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# Kinetic Modeling Of Methanol Synthesis From Carbon Monoxide, Carbon Dioxide, And Hydrogen Over A Cu/ZnO/Cr<sub>2</sub>O<sub>3</sub> Catalyst

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KINETIC MODELING OF METHANOL SYNTHESIS FROM CARBON  
MONOXIDE, CARBON DIOXIDE, AND HYDROGEN OVER A Cu/ZnO/Cr<sub>2</sub>O<sub>3</sub>  
CATALYST

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In Partial Fulfillment

Of the Requirements for the Degree

Master of Chemical and Materials Engineering

by

Daaniya Rahman

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MONOXIDE, CARBON DIOXIDE, AND HYDROGEN OVER A Cu/ZnO/Cr<sub>2</sub>O<sub>3</sub>  
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## ABSTRACT

### KINETIC MODELING OF METHANOL SYNTHESIS FROM CARBON MONOXIDE, CARBON DIOXIDE AND HYDROGEN OVER A Cu/ZnO/Cr<sub>2</sub>O<sub>3</sub> CATALYST

by Daaniya Rahman

The main purpose of this study was to investigate kinetic models proposed in the literature for methanol synthesis and select the best fit model using regression techniques in POLYMATH. Another aim was to use the results from the best fit model to explain some aspects and resolve some questions related to methanol synthesis kinetics. Two statistically sound kinetic models were chosen from literature based on their goodness of fit to the respective kinetic data. POLYMATH, the non-linear regression software, was used to fit published experimental data to different kinetic models and evaluate kinetic parameters. The statistical results from POLYMATH were used for comparison of the models and selection of the best fit model. The results obtained from the best fit kinetic model were then used to analyze the trends and kinetic features related to methanol synthesis. The study was primarily concentrated on the effect of reaction conditions on the relative contribution of CO and CO<sub>2</sub> in producing methanol.

The combined model that included both CO and CO<sub>2</sub> hydrogenation rate terms was the best fit kinetic rate expression that described methanol synthesis kinetics most appropriately. A number of reaction conditions such as conversion, pressure, CO/CO<sub>2</sub>, and hydrogen content in the feed can have marked effects on the relative contribution of CO and CO<sub>2</sub> in synthesizing methanol. Therefore, no generalizations can be made regarding the main carbon source in methanol.

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## List of Symbols

$r$	reaction rate
$p$	partial pressure
$k$	reaction rate constant
$f$	fugacity
$\alpha$	exponent in rate equation
$\theta$	coverage of species
$\Delta H$	enthalpy change of reaction
$\Delta G$	Gibb's free energy change
$K_{eq}$	equilibrium constant for methanol synthesis reaction
$K_i$	constants relative to adsorption equilibrium terms in the model
$R^2$	correlation coefficient

## CHAPTER 1

### INTRODUCTION

Kinetic modeling is an important tool in the design and optimization of chemical synthesis processes. Kinetic studies aid in reactor design and are important means to gain a better insight of the overall process so that it can be modified for optimum operating conditions and better yields. A detailed knowledge of the reaction scheme can often lead to betterment of the production process resulting in appreciable profits [1]. One such industrially important process is the synthesis of methanol.

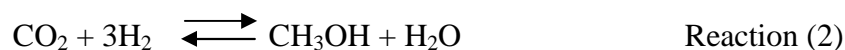
Methanol is a widely used industrial feedstock and a promising alternative energy resource. It is mainly produced from a mixture of carbon monoxide, carbon dioxide, and hydrogen under high pressure and temperature using Cu/ZnO- based catalysts. Synthesis of methanol takes place via three main reactions [2]:

- hydrogenation of carbon monoxide



$$(\Delta H = -91 \text{ kJ/mol}; \Delta G = -25.34 \text{ kJ/mol})$$

- hydrogenation of carbon dioxide



$$(\Delta H = -49.5 \text{ kJ/mol}; \Delta G = 3.30 \text{ kJ/mol})$$

- water-gas shift reaction



$$(\Delta H = -41.2 \text{ kJ/mol}; \Delta G = -28.60 \text{ kJ/mol})$$

Cu/ZnO-based catalysts have been reported to be the most beneficial for this process due to their high activity, selectivity, and stability which is further enhanced by using supports and promoters [2, 3]. Major kinetic studies for methanol synthesis were done as early as 1977, and, even recently, authors are trying to model the process kinetics [2]. Although reaction mechanisms for this process have been studied for decades now, there has been no agreement on one exact scheme. There are concerns regarding the role of carbon dioxide in the methanol synthesis process, the identity of the active sites on the catalyst, and the role of ZnO [3, 4 and 5].

There have been several efforts to improve the methanol synthesis process since its inception by BASF (Baden Aniline and Soda Factory) in the 1920's by developing new, more efficient, and stable catalysts, new reactor configurations, and optimizing the reaction conditions like temperature, pressure, and space velocity. Catalyst innovation involves using effective supports like ZnO and ZrO<sub>2</sub>, promoters like alumina, zirconia, and other elements like boron, cobalt, gallium, and magnesium to enhance the catalyst performance at varied reaction temperatures [3, 6]. Since methanol synthesis is an exothermic reaction, high temperatures enhance methanol yield but only up to an optimum temperature due to thermodynamic limitations. These limitations result in decreasing the equilibrium yield with very high temperatures. Therefore, new methods of synthesis at low temperatures have been developed [7]. The pressure range has also been lowered over the years considering the economics of the process [6]. However, the reaction mechanism remains a topic of debate and is still being investigated.

## 1.1 Significance

Methanol synthesis is of large industrial significance. Its global production was around 45 million metric tons in 2010 and is expected to increase to 85 million metric tons per year by 2012 [8]. Chemical Market Associates Inc., in their 2010 World Methanol Cost Study Report stated “The global methanol industry is in the midst of the greatest capacity buildup in its history” [9]. The 2011 report stated “Global methanol demand growth was robust in 2010 and is expected to continue at about the same pace” [37]. This high methanol production caters to a wide variety of applications. Methanol is used as a feedstock for many important chemicals like formaldehyde, acetic acid, methyl tert-butyl ether, and chloromethane which in turn are used in various applications like paints, plastics, and plywood to explosives [6]. Methanol, either in pure form or blended with gasoline is also used as a transportation fuel. It holds excellent promise as an alternative source of energy since it offers several advantages clean burning properties, low emissions, high octane rating, high volatility, high energy density, easy transport, and ability to be incorporated in the existing engines without major modifications in the infrastructure [2, 10, and 11]. Methanol is also being used as an energy carrier in fuel cell research applications [11]. The world methanol industry has a significant impact on the global economy, generating over \$12 billion in annual economic activity while creating over 100,000 direct and indirect jobs [8].

Another aspect of importance is the production of methanol from hydrogenation of carbon dioxide which may help utilize the excess CO<sub>2</sub> from the atmosphere, thereby

reducing one of the major greenhouse gases and mitigating the main cause of global warming [2, 6].

Since methanol offers so many benefits as an alternative energy source and is of use in a multitude of applications, optimizing and enhancing its production by modeling its reaction kinetics could be of considerable importance. Due to the disagreement on the methanol synthesis reaction scheme, there is always a scope to develop new and effective kinetic models which can prove to be useful in the improvement of the process resulting in high methanol yields and greater profits.

## 1.2 Focus of Study

The focus of my study is to investigate and compare the validity of kinetic models proposed in literature for methanol synthesis from CO/CO<sub>2</sub>/H<sub>2</sub> over a Cu-based ZnO/Cr<sub>2</sub>O<sub>3</sub> catalyst by fitting them to published experimental data over a range of inlet CO<sub>2</sub> partial pressures and analyze the kinetic aspects of methanol production using the results predicted by the best fit kinetic model.



## CHAPTER 2

### LITERATURE REVIEW

#### 2.1 Overview

Methanol production was first carried out in the 1920's by BASF. It holds immense industrial significance due to the wide variety of applications it caters to. It has been reported that global methanol consumption reached 40.4 million metric tons in 2007 and is expected to increase to 58.6 million metric tons by 2012 [12]. Due to its industrial importance and high consumption, numerous investigations have been carried out in order to improve the methanol production process. Among various means, kinetic modeling is one of the most important tools in optimizing and enhancing the overall process. A large number of experimental results have been reported in literature regarding the reaction kinetics of methanol synthesis but some questions and doubts still remain unanswered. The main controversies revolve around the reaction mechanism (role of CO and CO<sub>2</sub>) and identity of active sites. The literature review analyzes the following aspects of methanol synthesis kinetics:

- Reaction Mechanism
- Kinetic Models
- Reaction Conditions
- Catalyst

#### 2.2 Reaction Mechanism

Methanol synthesis occurs via three reactions namely: hydrogenation of carbon monoxide, hydrogenation of carbon dioxide, and water gas shift reactions as shown in

Chapter 1. There have been a number of studies on methanol synthesis kinetics involving Cu-based catalysts for decades now but controversies still remain regarding the reaction mechanism. One of the major concerns has been the role of CO<sub>2</sub> in methanol production.

Initial kinetic studies on methanol synthesis by Natta *et al.* and Leonov *et al.* considered only CO and H<sub>2</sub> as the main reactants and neglected any contribution from CO<sub>2</sub> [13]. Later, Klier *et al.* in 1982 showed that methanol was mainly formed from CO and H<sub>2</sub> that adsorbed on the catalyst and CO<sub>2</sub> acted only as a promoter and not as a main reactant. They also suggested that methanol production rate was maximum at a CO<sub>2</sub>/CO ratio of 2:28 which was governed by a balance between the promoting effect of CO<sub>2</sub> and retarding effect due to strong adsorption of CO<sub>2</sub> [14]. In another study, Liu *et al.* conducted initial rate experiments in a batch reactor to determine the effect of feed composition on methanol production rate and obtained conflicting results. They showed that methanol formation rate increased with increasing CO<sub>2</sub> pressure. A year later, they presented a more detailed study and proposed that hydrogenation of CO<sub>2</sub> was the primary reaction in producing methanol at low temperature, low conversion, and in the absence of water but at high temperature, high conversion, and in the presence of water, methanol was primarily produced via CO hydrogenation [15].

Chinchen *et al.* reported in their study that CO<sub>2</sub> was the primary reactant in methanol production using <sup>14</sup>C-labeled reactants [16]. Takagawa and Ohsugi, in 1987, determined the empirical rate equations for all the three methanol synthesis reactions and showed that methanol production rate increased with increase in CO<sub>2</sub>/CO ratio in the beginning of the reaction but decreased as the ratio increased and water started to form.

They claimed their results to be in accordance with both Klier *et al.* and Liu *et al.* [17]. McNeil *et al.* in their experimental study found that 2 mole % CO<sub>2</sub> in the feed yielded optimum methanol production rate. They also found the contribution of CO<sub>2</sub> to methanol formation to be more at lower temperatures. Unlike other studies, they developed a rate expression based on mechanistic information which included the effects of CO<sub>2</sub>, both as a methanol producer as well as a rate inhibitor [18].

Another group of researchers led by Rozovskii *et al.* showed that there was no direct path for hydrogenation of CO to methanol. They reported in their earlier study, using C-14 labeling techniques and in a more recent study using Temperature Programmed Desorption technique that methanol formation takes place through CO<sub>2</sub> hydrogenation [19]. In a methanol synthesis study conducted by Fujita *et al.* at atmospheric pressure in a flow reactor, it was found that CO<sub>2</sub> produced methanol via hydrogenation of formate species formed on Cu and CO produced methanol via hydrogenation of formate species formed on ZnO. CO<sub>2</sub> hydrogenation rates were found to be more rapid than CO hydrogenation rates. They reported that the presence or absence of water and the difference in the reactivity of the former and latter formate species mainly caused a difference in the methanol production rates from CO and CO<sub>2</sub> [20].

In 1998, Sun and co workers studied methanol synthesis and water gas shift reaction using IR technique and found that CO<sub>2</sub> hydrogenation was the principle pathway in methanol production for both CO<sub>2</sub> and CO<sub>2</sub>/CO hydrogenation reactions. The rate determining step was found to be the hydrogenation of formate species. They suggested

that CO addition lowers the activation energy of the production process, in addition to affecting the reaction path [4]. In another study, Sahibzada *et al.* showed that the intrinsic rate of CO<sub>2</sub> hydrogenation was twenty times faster than CO hydrogenation and at CO<sub>2</sub> > 1%, it was the main source of methanol production. They reported that methanol formation rate increased linearly with increase in CO<sub>2</sub> concentration in the absence of products [21]. Further establishing the role of CO<sub>2</sub> in methanol production, Ostrovskii, studied methanol synthesis mechanism on Cu/Zn containing catalyst under a wide range of experimental conditions and showed that CO<sub>2</sub> was the principal source of methanol production [22].

