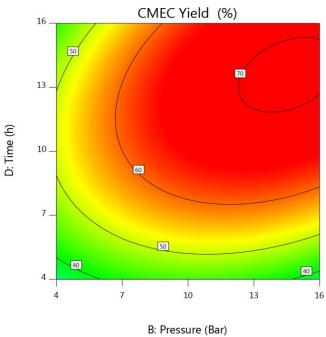
16 65

X1 = B: Pressure X2 = D: Time

Actual Factors A: Temperature = 353 C: Catalyst Loading = 12



5550 551 Design-Expert® Software Factor Coding: Actual CMEC Vield (%) 10 0 0 5 X1 = 8: Pressure X2 = D: Time Actual Factors A: Temperature = 353 C: Catalyst Loading = 12





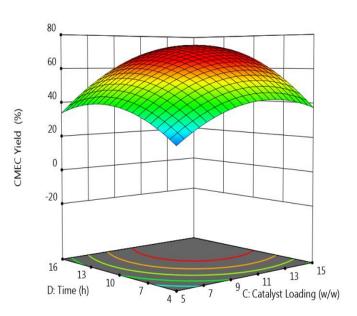
553 **Figure.13**. 3D response surface and contour plot of reaction time and pressure *versus* CMEC yield.

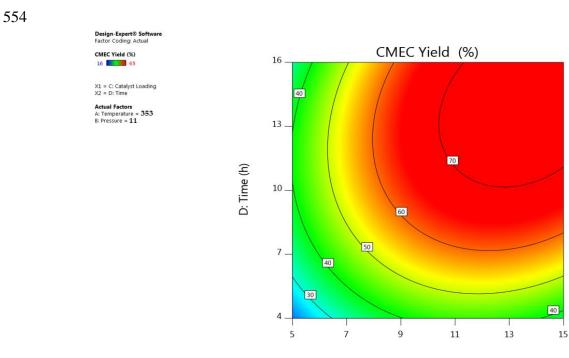
Design-Expert® Software Factor Coding: Actual

CMEC Yield (%) 16 65

X1 = C: Catalyst Loading X2 = D: Time

Actual Factors A: Temperature = 353 B: Pressure = 11





C: Catalyst Loading (w/w)

555

556 **Figure.14**. 3D response surface and contour plot of reaction time and catalyst loading *versus* CMEC

557 yield.

Design-Expert® Software Factor Coding: Actual

CMEC Yield (%)

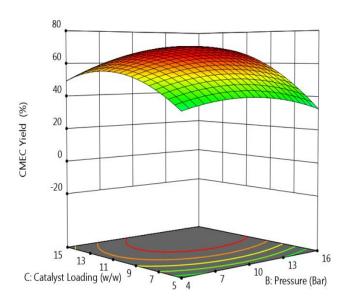
X1 = B: Pressure X2 = C: Catalyst Loading

Actual Factors A: Temperature = 353 D: Time = 12

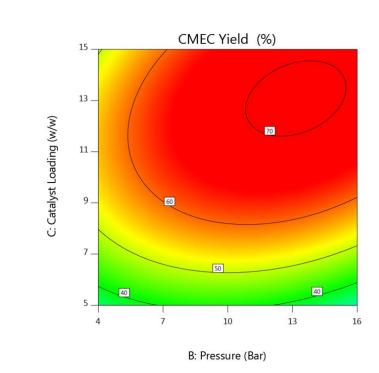
Design-Expert® Software Factor Coding: Actual

X1 = B: Pressure X2 = C: Catalyst Loading Actual Factors A: Temperature = 353 D: Time = 12

CMEC Yield (%) 16 65







560 Figure.15. 3D response surface and contour plot of reaction pressure and catalyst loading *versus*

- 561 CMEC yield
- 562
- 563
- 564

565 6. Multiobjective Process Optimisation

566

567 The growing quest for greener substitute for fossil fuel has led to increased production, process 568 optimisation and application of organic carbonate. As a result, the use of RSM has received more 569 attention over conventional optimisation methods in order to investigate process optimum 570 conditions and the interactive relationships between effective working variables. Although, finding 571 the optimal reaction parameters for a single response using RSM is relatively simple; however, the 572 optimisation of several responses at the same time is not an easy matter. Therefore, the optimisation 573 targets for this study have been set to maximise the process productivity. Targets for both ECH 574 conversion and CMEC yield have been set to reach the maximum values while both the reaction 575 temperature and time have been targeted to minimum values with a viewpoint of reducing 576 production cost at a maximum economic gain. Because of the catalyst efficiency and stability at 577 optimum conditions, as a results, no specific target has been set for catalyst loading .

578 Based on the models generated and the accuracy between the actual experimental and predicted 579 results, it can be construed that model shows high consistencies between the two results where the 580 relative errors of the predicted results from the experimental data are 1.55% and 1.54% for ECH 581 conversion and CMEC yield, respectively. The similarity between the predicted and experimental 582 results at the optimum conditions has validated the predicted optimum conditions. The experimental 583 results concluded that increase in reaction parameters increases ECH conversion and CMEC yield 584 being 93% and 68% respectively.