Recently, Lim *et al.* conducted a comprehensive study assuming CO and CO<sub>2</sub> to adsorb on different Cu sites and water to adsorb on a ZnO site. They found that CO<sub>2</sub> hydrogenation rate was slower than CO hydrogenation rate which decreased methanol formation rate but since CO<sub>2</sub> decreases WGS reaction rate, it, therefore decreases the production of DME, a byproduct from methanol. It was therefore, concluded that methanol production rate can be indirectly enhanced by finding an optimum CO<sub>2</sub> concentration. They claim to be the first study among the various ones reporting the role of CO<sub>2</sub> in methanol synthesis, suggesting a kinetic mechanism relating CO and CO<sub>2</sub> hydrogenation reactions [2]. In a more recent study by the same authors, they have used the developed kinetic model to evaluate the effect of carbon dioxide fraction on the methanol yield, and have also devised an optimization strategy to maximize methanol production rate taking CO<sub>2</sub> fraction and temperature profile into account [30].

## 2.3 Kinetic Models

A number of kinetic models have been proposed in the literature and kinetic parameters have been evaluated, each based on a different set of assumptions regarding the reaction pathway and reaction conditions. Leonov *et al.* were the first to present a kinetic model for methanol synthesis over a Cu/ZnO/Al<sub>2</sub>O<sub>3</sub> catalyst. However, they did not consider the effect of CO<sub>2</sub> in the feed [13]. Later Klier *et al.* and Villa *et al.* proposed models which included the  $p_{\text{CO}_2}$  terms but did not treat CO<sub>2</sub> as the main reactant [13, 14]. The model proposed by Villa *et al.* was developed based on the scheme that methanol was produced from only CO and a CO<sub>2</sub> adsorption term was included since CO<sub>2</sub> adsorbs strongly at high concentrations. Takagawa and Ohsugi derived empirical rate expressions for the three methanol synthesis reactions under a wide range of experimental conditions [17]. Graaf *et al.* derived a kinetic model taking into account both CO and CO<sub>2</sub> hydrogenation and the water gas shift reaction. They derived 48 reaction schemes by assuming different elementary steps to be rate limiting and then selected the best possible kinetic model using statistical discrimination [31]. The kinetic model derived by Graaf *et al.* is shown in Table 1. McNeil *et al.* developed a carbon dioxide hydrogenation rate expression based on mechanistic information reported in literature in contrast to the earlier models based on empirical expressions [18]. Skrzypek *et al.* derived their kinetic model based on Reactions (2) and (3) since they have shown through their experiments that methanol synthesis prefers CO<sub>2</sub> in spite of CO as a carbon source [32].

A kinetic model for methanol synthesis was presented by Askgaard *et al.* and the kinetic parameters were evaluated using gas phase thermodynamics and surface science

studies. They found that the calculated rates when extrapolated to actual working conditions compared well with the measured rates [23]. Froment and Buschhe conducted experiments and developed a steady state kinetic model based on a detailed reaction scheme assuming CO<sub>2</sub> to be the main source of carbon in methanol. Their model described the effects of temperature, pressure, and gas phase composition on methanol production rates even beyond their own experimental conditions [13]. In another kinetic study by Kubota *et al.*, kinetic equations for methanol synthesis were developed assuming CO<sub>2</sub> hydrogenation to be the predominant reaction. The authors found their equations to be reasonably accurate since the yield values obtained from their equations and those from experiments conducted in a test plant compared well [24].

Šetinc and Levec proposed a kinetic model for liquid phase methanol synthesis in 2001 and showed that methanol production is proportional to the CO<sub>2</sub> concentration and not to the CO concentration [33].

Rozovskii and Lin proposed two reaction schemes to build the theoretical kinetic models which could fit the experimental data well. They used two different gas phase compositions, one enriched with CO<sub>2</sub> and the other with CO to test the applicability of their models. They found that both the schemes proved to be effective when dealing with a CO<sub>2</sub> enriched mixture, but, the kinetic model based on scheme 1 did not match with the experimental data well when using a CO enriched mixture [19]. Lim *et al.* developed a comprehensive kinetic model consisting of 48 reaction rates based on different possible rate determining steps. They showed through parameter estimation that, among the 48 rates, surface reaction of a methoxy species was the rate determining step for CO

hydrogenation, hydrogenation of a formate intermediate was the rate determining step for CO<sub>2</sub> hydrogenation and formation of a formate intermediate was the rate determining step for the water-gas shift reaction. However they used a Cu/ZnO/Al<sub>2</sub>O<sub>3</sub>/Zr<sub>2</sub>O<sub>3</sub> catalyst [2]. Grabow and Mavrikakis have developed a comprehensive microkinetic model using density functional theory calculations to deal with the uncertainties regarding the reaction mechanism and nature of active sites [34].

Table 1 summarizes the various kinetic models, proposed in literature along with the experimental reaction conditions.

Table 1. Summary of Kinetic Models proposed in literature for methanol synthesis.

Operating Conditions	Kinetic Model	Author, Year	Ref.
493-533 K; 40-55 atm	$r_{\text{CH}_3\text{OH}} = k \left( \frac{p_{\text{CO}}^{0.5} p_{\text{H}_2}}{p_{\text{CH}_3\text{OH}}^{0.66}} - \frac{p_{\text{CH}_3\text{OH}}^{0.34}}{p_{\text{CO}}^{0.5} p_{\text{H}_2} K_2^*} \right)$	Leonov <i>et al.</i> , 1973	13
498-523 K; 75 atm	$r_{\text{CH}_3\text{OH}} = \text{const} \frac{K_{\text{redox}}^3 (p_{\text{CO}_2}/p_{\text{CO}})^3 (p_{\text{CO}} p_{\text{H}_2}^2 - p_{\text{CH}_3\text{OH}}/K_2^*)}{[1 + K_{\text{redox}}(p_{\text{CO}_2}/p_{\text{CO}})]^3 (F + K_{\text{CO}_2} p_{\text{CO}_2})^n} + k' (p_{\text{CO}_2} - (1/K_1^*) (p_{\text{CH}_3\text{OH}} p_{\text{H}_2\text{O}}/p_{\text{H}_2}^3))$	Klier <i>et al.</i> , 1982	14
N/A	$r_{\text{CH}_3\text{OH}} = \frac{f_{\text{CO}} f_{\text{H}_2}^2 - f_{\text{CH}_3\text{OH}}/K_2^*}{(A + B f_{\text{CO}} + C f_{\text{H}_2} + G f_{\text{CO}_2})^3}$ $r_{\text{RWGS}} = \frac{f_{\text{CO}_2} f_{\text{H}_2} - f_{\text{CO}} f_{\text{H}_2\text{O}} K_3^*}{M^2},$	Villa <i>et al.</i> , 1985	13

Operating Conditions	Kinetic Model	Author, Year	Ref.
483-518 K; 15-50 bar	$r_{CH_3OH} = \frac{k_1 K_{CO} (c_{CO} c_{H_2}^{3/2} - c_{CH_3OH} / c_{H_2}^{1/2} K_1^{eq})}{(1 + K_{CO} c_{CO} + K_{CO_2} c_{CO_2}) (c_{H_2}^{1/2} + (K_{H_2O} / K_{H_2}^{1/2}) c_{H_2O})}$ $r_{H_2O} = \frac{k_2 K_{CO_2} (c_{CO_2} c_{H_2} - c_{H_2O} c_{CO} / K_2^{eq})}{(1 + K_{CO} c_{CO} + K_{CO_2} c_{CO_2}) (c_{H_2}^{1/2} + (K_{H_2O} / K_{H_2}^{1/2}) c_{H_2O})}$ $r_{CH_3OH}^* = \frac{k_3 K_{CO_2} (c_{CO_2} c_{H_2}^{3/2} - c_{CH_3OH} c_{H_2O} / c_{H_2}^{3/2} K_3^{eq})}{(1 + K_{CO} c_{CO} + K_{CO_2} c_{CO_2}) (c_{H_2}^{1/2} + (K_{H_2O} / K_{H_2}^{1/2}) c_{H_2O})}$	Graaf <i>et al.</i> , 1988	31
483-513 K; 2.89-4.38 MPa	$r = \frac{k'_f K_{CH} K_{H_2}^2 K_H^2 K_{CO} (p_{CO} p_{H_2}^2 - p_{CH_3OH} / K_{eq})}{K_{CH} K_{H_2}^{3/2} K_H^{3/2} K_{CO} p_{CO} p_{H_2}^{3/2} + K_{CO_2} p_{CO_2} + K_{H_2} p_{H_2}}$ $+ \frac{k''_f K_{H_2} K_H K_{CO_2} K_{CHO_2} [p_{CO_2} p_{H_2} - p_{CH_3OH} p_{H_2O} / (K_{eq} p_{H_2}^2)]}{K_{H_2}^{1/2} K_H^{1/2} K_{CO_2} K_{CHO_2} p_{CO_2} p_{H_2}^{1/2} + K_{CO_2} p_{CO_2}^2 + K_{H_2O} p_{H_2O}^3}$	McNeil <i>et al.</i> , 1989	18
483-563 K; 1-4 bar	$r_+ = k_{-11} K_5^{-3/2} K_8^{-1} K_9 K_{10} K_{11} \left( \frac{p_{H_2}}{p_o} \right)^{3/2} \left( \frac{p_{CO_2}}{p_o} \right) \theta_*^2$ $r_- = k_{-11} K_5^{-3/2} K_8^{-1} K_9 K_{10} K_{11} \frac{1}{K_G} \frac{p_{CH_3OH} p_{H_2O}}{p_{H_2}^{3/2} p_o^{1/2}} \theta_*^2.$	Askgaard <i>et al.</i> , 1995	23
453-553 K; 15-51 bar	$r_{MeOH} = \frac{k'_{5a} K'_2 K_3 K_4 K_{H_2} p_{CO_2} p_{H_2} [1 - (1/K^*) (p_{H_2O} p_{CH_3OH} / p_{H_2}^3 p_{CO_2})]}{(1 + (K_{H_2O} / K_8 K_9 K_{H_2}) (p_{H_2O} / p_{H_2}) + \sqrt{K_{H_2} p_{H_2} + K_{H_2O} p_{H_2O}})}$ $r_{RWGS} = \frac{k'_1 p_{CO_2} [1 - K_3^* (p_{H_2O} p_{CO} / p_{CO_2} p_{H_2})]}{(1 + (K_{H_2O} / K_8 K_9 K_{H_2}) (p_{H_2O} / p_{H_2}) + \sqrt{K_{H_2} p_{H_2} + K_{H_2O} p_{H_2O}})}$	Froment and Bussche 1996	13



Operating Conditions	Kinetic Model	Author, Year	Ref.
473-548K; 4.9 MPa	$R_M = \frac{k_M \{P(\text{CO}_2)P(\text{H}_2) - P(\text{CH}_3\text{OH})P(\text{H}_2\text{O})/[K_M P^2(\text{H}_2)]\}}{[1 + K_{\text{CO}_2} \times P(\text{CO}_2) + K_{\text{H}_2\text{O}} \times P(\text{H}_2\text{O})]^2}$ $R_R = \frac{k_R \{P(\text{CO}_2) - P(\text{CO})P(\text{H}_2\text{O})/[K_R \cdot P(\text{H}_2)]\}}{1 + K_{\text{CO}_2}P(\text{CO}_2) + K_{\text{H}_2\text{O}}P(\text{H}_2\text{O})}$	Kubota <i>et al.</i> , 2001	24
473-513 K; 34-41 bar	$r_{Me} = A_{Me} e^{\left(\frac{-E_{Me}}{RT}\right)} \frac{c_{\text{CO}_2} (c_{\text{H}_2} - c_{\text{H}_2,eq})}{\left(1 + A_W e^{\left(\frac{E_W}{RT}\right)} c_{\text{H}_2\text{O}}\right)^2}$ $r_{\text{H}_2\text{O}} = A_{\text{H}_2\text{O}} e^{\left(\frac{-E_{\text{H}_2\text{O}}}{RT}\right)} \frac{c_{\text{CO}_2} - c_{\text{CO}_2,eq}}{\left(1 + A_W e^{\left(\frac{E_W}{RT}\right)} c_{\text{H}_2\text{O}}\right)}$	Šetinc and Levec, 2001	33
513 K; 5.2 MPa	$r = \frac{k_3 p_{\text{H}_2} \left(1 - \frac{p_{\text{m}} p_{\text{H}_2\text{O}}}{K_{p(m)} p_{\text{H}_2}^3 p_{\text{CO}_2}}\right)}{1 + K_{-2} p_{\text{H}_2\text{O}} + K_{-2} p_{\text{H}_2\text{O}} / (K_1 p_{\text{CO}_2})}$	Rozovskii and Lin, 2003	19
523-553 K; 5 MPa	$r_A = \frac{k_A K_{\text{CO}} K_{\text{H}_2}^2 K_{\text{CH}_3\text{CO}} (P_{\text{CO}} P_{\text{H}_2}^2 - P_{\text{CH}_3\text{OH}}/K_{\text{PA}})}{(1 + K_{\text{CO}} P_{\text{CO}})(1 + K_{\text{H}_2}^{0.5} P_{\text{H}_2}^{0.5} + K_{\text{H}_2\text{O}} P_{\text{H}_2\text{O}})}$ $r_B = \frac{k_B K_{\text{CO}_2} K_{\text{H}_2}^{0.5} (P_{\text{CO}_2} P_{\text{H}_2} - P_{\text{CO}} P_{\text{H}_2\text{O}}/K_{\text{PB}})/P_{\text{H}_2}}{(1 + K_{\text{CO}} P_{\text{CO}})(1 + K_{\text{H}_2}^{0.5} P_{\text{H}_2}^{0.5} + K_{\text{H}_2\text{O}} P_{\text{H}_2\text{O}})(1 + K_{\text{CO}_2} P_{\text{CO}_2})}$ $r_C = \frac{k_C K_{\text{CO}_2} K_{\text{H}_2} K_{\text{CH}_3\text{CO}_2} (P_{\text{CO}_2} P_{\text{H}_2}^3 - P_{\text{CH}_3\text{OH}} P_{\text{H}_2\text{O}}/K_{\text{PC}})/P_{\text{H}_2}}{(1 + K_{\text{H}_2}^{0.5} P_{\text{H}_2}^{0.5} + K_{\text{H}_2\text{O}} P_{\text{H}_2\text{O}})(1 + K_{\text{CO}_2} P_{\text{CO}_2})}$	Lim <i>et al.</i> , 2009	2

## 2.4 Reaction Conditions

The main reaction conditions to be considered in methanol synthesis are temperature, pressure, and space velocity.

### 2.4.1 Temperature

Methanol synthesis is usually carried out at 493-573 K [1, 23]. Since, hydrogenation reactions of CO and CO<sub>2</sub> are exothermic; their rates increase with temperature but only up to a certain temperature. At higher temperatures, the rates begin to decrease as the thermodynamic equilibrium constant decreases as temperature increases. Therefore, very high temperatures are not suitable. It was reported by Bill *et al.* that methanol yield increased with temperature but only up to 493 K [6]. Similarly it was found by Xin *et al.* that maximum CO<sub>2</sub> conversion and yield were possible at around 523 K. They also reported that methanol synthesis was more sensitive to reaction temperature than the water gas shift reaction. Figure 1 shows the dependence of CO<sub>2</sub> conversion and methanol yield on reaction temperature [25].

Extreme temperatures limit the efficiency of methanol production due to thermodynamic limitations. Therefore, a low temperature route of methanol synthesis has been proposed by Tsubaki and co workers. They conducted the experiments at 443 K on a copper based catalyst using ethanol as a catalytic solvent. They showed that the reaction mechanism at low temperature followed: formate to methyl formate to methanol pathway instead of formate to methoxy to methanol route. They proposed that low temperature methanol production enabled high conversions up to 50-80% and reduction of production cost without any thermodynamic equilibrium [7].

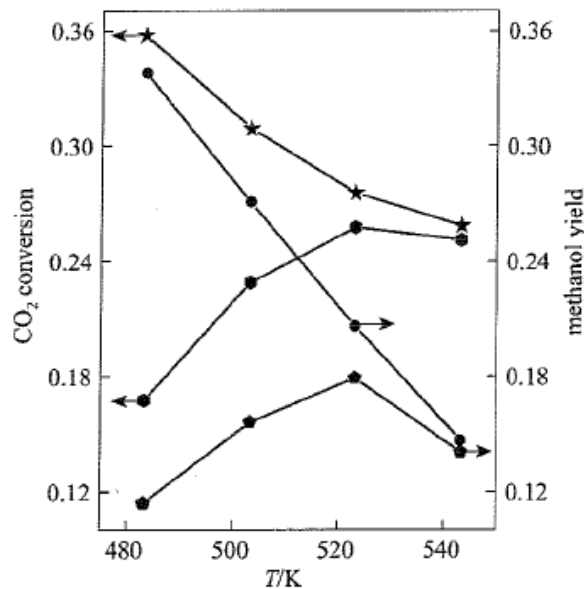


Figure 1. Relationship between reaction temperature and CO<sub>2</sub> conversion and methanol yield from experimental results and thermodynamic predictions (Reprinted with permission from [25]).

#### 2.4.2 Pressure

Methanol production was initially carried out at very high pressures when it was first started in 1920's by BASF. Later, ICI lowered pressures to 50-100 atm using a Cu/ZnO/Al<sub>2</sub>O<sub>3</sub> catalyst [6]. In 1988, Graaf *et al.* studied the kinetics of methanol synthesis from CO, CO<sub>2</sub> and H<sub>2</sub> over the same catalyst and developed a kinetic model operative at pressures of 15-50 atm. They claimed their low pressure methanol synthesis kinetic model to be more precise in illustrating the experimental values compared to the previously proposed models [26]. It was reported by Deng *et al.* that methanol production could be carried at 20 atm using Cu/ZnO/Al<sub>2</sub>O<sub>3</sub> catalyst [6].

Xin *et al.* reported that high pressure was advantageous for CO<sub>2</sub> hydrogenation as shown in Figure 2 [25].

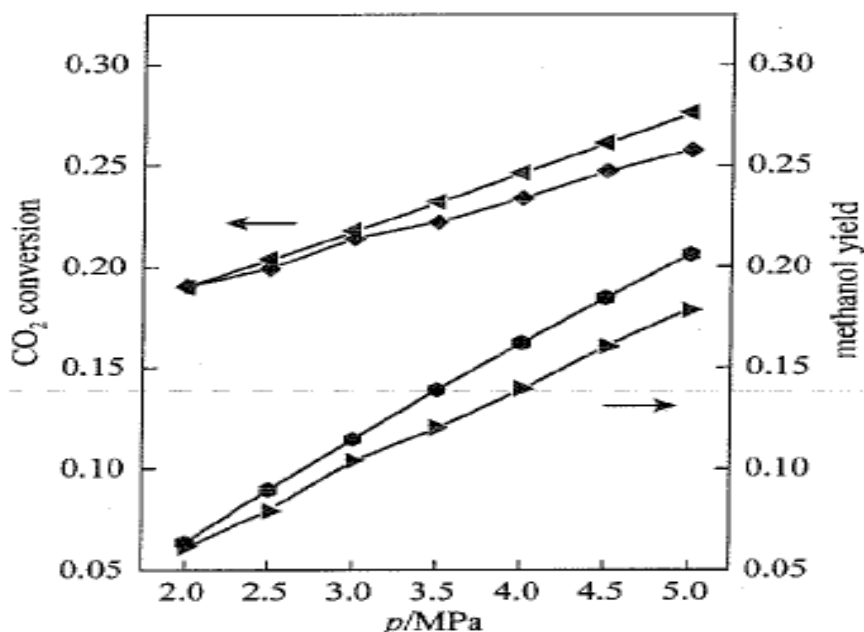


Figure 2. Relationship between reaction pressure and CO<sub>2</sub> conversion and methanol yield from experimental results and thermodynamic predictions (Reprinted with permission from [25]).

However, very high pressures tend to increase the production cost and are unsafe.

Therefore, present efforts are to decrease the operating pressure without affecting the yield by developing novel catalysts.

#### 2.4.3 Space Velocity

Space velocity can have complicated effects on methanol yield. Xin *et al.* reported that both CO<sub>2</sub> conversion and methanol yield decreased as space velocity was increased for a given value of CO<sub>2</sub> concentration.

Their results are shown in Figure 3 [25].

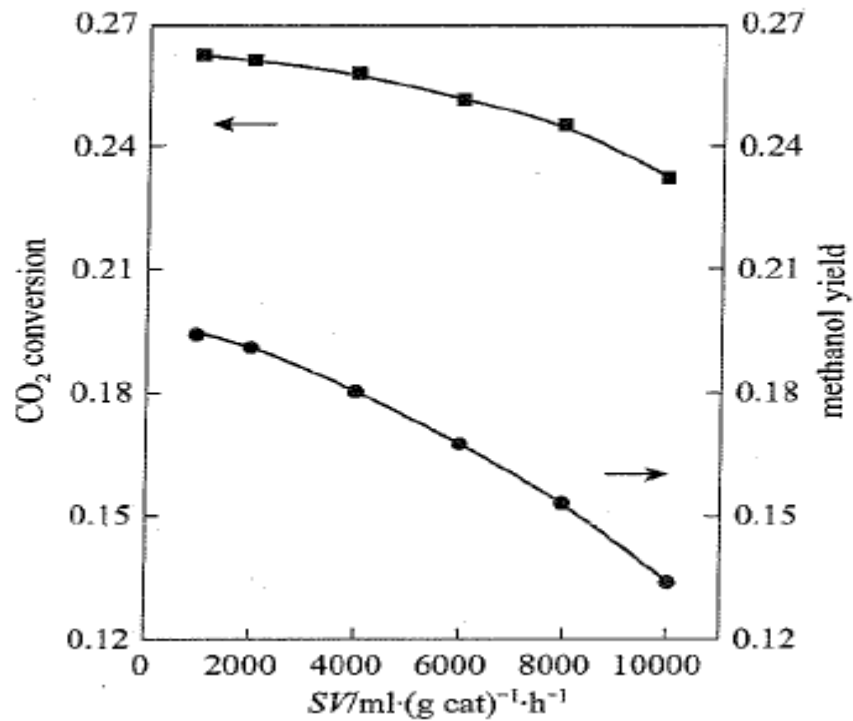


Figure 3. Relationship between space velocity and CO<sub>2</sub> conversion and methanol yield (Reprinted with permission from [25]).

However, in another study, Lee and co workers found that methanol yields increased at low space velocities but only up to a particular value of CO<sub>2</sub> concentration after which it began to decrease. They reported that maximum rate of methanol production could be achieved with an optimum value of space velocity, as shown in Figure 4 [27].

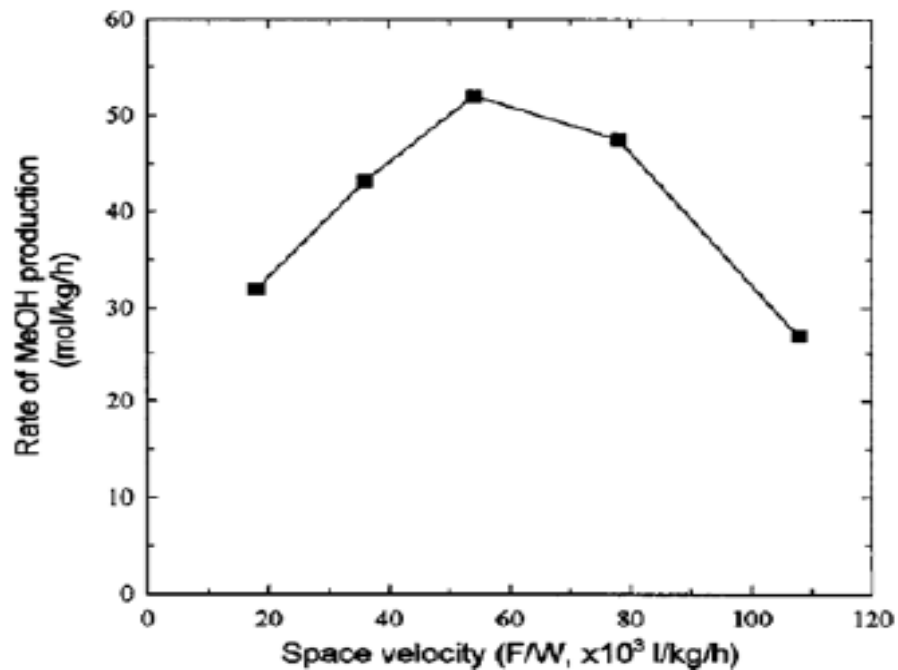


Figure 4. Rates of methanol formation as a function of space velocity for methanol synthesis over Cu/ZnO/Al<sub>2</sub>O<sub>3</sub> catalyst with synthesis gas containing 10 vol% CO<sub>2</sub>. Reaction conditions: T =523 K, P=3.0 MPa, H<sub>2</sub>/CO<sub>x</sub>=4 (Reprinted with permission from [27]).