585

586 Table 5. Optimisation constraints used to predict optimum conditions for chloromethyl ethylene587 carbonate synthesis

Factor	Code	Goal	Limits	
			Lower	Upper
Temperature (K	$\chi_{\scriptscriptstyle 1}$	Minimise	313	373
Pressure (bar)	χ_2	In range	2	16
Catalyst loading (%)	$\chi_{\scriptscriptstyle 3}$	In range	5	15
Time (h)	χ_4	Minimise	2	16
ECH conversion	Y_1	Maximise	60	93
CMEC yield	Y_2	Maximise	30	68

⁵⁸⁸

590 7. Catalyst Reusability Studies

591 In view of large scale industrial applications and to minimise production cost, the reusability 592 studies of Zr/ZIF-8 catalyst has been investigated. The catalyst reusability process has also followed 593 strict eco-regulation after all the predicted optimum parameters have been derived from BBD of RSM. 594 The experiments were carried out in a high-pressure reactor at optimum reaction conditions, at 353 595 K, 11 bar with fresh 12% (w/w) ZIF-8 catalyst loading, for 12 h and at a stirring speed of 350 rpm. The 596 catalyst after Run 1 in the cycloaddition reaction was washed with ethanol and acetone, centrifuged, 597 and oven dried at 343 K for 12 h before reuse. The recovered catalysts were reused for up to 7 598 subsequent experiments as shown in Figure 16 following the same experimental procedure. The 599 catalyst exhibited no loss of activity indicating the catalyst stability for cycloaddition reaction of CO2 600 epichlorohydrin. Incorporating zirconium into ZIF-8 has significantly increased the catalytic 601 performance of Zr/ZIF-8 with the conversion of ECH and the yield of CMEC being 93%, and 68% 602 respectively. The activity of reused Zr/ZIF-8 catalyst showed consistent stability over seven 603 subsequent runs as indicated in Figure 16. Although, a very slight decrease in the yield of CMEC

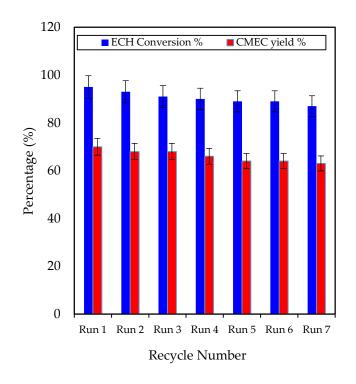
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from 68% (fresh) to 67% (recycled) was observed in the seventh run. Carbonaceous material formed
during the reaction may explain in part the lower activity of the recycled catalysts [64].

606

Although, the difference in the error bars status between the ECH conversion and CMEC yield may be statistically significant, this may be attributed to the formation of some side products associated with the coupling reaction of CO₂ and ECH. The following side products have been identified by the GC analysis; 3-chloropropane 1,2-diol and 2,5-bis (chloromethyl)-1,4-dioxane.

611



- 612
- 613

614 **Figure 16.** Catalyst reusability studies of Zr/ZIF-8 on conversion of ECH, and CMEC yield using 615 predicted response surface methodology's optimum condition of catalyst loading 12% (w/w);

616 reaction temperature 353 K; CO₂ pressure 11 bar, reaction time 12 h, stirring speed 350 rpm.

617 8. Conclusions

618 In this study, Zr/ZIF-8 catalyst has been successfully used for process optimisation in the 619 synthesis of CMEC using RSM. In total, 29 run of experiments were conducted for optimum design 620 and modelling. The developed model was validated to assess the agreement between its predictions 621 and a set of experimental data. The development of a novel Zr/ZIF-8 catalyst via a simple low cost 622 solvothermal method has demonstrated that the catalyst is viable for large-scale industrial 623 applications. The catalyst has shown a good substrate tolerance as demonstrated by its activity 624 towards epichlorohydrin. More importantly, the reaction has been carried out under solvent free and 625 co-catalyst free conditions. The heterogeneity of the catalyst has been proven by recovering and 626 reusing the catalyst for up to seven times without any significant loss in catalytic activity. 627 Furthermore, PXRD, FT-IR, and TGA analysis (see supplementary information sheets) of the recycled 628 catalyst shows that the catalyst framework is quite stable after recycled experiments. The high 629 selectivity towards epichlorohydrin carbonate, simple separation of catalyst by centrifugation and 630 excellent recyclability demonstrated that the catalyst is viable for industrial applications. We believe

631 632		his work could provide a new direction for designing more sustainable heterogeneous catalysts reener synthesis of organic carbonates <i>via</i> CO ₂ utilisation.							
633 634	A .1								
635		Acknowledgements Bisi Olaniyan is immensely grateful to the School of Engineering, LSBU, UK for partial financial							
636		ance throughout this research work.							
637	a55151								
638	Rofo	rences							
639	Kerei								
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