## 2.5 Catalyst

Cu/ZnO/Al<sub>2</sub>O<sub>3</sub> is the catalyst mostly chosen for methanol synthesis due to its high selectivity, stability, and activity. Copper acts as the main active component, ZnO acts as a supporter and Al<sub>2</sub>O<sub>3</sub> acts as a promoter. Another promoter used in the catalyst system is chromia [2, 6]. However, there are many controversies and questions regarding the individual catalyst components, the role of ZnO, and the identity of active sites. Most of the authors are of the view that metallic copper is the active component of the catalyst and the role of ZnO is to enhance dispersion of copper particles. Ovesen *et al.* concluded from their results that Cu was the active catalytic component in methanol synthesis [23].

Froment and Bussche also assumed Cu to be the active catalytic site and ZnO to provide structural promotion in the development of their detailed kinetic model for methanol formation [13]. Another group of researchers led by Fujitani *et al.*, however, have demonstrated conflicting results. They showed using surface science techniques that the role of ZnO was to form active sites in addition to dispersing Cu particles [5]. Ostrovskii also reported that methanol synthesis occurs on the ZnO component of the catalyst [22].

Since, CO and CO<sub>2</sub> hydrogenation is believed to occur on two different sites, it is proposed that doubts regarding the identity of active sites could be resolved [2,18]. There are also efforts to develop novel catalysts that can effectively operate at lower temperatures, lower pressures, and exhibit water tolerance since water acts as an inhibitor for the catalyst [12].

## 2.6 Summary

A large volume of literature is contributed to studying methanol synthesis reaction kinetics owing to its importance in the industry. However, a number of controversies still remain unresolved regarding the reaction mechanism, in particular. Although CO<sub>2</sub> has been accepted to be the primary source of carbon in methanol, its role and its effect on methanol production rates has not yet been described clearly. Modeling of reaction kinetics can, therefore, prove to be beneficial in understanding the overall process. A number of kinetic models have been proposed in literature and there is still scope to develop newer and more effective models which could help improve the process and enhance methanol yield.

## CHAPTER 3

### RESEARCH OBJECTIVES

The primary objective of this study was to investigate different kinetic models that have been proposed in literature for methanol synthesis over a copper- based zinc/chromia catalyst. Another aspect of this work was to compare the goodness of fit of different models and select the best fit model by fitting experimental kinetic data over a range of inlet carbon dioxide partial pressures.

Models based on a mechanism considering CO hydrogenation to be the principal pathway in forming methanol were compared to those derived from the scheme considering CO<sub>2</sub> to be the primary reactant in methanol synthesis over different ranges of CO<sub>2</sub> partial pressures in the feed. Each of these models was also compared to a combined kinetic rate expression. The aim was to select the kinetic model and rate expression that fits the data best and can describe methanol synthesis kinetics most appropriately.

It was hypothesized that the model based on the CO hydrogenation pathway should fit the rate data better in case of low CO<sub>2</sub> feed partial pressures, while the model based on the CO<sub>2</sub> hydrogenation pathway should fit the data with high CO<sub>2</sub> content more effectively. It was also presumed that the combined rate expression including both CO and CO<sub>2</sub> hydrogenation rate terms will prove to be the best fit kinetic model. The study also used the results from the best fit model to explain some aspects and resolve some arguments related to methanol synthesis kinetics.



## CHAPTER 4

### METHODOLOGY

#### 4.1 Overview

This study comprises of analyzing and comparing different kinetic models and selecting the best fit kinetic rate expression for methanol synthesis from CO, CO<sub>2</sub>, and H<sub>2</sub>O over a Cu/ZnO/Cr<sub>2</sub>O<sub>3</sub> catalyst. Non linear regression techniques in POLYMATH were used to determine the rate parameters and goodness of fit of the models. The methodology included the following steps:

- Selection of statistically sound kinetic models
- Data evaluation
- Parameter estimation
- Evaluation of models
- Comparison of models
- Analysis of Results

#### 4.2 Selection of statistically sound kinetic models

A kinetic rate expression is derived from the reaction mechanism by assuming a particular rate limiting step. Rate laws are written in the following form:

$$\text{rate} = \frac{(\text{Kinetic term}) \cdot (\text{Potential term})}{(\text{Adsorption term})^n} \quad \text{Equation (1)}$$

A rate equation should fit a set of data better than other alternative rate expressions to prove its effectiveness. However, any one kinetic model cannot be considered the most accurate since rate laws often exhibit the same form and more than

one model can fit a set of data with equal efficacy. Another aspect of importance is developing a kinetic model that can be applied at temperatures and pressures pertinent to the industry.

As mentioned in Sections 2.2, methanol synthesis kinetics has been a point of controversy despite of the fact that a large volume of literature and experimental results have been reported regarding the mechanism and kinetic modeling. One of the main unresolved issues is the source of carbon in methanol and the role of CO<sub>2</sub> in methanol synthesis. Some researchers believe that CO<sub>2</sub> is the primary reactant in forming methanol while many others are of the view that carbon in methanol comes from CO. As a result, different mechanistic schemes have been written based on which various kinetic models have been proposed in literature, as shown in Table 1 in Section 2.3.

Among the kinetic models proposed in literature, two models have been selected for this study based on their goodness of fit to the respective kinetic data. The validity and effectiveness of the developed rate models was tested by determining how well they fit the experimental data compared to other proposed models. The model based on the reaction scheme which considers CO to be the primary reactant in methanol synthesis is:

$$r_1 = \frac{k_1 K_{CO} [f_{CO} f_{H_2}^{3/2} - f_{CH_3OH} / (f_{H_2}^{1/2} K_{eq,1})]}{(1 + K_{CO} f_{CO} + K_{CO_2} f_{CO_2}) [f_{H_2}^{1/2} + (K_{H_2O} / k_{H_2}^{1/2}) f_{H_2O}]}$$
 Equation (2)

where,

$r_1$  = reaction rate

$f_i$  = fugacity of component i

$k_i$  = reaction rate constant

$K_{eq}$  = equilibrium constant for methanol synthesis reaction

$K_i$  = constants relative to adsorption equilibrium terms in the model

It was proposed by Graaf *et al.* in 1988. Graaf and co authors developed three independent kinetic equations for CO hydrogenation, CO<sub>2</sub> hydrogenation and water gas shift reaction. Among them, the kinetic model based on CO hydrogenation treating CO as the main reactant was chosen for this study. The fugacities in Equation (2) have been replaced by partial pressures since the fugacity coefficients calculated for the species at the used temperature and pressure are close to unity. The coefficients were calculated using the Fugacity Coefficient Solver of Thermosolver software.

The authors have shown that the experimental and estimated values of reaction rates for methanol and water agree to a satisfactory extent as shown in Figure 5. Also, they found the model statistically appropriate based on the standard  $\chi_2$  test [26].

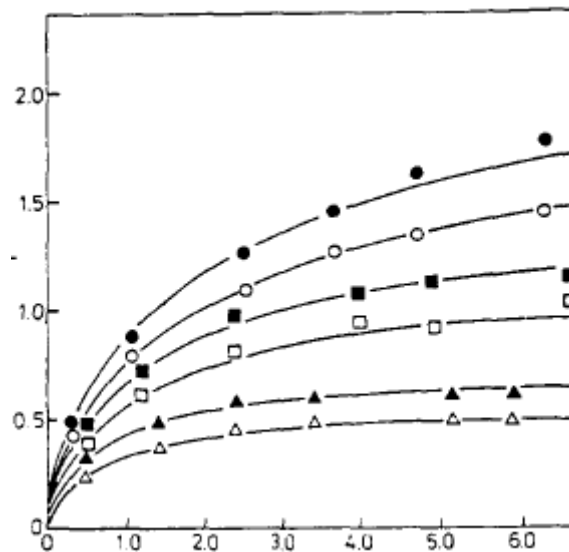


Figure 5. Reaction rates for methanol and water: ( $\circ$ ) and ( $\bullet$ ),  $p=50$  bar, ( $\square$ ) and ( $\blacksquare$ ),  $p=30$  bar, ( $\Delta$ ) and ( $\blacktriangle$ ),  $p=15$  bar. Open symbols= reaction rates for methanol. Closed symbols= reaction rates for water. Lines = calculated with model (Reprinted with permission from [26]).

The other model selected for this study was put forth by Rozovskii and co workers. It was based on the fact that methanol was formed from only carbon dioxide and not carbon monoxide. The authors believed that CO hydrogenation to methanol did not take place directly. Instead, CO was converted to CO<sub>2</sub> via the water gas shift reaction which underwent hydrogenation to form methanol. The kinetic model is of the form:

$$r = \frac{k_3 p_{H_2} \left(1 - \frac{p_m p_{H_2O}}{K_{p(m)} p_{H_2}^3 p_{CO_2}}\right)}{1 + K_{-2} p_{H_2O} + K_{-2} p_{H_2O} / (K_1 p_{CO_2})} \quad \text{Equation (3)}$$

where,

r = reaction rate

k<sub>i</sub> = reaction rate constant

K<sub>i</sub> = equilibrium constant of step i

K<sub>p(m)</sub> = methanol synthesis equilibrium constant

p<sub>i</sub> = partial pressure of component i

The authors reported that the relative error in the experimental and calculated partial pressure values for methanol and water was not more than 15% and 10% respectively [19].

#### 4.3 Data Evaluation

An extensive set of rate vs. partial pressure data for a reaction carried out using Cu/ZnO/Cr<sub>2</sub>O<sub>3</sub> catalyst at relevant temperature and pressure is needed for testing the goodness of fit of the proposed rate equation. It has to be ensured that the selected data is good enough for the fitting procedure. Data was selected based on the number of

independent experimental data points (minimum three data points for one parameter), repeatability and reproducibility of runs, standard deviation, and errors in measurement.

In this study, experimental data reported by Calverley was used in kinetic modeling. Calverley conducted methanol synthesis experiments at 100 atm and 285° C. Rate vs. partial pressure data derived from Calverley's experimental results is listed in Table 2. The complete kinetic data set reported by Calverley is shown in Table A.1 in Appendix A.

Calverley used a fixed bed tubular reactor in his experiments. Since the reactor was operated in integral mode, the rates were calculated by fitting a polynomial function to conversion and turnover frequency data. The resulting polynomial was differentiated to obtain the rates. The complete method and graphs are shown in Appendix A.

Table 2. Rate vs. partial pressure data (modified from [35]).

Expt. no.	Partial pressure in reacting mixture (atm)					rate(mole g <sup>-1</sup> h <sup>-1</sup> )
	P <sub>H2</sub>	P <sub>CO</sub>	P <sub>CO2</sub>	P <sub>CH3OH</sub>	P <sub>H2O</sub>	
1	23.6611	47.47184	10.2643	7.22825	0.100708	0.036951
2	22.39149	48.44998	10.74025	6.54032	0.09771	0.036873
3	22.92911	48.47728	10.64591	6.16146	0.099122	0.036873
4	26.75057	58.83309	0.261214	4.90524	0.002338	0.057407
5	25.59639	60.18043	0.352938	4.12758	0.002955	0.057324
6	26.25064	57.83377	0.21978	2.97	0.001964	0.098346
7	26.52385	57.85767	0.15642	2.8215	0.001412	0.098346

Expt. no.	Partial pressure in reacting mixture (atm)					rate(mole g <sup>-1</sup> h <sup>-1</sup> )
	P <sub>H2</sub>	P <sub>CO</sub>	P <sub>CO2</sub>	P <sub>CH3OH</sub>	P <sub>H2O</sub>	
8	27.25414	56.1685	0.11682	4.5045	0.001116	0.098537
9	27.57242	56.16534	0.08712	4.2867	0.000842	0.098537
10	27.43637	54.68739	0.073778	6.62008	0.000729	0.098413
11	27.53455	54.65099	0.105682	6.52038	0.001048	0.098413
12	25.80793	58.23389	0.307076	4.00794	0.002679	0.052876
13	23.61426	53.98524	0.382848	6.05179	0.003297	0.046801
14	24.75748	52.78336	0.374872	6.70981	0.003461	0.046745
15	25.63614	55.97083	4.871298	4.0504	0.043921	0.052479
16	43.12371	39.80287	4.729087	5.71936	0.100859	0.021616
17	21.5991	60.16416	0.28304	3.24032	0.002	0.059686
18	26.15155	57.8314	0.23562	3.0294	0.002097	0.097692
19	26.32651	57.57811	0.218226	3.23407	0.001964	0.098233
20	27.1295	56.16234	0.13662	4.5837	0.001299	0.097884
21	18.07447	65.23821	0.231988	2.47716	0.001265	0.067878
22	23.37286	47.2388	0.176176	2.60876	0.001716	0.048809
23	39.07473	33.71077	0.071148	3.60822	0.001623	0.020618
24	16.3641	53.59279	0.1596	1.6128	0.000959	0.065731
25	14.85073	46.44027	0.109824	1.01376	0.000691	0.098233
26	15.17839	45.98898	0.102784	1.28832	0.000668	0.098253

Expt. no.	Partial pressure in reacting mixture (atm)					rate(mole g <sup>-1</sup> h <sup>-1</sup> )
	P <sub>H2</sub>	P <sub>CO</sub>	P <sub>CO2</sub>	P <sub>CH3OH</sub>	P <sub>H2O</sub>	
27	26.70627	54.65583	0.259512	3.84353	0.002496	0.052513
28	24.19182	47.08725	0.128066	2.50712	0.001295	0.052513
29	26.04254	18.17773	0.0295	1.49	0.000832	0.010788
30	25.9988	18.17061	0.0254	1.54	0.000715	0.010788
31	26.2044	11.15081	7.925114	1.915	0.366614	0.025611
32	37.11324	15.35355	12.96311	5.9812	0.61683	0.025611
33	26.34675	11.23801	7.87404	1.755	0.363389	0.025611
34	26.51445	8.606552	11.45455	1.27	0.694653	
35	15.44279	13.87243	16.92149	0.635	0.370807	0.026659
36	26.86179	12.69082	6.751975	1.965	0.281328	0.031318
37	26.57701	13.91582	4.815106	2.23	0.181025	0.029586
38	26.63701	13.94311	4.80367	2.16	0.180649	0.029688
39	26.37333	15.58774	3.620792	2.525	0.120593	0.022224
40	25.63808	16.4711	2.744082	2.48	0.084081	0.01628
41	26.08267	17.27464	1.17477	2.66	0.034917	0.012843
42	26.35364	18.75499	0.332431	2.285	0.009195	0.008732
43	24.48028	53.31206	5.112754	6.17143	0.046215	0.045423
44	27.12064	17.16944	1.469595	1.055	0.045696	0.065599
45	28.72466	7.9083	11.37746	0.51	0.813492	0.001358

Expt.no.	Partial pressure in reacting mixture (atm)					rate(mole g <sup>-1</sup> h <sup>-1</sup> )
	P <sub>H2</sub>	P <sub>CO</sub>	P <sub>CO2</sub>	P <sub>CH3OH</sub>	P <sub>H2O</sub>	
46	28.26576	10.49342	8.2016	0.63	0.434889	0.017594
47	28.31764	12.25776	6.11422	0.69	0.27805	0.031063
48	27.66529	16.81097	3.214026	0.91	0.104119	0.06436
49	27.10585	18.34763	1.61544	0.955	0.04698	0.075925
50	27.64567	18.08989	0.735522	0.93	0.022127	0.07193
51	27.55619	18.98943	0.0041	0.445	0.000117	0.077518

The data looks adequate since there are sufficient numbers of experimental runs. The results are reported up to 3 significant figures. A Varian 920 gas chromatograph was used to measure H<sub>2</sub>, CO, and CO<sub>2</sub>. Known mixtures of CO and H<sub>2</sub> were sampled with the GC over a range of compositions to verify the linearity of response. A Varian 1440 gas chromatograph was used to quantify hydrocarbons and methanol. The author has reported that the reproducibility of the experiments was acceptable. Exit methanol concentration remained within 2% for a given run when calculated over time.

Carbon balance calculated for each run was limited to 1%. Also, constant catalytic activity was maintained throughout the experiment to ensure uniformity in the results. Calverley also showed that the experiments were essentially carried out in the kinetic regime and the external and internal mass transfer rates could be neglected at the given experimental conditions. The concentration gradient of CO near the catalyst surface was found to be negligibly small. Methanol yields were found to be independent



of catalyst particle size showing that internal mass transfer rates were very small. The author also reported insignificant temperature gradients during the experiments [35].

#### 4.4 Parameter Estimation

Estimation of kinetic parameters was done by fitting the rate equations shown in Section 4.1 to the experimental data shown in Section 4.2 using POLYMATH, a non-linear regression software. The model proposed by Graaf was fit to only those data points which show low or zero CO<sub>2</sub> inlet partial pressures while the model proposed by Rozovskii was fit to those data points where CO<sub>2</sub> partial pressures are high in the feed. The combined rate expression was fit to the entire range of data.

A minimum of three and maximum of seven parameters were estimated including the reaction rate constants ( $k$ ) and the adsorption equilibrium constants ( $K_i$ ). The reaction equilibrium constants ( $K_{p,i}$ ) were calculated from THERMOSOLVER software since increasing the number of parameters beyond a limit may make the model less realistic. Table 3 shows the variables, constants and parameters estimated in this study.

Table 3. Variables, constants and parameters in this study.

Constants	Variables	Parameters
Temperature	Partial pressure/product composition	Reaction rate constant ( $k$ )
Space Velocity	Reaction rates	Adsorption equilibrium constant ( $K_i$ )
Catalyst composition		Reaction equilibrium constant ( $K_{p,i}$ )

#### 4.5 Evaluation of Models

The goodness of fit of the kinetic models was evaluated by comparing the rates

obtained from the model with those reported by Calverley. The statistical information and plots reported in the POLYMATH results were used to judge the quality of the developed model. The following points were used as guidelines in determining the goodness of fit of the developed kinetic model [29]:

- $R^2$  and  $R^2_{adj}$ :  $R^2$  and  $R^2_{adj}$  are the correlation coefficients which determine if the model represents the experimental data precisely or not. A correlation coefficient close to one indicates an adequate regression model. They can also be used for comparing various models representing the same dependent variable.
- Variance and Rmsd: A small variance ( $< 0.01$ ) and Rmsd usually indicate a good model. These parameters can be used for comparing various models representing the same dependent variable.
- Graph: If a plot of the calculated and measured values of the dependent variable shows different trends, it signifies an inadequate model.
- Residual plot: The residual plot showing the difference between the calculated and experimental values of the dependent variable as function of the experimental values will be used a measure of goodness of fit of the model. A randomly distributed residual plot is an indication of goodness of fit of a model. If the residuals show a clear trend, it is indicative of an inappropriate model.
- Confidence intervals: The 95% confidence intervals should be smaller and should have the same sign as the respective parameter values for a statistically good model. The guidelines are also summarized in Table 4.

Table 4. Statistical tests for model evaluation.

Statistical Parameters	Expected Behaviour
$R^2$	> 0.80
Confidence interval	Smaller and of same sign
Variance	<0.01
Graph	Similar trends
Residual Plot	Random distribution

#### 4.6 Comparison of Models

The statistical results from POLYMATH form the basis for comparison of the kinetic models. Four main comparisons were done in this study. They are:

- Graaf's model vs. Rozovskii's model for low CO<sub>2</sub> partial pressure data
- Graaf's model vs. Rozovskii's model for high CO<sub>2</sub> partial pressure data
- Combined model vs. Graaf's model for entire range of data
- Combined model vs. Rozovskii's model for entire range of data

This comparative study was used to select the model that fit the experimental data best and described methanol synthesis kinetics most appropriately.

#### 4.7 Analysis of Results

The results obtained from the best fit kinetic model were used to analyze the trends and aspects related to methanol synthesis. The analysis was mainly concentrated on the effect of different reaction conditions on the relative contribution of CO and CO<sub>2</sub> to producing methanol.

#### 4.8 Summary

Kinetic models proposed by researchers were selected based on their efficacy in describing methanol synthesis kinetics. Experimental data reported by Calverley after evaluation was selected for the purpose of modeling. Multiple non linear regression techniques in POLYMATH were used to fit the models to the experimental data in order to determine the kinetic parameters and the goodness of fit of the models. Statistical tests in POLYMATH were used to compare the effectiveness of various models in depicting kinetics of methanol synthesis and select the best fit kinetic model. The results predicted by the most appropriate model were used in studying some kinetic features of methanol synthesis.

## CHAPTER 5

### RESULTS AND DISCUSSION

#### 5.1 Overview

The models were fit to the experimental kinetic data to study their effectiveness in describing methanol synthesis kinetics. Three different models were compared to select the best fit model using regression techniques. The results and data generated from the best fit model were then used to study some trends and kinetic aspects of methanol synthesis. This chapter includes the following content:

- Regression results and parameter evaluation
- Role of CO/CO<sub>2</sub> in producing methanol

#### 5.2 Regression Results and Parameter Evaluation

A wide range of data including both low and high CO<sub>2</sub> inlet partial pressures was chosen for regression so that the applicability of the kinetic models could be validated properly. The equilibrium constants for CO and CO<sub>2</sub> hydrogenation reactions at the reaction temperature were calculated using the THERMOSOLVER software. They were found to be  $3.88 \times 10^{-4}$  for CO hydrogenation and  $7.7 \times 10^{-5}$  for CO<sub>2</sub> hydrogenation reaction. The equilibrium constants were also calculated using the equations presented by Graaf *et al* [36]. The values were found to be very close using the two methods.

The statistical features obtained by fitting Graaf's model to low inlet CO<sub>2</sub> partial pressure data and Rozovskii's model to high inlet CO<sub>2</sub> partial pressure data are summarized in Table 5.

Table 5. POLYMATH results of fitting Graaf's and Rozovskii's model.

Model	Parameters					
	R <sup>2</sup>	R <sup>2</sup> adj	Variance	Rmsd	Residuals	95% confidence intervals
Graaf	0.81	0.75	1.9*10 <sup>-4</sup>	0.00323	scattered	positive, smaller
Rozovskii	0.91	0.89	4.13*10 <sup>-5</sup>	0.0016	scattered	positive, smaller

The statistical features listed in Table 4 are used as indicators of the quality of the regression models. They are explained below:

- R<sup>2</sup> and R<sup>2</sup>adj were close to one suggesting the models satisfactorily represent the kinetic data
- Variance and Rmsd was sufficiently small to indicate that both the models represent the data accurately
- Residuals as shown in Figures B.1 and B.2 in Appendix B were randomly distributed and did not follow a particular trend signifying the models are statistically appropriate
- Confidence intervals are listed in polymath reports for both the models shown in Tables B.1 and B.2 in Appendix B. The models were statistically stable since the confidence intervals were much smaller than the respective absolute values of the parameters

The parameter values obtained from the fitting procedure are shown in Table 6.

Table 6. Values of kinetic parameters for Graaf's and Rozovskii's model.

Model	
Graaf	
Parameter	Value
$k_1 ((\text{atm}\cdot\text{h})^{-1})$	0.0535
$K_{\text{CO}} (\text{atm}^{-1})$	0.0022
$K_{\text{CO}_2} (\text{atm}^{-1})$	0.0185
$K_{\text{wh}} (\text{atm}^{-1})$	1011
Rozovskii	
$k_3 ((\text{atm}\cdot\text{h})^{-1})$	0.0031
$K_{-2} (\text{atm}^{-1})$	5.104
$K_1 (\text{atm}^{-1})$	9.978

The graphical representation of the results is shown in Figures 6 and 7.

Figure 6 shows a comparison of experimental values of rate and those calculated from Graaf's model when the inlet  $\text{CO}_2$  partial pressures were negligibly small.

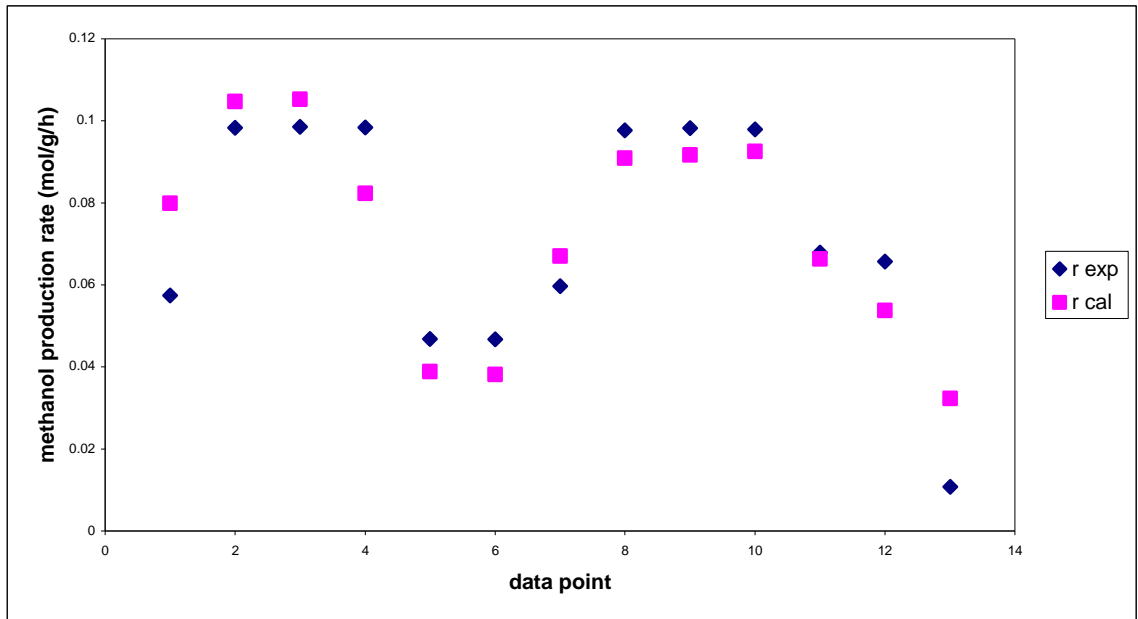


Figure 6. Comparison of experimental and predicted (by Graaf's model) methanol production rate.

Figure 6 shows that the model proposed by Graaf which was based on CO being the primary reactant, fit to the data well where CO<sub>2</sub> feed partial pressures were very low. The experimental and estimated rates matched each other quite closely, thereby confirming the hypothesis. Figure 7 shows a comparison of experimental and calculated values of rate for Rozovskii's model for high CO<sub>2</sub> partial pressure data. The residual plots for both the regression models are shown in Figures B.1 and B.2 in Appendix B. Also, the polymath reports summarizing the statistical features of the regression are shown in Tables B.1 and B.2 in Appendix B.

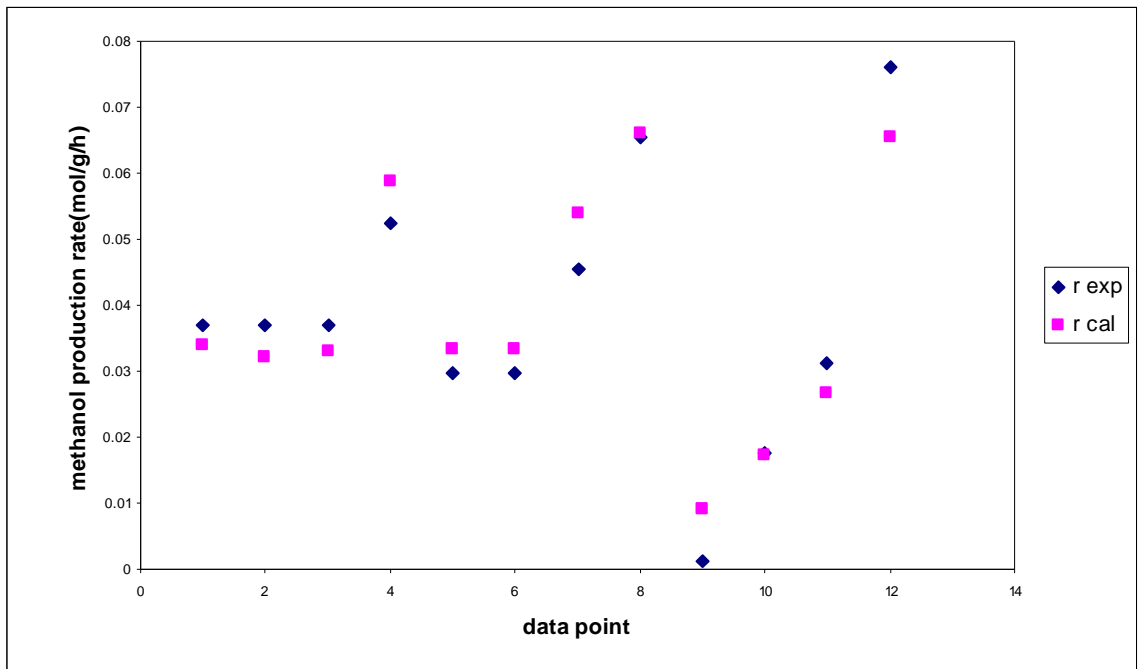


Figure 7. Comparison of experimental and predicted (by Rozovskii's model) methanol production rate.

For CO<sub>2</sub> enriched feed, Rozovskii's model that was derived assuming CO<sub>2</sub> to be the main reactant, provided an effective kinetic description of the methanol synthesis



process. As shown in Figure 7, the rates estimated from Rozovskii's model are in good agreement with the experimental rate values.

Both the models were fit to low and high inlet CO<sub>2</sub> partial pressure data in order to compare the effectiveness of each for the given range of data. Figure 8 shows a comparison of experimental values of rate and those calculated by Graaf's model and Rozovskii's model when CO<sub>2</sub> partial pressures were negligibly small in the feed.

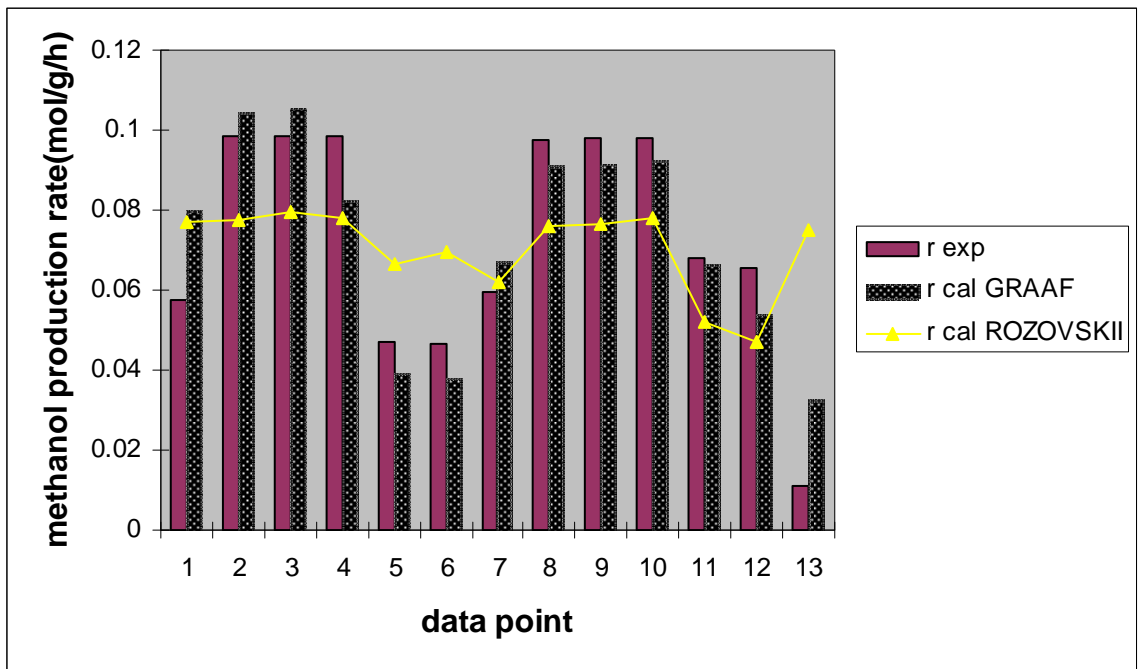


Figure 8. Comparison of experimental methanol production rate and those predicted by Graaf's and Rozovskii's models at low CO<sub>2</sub> inlet partial pressures.

Line column charts have been used to represent the data since it is easier to read the data with these plots. The trend in Figure 8 on the next page shows that Graaf's model fit better to the experimental data than Rozovskii's model when CO<sub>2</sub> was in negligible amounts in the feed. Figure 9 shows a comparison of experimental rate values

and rate values estimated from Graaf's and Rozovskii's models when the CO<sub>2</sub> partial pressures were high in the feed.

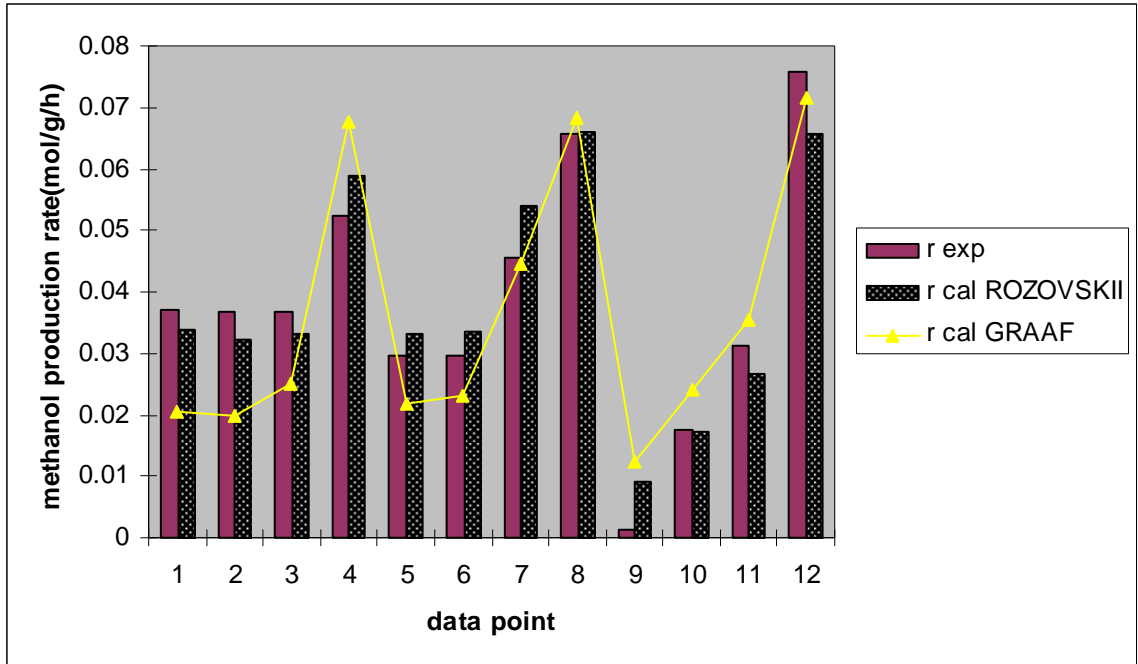


Figure 9. Comparison of experimental methanol production rate and those predicted by Graaf's and Rozovskii's models at high CO<sub>2</sub> inlet partial pressures.

It can be observed that in this case, Rozovskii's model provided a better kinetic description of the process. Rozovskii's model that was based on treating CO<sub>2</sub> as the primary reactant does not match the low CO<sub>2</sub> content data at all. However, when CO<sub>2</sub> content in the feed was high, both Graaf's and Rozovskii's model fit to the experimental data satisfactorily. The rates calculated by Graaf also followed the experimental data points closely, though not as close as the rates estimated by Rozovskii's model. This

feature was also observed by Rozovskii in his study. The models proposed by him fit to the experimental results better when CO<sub>2</sub> amounts were higher in the feed [19].

The combined rate expression by summing equations 1 and 2 can be written as,

$$r_1 = \frac{k_1 K_{CO} [f_{CO} f_{H_2}^{3/2} - f_{CH_3OH} / (f_{H_2}^{1/2} K_{eq,1})]}{(1 + K_{CO} f_{CO} + K_{CO_2} f_{CO_2}) [f_{H_2}^{1/2} + (K_{H_2O} / k_{H_2}^{1/2}) f_{H_2O}]} + \frac{k_3 P_{H_2} (1 - \frac{P_m P_{H_2O}}{K_{p(m)} P_{H_2}^3 P_{CO_2}})}{1 + K_{-2} P_{H_2O} + K_{-2} P_{H_2O} / (K_1 P_{CO_2})}$$

Equation (4)

The parameters in this expression were fit to the entire range of experimental data including low as well as high CO<sub>2</sub> inlet partial pressures. Figure 10 shows a comparison of experimental values of rate and rates estimated from the combined model.

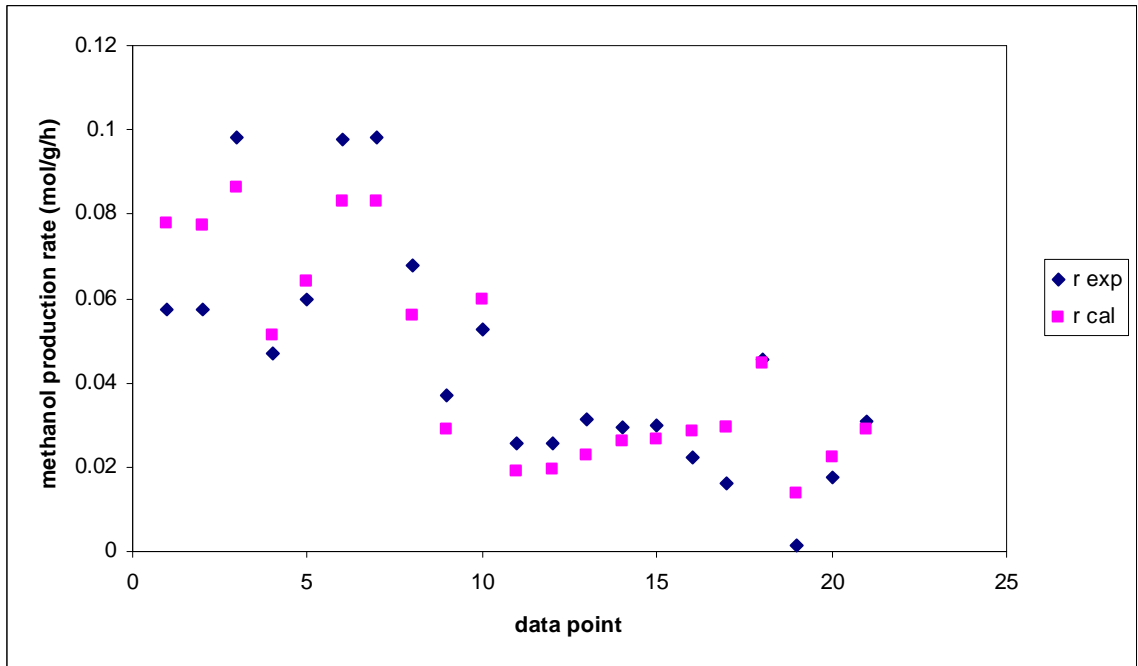


Figure 10. Comparison of experimental values of methanol production rate and rates estimated from the combined model.

The graph shows a good agreement between the experimental and simulated data. The kinetic parameters obtained from fitting this expression are listed in Table 7. The residual plot is shown in Figure B.3 in Appendix B. A polymath report showing the statistical features of the regression in detail is listed in Table B.3 in Appendix B.

Table 7. Values of kinetic parameters obtained from fitting the combined rate equation.

Parameter	Value
$k_1 ((\text{atm}\cdot\text{h})^{-1})$	0.0232
$K_{\text{CO}}$	0.0024
$K_{\text{CO}_2}$	0.0625
$K_{\text{wh}}$	11.099
$k_3 ((\text{atm}\cdot\text{h})^{-1})$	0.0009
$K_{-2}$	0.0032
$K_1$	0.0226

As mentioned in Section 4.5, four main comparisons are done in this study. The data set used for fitting to the combined model was also fit to Graaf's and Rozovskii's model separately. The comparison of the experimental rate values and those estimated from the combined kinetic rate expression as well as from Graaf's and Rozovskii's models is shown in Figure 11. The degree of fit obtained with a model was very sensitive to the initial parameter value guesses, so attempts were made with a variety of initial guess combinations.

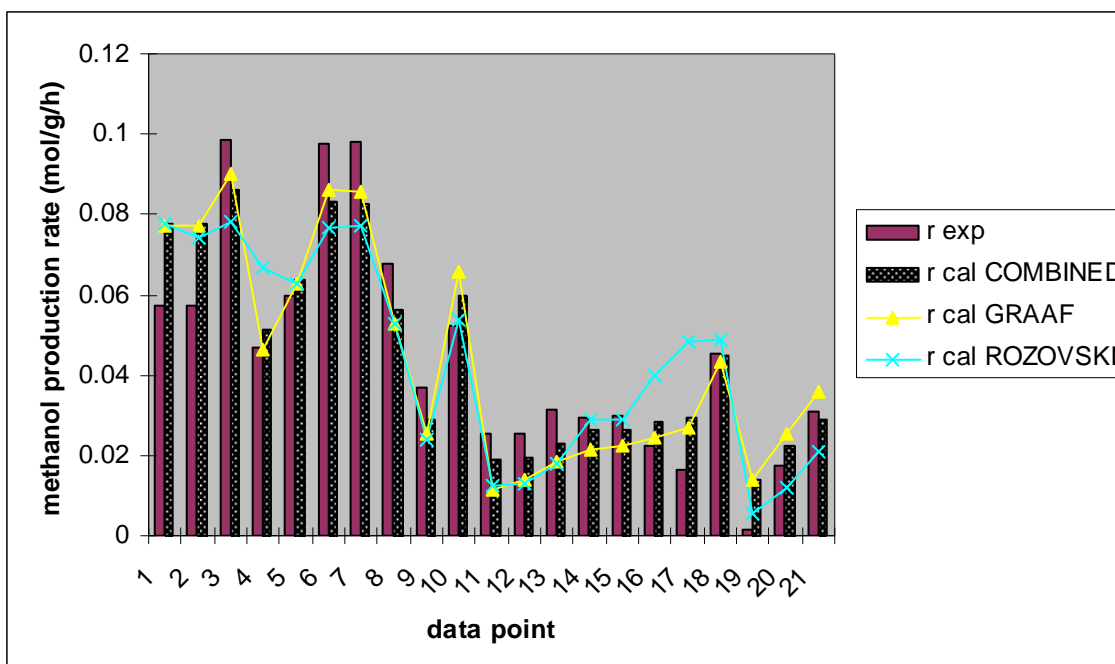


Figure 11. Comparison of experimental methanol production rate values and those estimated from the combined kinetic rate expression and Graaf's and Rozovskii's models.

The trend in Figure 11 suggests that the combined rate expression fits to the experimental data better than the individual models. Although, the rates calculated from Graaf's model are also in good agreement with the experimental rate values, it is the combined rate expression which gives the best results. The results of fitting for the four comparisons are tabulated in Table 8.

Table 8. POLYMATH results of fitting for the comparative study of models.

low CO <sub>2</sub> partial pressure						
Parameter	R <sup>2</sup>	R <sup>2</sup> adj	Variance	Rmsd	Residuals	95% confidence intervals
Model						
Graaf	0.81	0.75	1.9*10 <sup>-4</sup>	0.00323	scattered	positive, smaller
Rozovskii	0.106	-0.67	8.5*10 <sup>-4</sup>	0.0071	follow a trend	positive, smaller
high CO <sub>2</sub> partial pressure						
	R <sup>2</sup>	R <sup>2</sup> adj	Variance	Rmsd	Residuals	95% confidence intervals
Graaf	0.71	0.60	1.5*10 <sup>-4</sup>	0.0029	scattered	positive, smaller
Rozovskii	0.91	0.89	4.13*10 <sup>-5</sup>	0.0016	scattered	positive, smaller
entire range						
	R <sup>2</sup>	R <sup>2</sup> adj	Variance	Rmsd	Residuals	95% confidence intervals
Combined	0.85	0.78	1.6*10 <sup>-4</sup>	0.0022	scattered	positive, smaller
Graaf	0.82	0.79	1.5*10 <sup>-4</sup>	0.0024	scattered	positive, smaller
entire range						
	R <sup>2</sup>	R <sup>2</sup> adj	Variance	Rmsd	Residuals	95% confidence intervals
Combined	0.85	0.78	1.6*10 <sup>-4</sup>	0.0022	scattered	positive, smaller
Rozovskii	0.68	0.64	2.6*10 <sup>-4</sup>	0.0033	scattered	positive, smaller

The statistical parameters listed in Table 8 as well as the trend in Figure 11 indicate that the combined model is the best fit model. Based on the above mentioned results, it can be concluded that the combined rate expression which includes both CO and CO<sub>2</sub> hydrogenation rate terms describes methanol synthesis kinetics in the best

possible manner. It was also attempted to fit the combined model separately to low and high inlet CO<sub>2</sub> partial pressure data, however, there were not enough data points in the two ranges to achieve proper regression results.

### 5.3 Role of CO/CO<sub>2</sub> in Producing Methanol

A number of kinetic models have been proposed in the literature attempting to describe methanol synthesis kinetics. However, the controversies regarding the carbon source in methanol and the nature of active sites still remain unsolved. An effort, therefore, was made in this study to come up with a model that can adequately describe some features and resolve questions related to methanol synthesis kinetics. The model proposed in this study is based on the fact that CO and CO<sub>2</sub> hydrogenation both contribute to overall methanol production.

However, the relative contribution of CO and CO<sub>2</sub> hydrogenation in producing methanol cannot be generalized. Instead, the question regarding the main source of carbon in methanol depends on specific conditions like conversion, pressure, relative amount of CO and CO<sub>2</sub>, as well as hydrogen content in the feed. The results have been discussed under the following conditions:

- Conversion
- Hydrogen content in the feed
- Pressure
- CO/CO<sub>2</sub> content in the feed

### 5.3.1 Conversion

Figure 12 shows the Gibb's free energy change of hydrogenation of CO and CO<sub>2</sub> to methanol as a function of temperature. It can be observed that CO<sub>2</sub> hydrogenation has more negative  $\Delta G$  and thus a higher driving force at very low conversions whereas CO hydrogenation is more likely to occur at higher conversions at a temperature of 558 K.

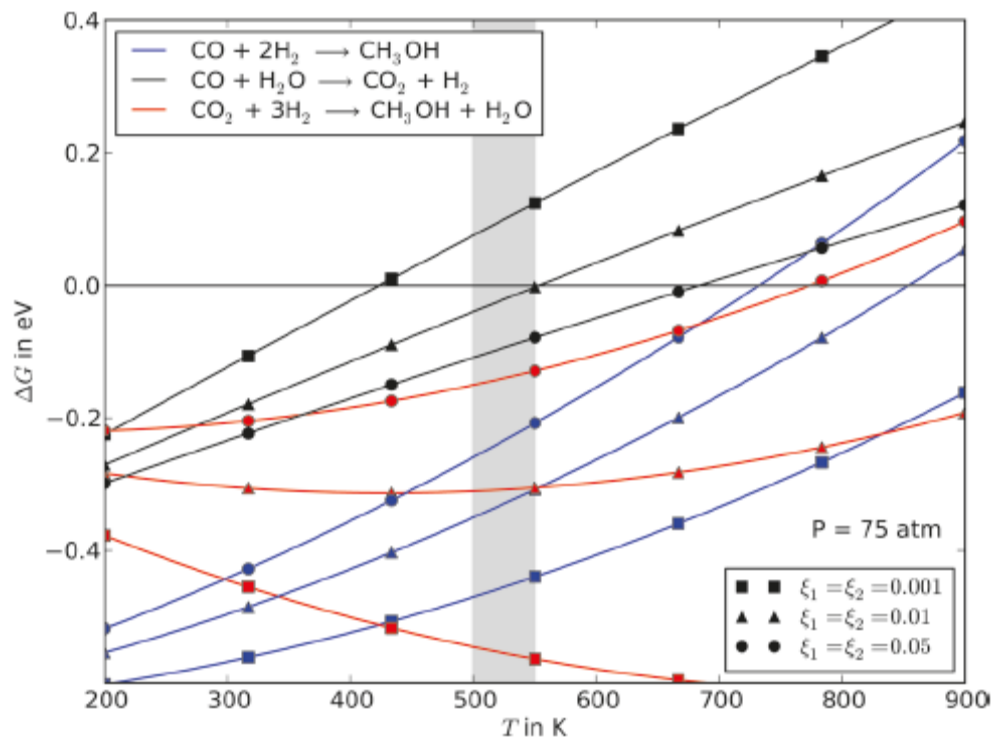


Figure 12. Gibb's free energy change,  $\Delta G$ , for CO and CO<sub>2</sub> hydrogenation to CH<sub>3</sub>OH and the WGS reaction at P = 75 atm and three different conversion levels as a function of temperature (Reprinted with permission from [34]).

These results from thermodynamics prove that conversion levels can affect the extent to which CO and CO<sub>2</sub> hydrogenation will contribute in producing methanol. We could not show the same behavior using our results since not enough data points were available at a constant feed composition and the conversions did not vary much in orders



of magnitude. A similar result was reported by Liu *et al.* in their study in which they showed that hydrogenation of CO<sub>2</sub> was the primary reaction in producing methanol at low conversion [15].

### 5.3.2 Hydrogen Content in Feed

Grabow and Mavrikakis have reported that hydrogen content in the feed can have a marked effect on methanol production rates for CO rich feeds [34]. Methanol production rate decreases almost linearly with increasing CO<sub>2</sub> content in the feed when the feed is lean in H<sub>2</sub> (< 50 %). A similar trend was predicted by our model. Figure 13 shows a plot of methanol synthesis rate and % CO<sub>2</sub> in the feed under lean H<sub>2</sub> conditions.

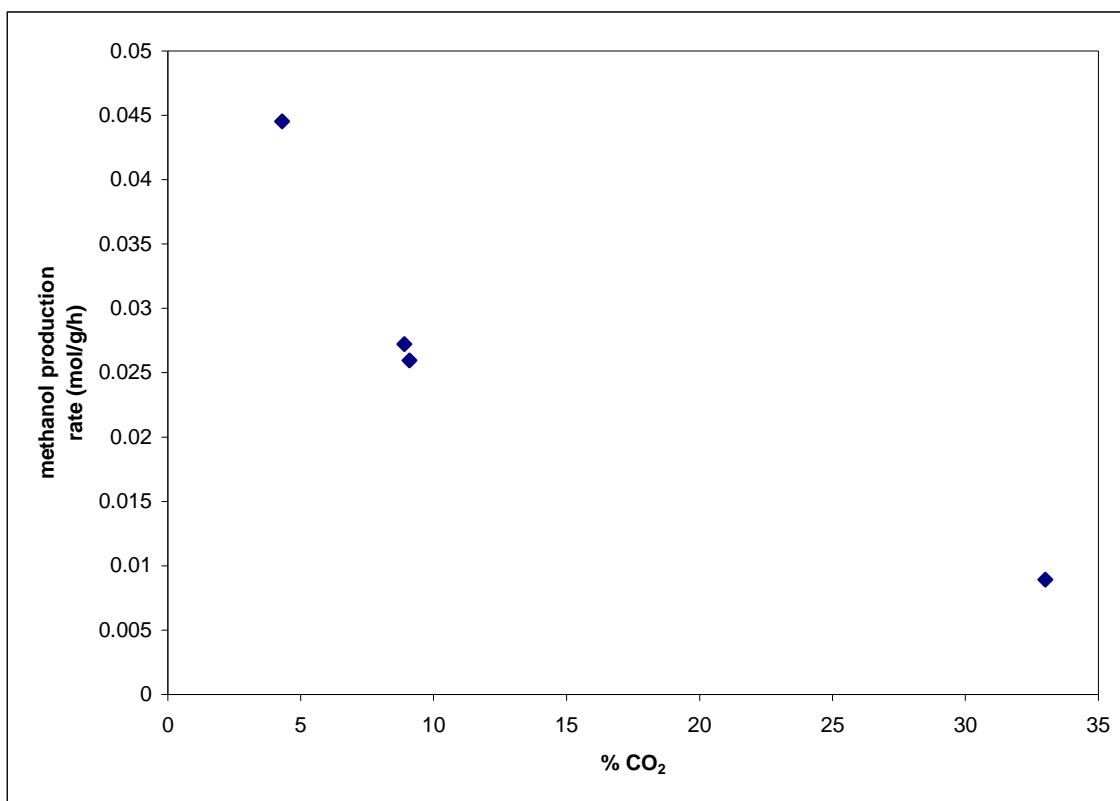


Figure 13. Plot of methanol synthesis rate and % CO<sub>2</sub> in the feed under lean H<sub>2</sub> conditions.

It was observed that the rate decreased linearly as CO<sub>2</sub> content in the feed increased. This behavior can be attributed the fact that hydrogenation of one mole of CO to methanol needs two moles of H<sub>2</sub> compared to CO<sub>2</sub> which needs three moles of H<sub>2</sub> to form methanol. Therefore, under lean hydrogen conditions, CO hydrogenation activity is increased. However, as CO<sub>2</sub> % in the feed increased, the overall rate decreased since CO hydrogenation was inhibited by increased amounts of CO<sub>2</sub> in the feed. Also, since there was no water in the feed in the beginning, CO<sub>2</sub> participated competitively in methanol synthesis as well as RWGS resulting in lower methanol production.

At a pressure of 50 atm, when hydrogen in the feed was increased slightly, the overall rate showed a maximum value at  $\text{CO}_2/(\text{CO}+\text{CO}_2) = 0.036$  (encircled in Figure 14) as predicted by the model developed in this study. Calverley and Smith reported similar results in their study. However, they observed the maxima when  $0.05 < \text{CO}_2/(\text{CO}+\text{CO}_2) < 0.2$  [35]. In our study, hydrogen content in the feed never increased beyond 60%. But at lower pressures (50 atm in our case), less hydrogen may be needed in the feed for the rate to increase with increasing CO<sub>2</sub> amounts. Figure 14 shows the overall rate plotted as function of CO<sub>2</sub> % at a pressure of 50 atm.

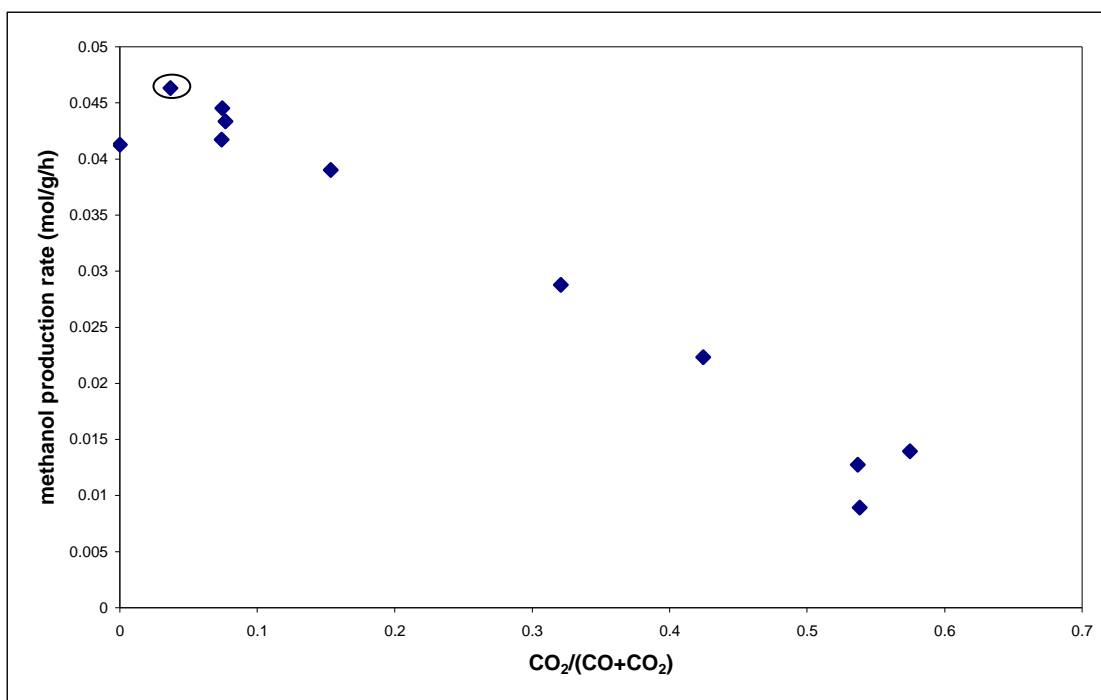


Figure 14. Plot of overall rate as function of % CO<sub>2</sub> at a pressure of 50 atm.

Therefore, at 50 atm and H<sub>2</sub> content of around 56% in the feed, overall methanol synthesis rate showed an increase in value as % CO<sub>2</sub> increased but it decreased again possibly due to adsorption of CO<sub>2</sub> on active Cu sites necessary for CO activation. This behavior showing maximum rate a particular value of CO<sub>2</sub> % has been reported by other authors as well like Klier *et al.* McNeil *et al.*, and Lim *et al.* [2, 14, and 18].

### 5.3.3 Pressure

Total pressure also affects the relative contribution from CO and CO<sub>2</sub> in producing methanol. Figure 15 shows the relative contribution of CO and CO<sub>2</sub> at a pressure of 50 atm calculated using the results from our model.

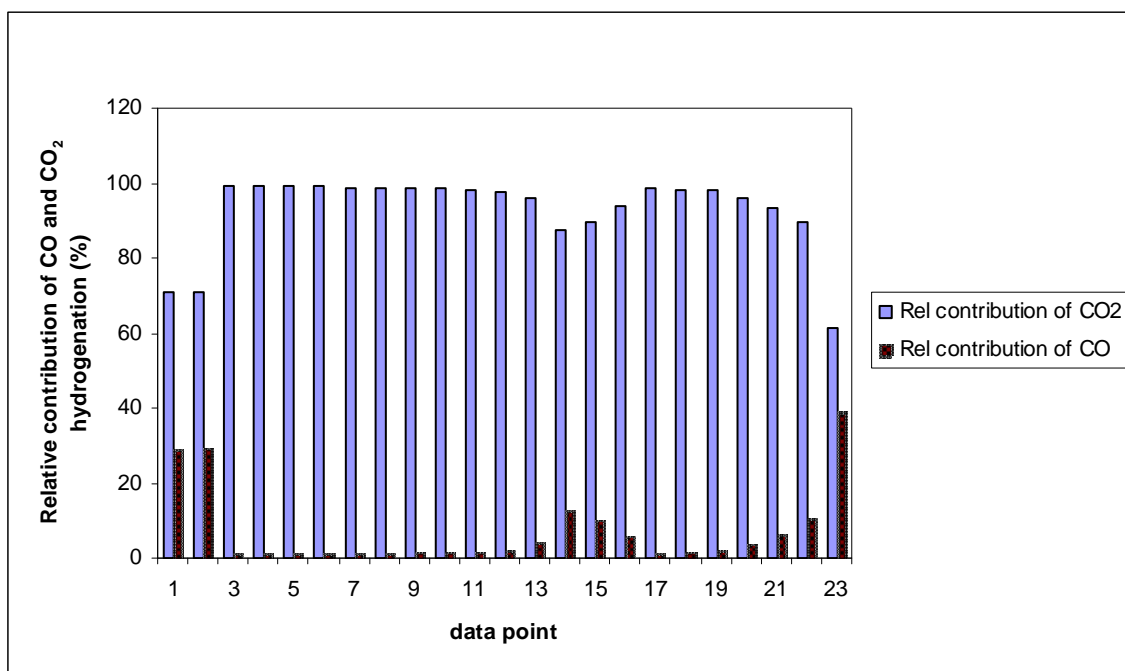


Figure 15. Plot of the relative contribution of CO and CO<sub>2</sub> at a pressure of 50 atm.

The plot clearly shows that CO<sub>2</sub> contributes more than CO to methanol production at a low pressure of 50 atm. A higher pressure of 99 atm was also reported in the experimental data. However, comparisons could not be made since there was insufficient number of data points where CO<sub>2</sub> was present in the feed and the pressure was high. The effect of pressure on the relative contribution of CO/CO<sub>2</sub> hydrogenation to methanol synthesis can be explained using Le Chatelier's principle. Le Chatelier's principle states that "if a chemical system at equilibrium experiences a change in concentration, temperature, volume or pressure, then the equilibrium shifts to counteract the imposed change and a new equilibrium is established [38]." During CO hydrogenation, three moles of CO react to form one mole of product, whereas, during CO<sub>2</sub> hydrogenation, four

moles of  $\text{CO}_2$  react to form two moles of product. When the pressure was high, CO hydrogenation was favored since it is the pathway which results in lower compression.

### 5.3.4 CO/ $\text{CO}_2$ Content in the Feed

Figure 16 shows a comparison between rates calculated from the combined model and those calculated from the CO hydrogenation model described in the previous sections when %  $\text{CO}_2$  in the feed was zero.

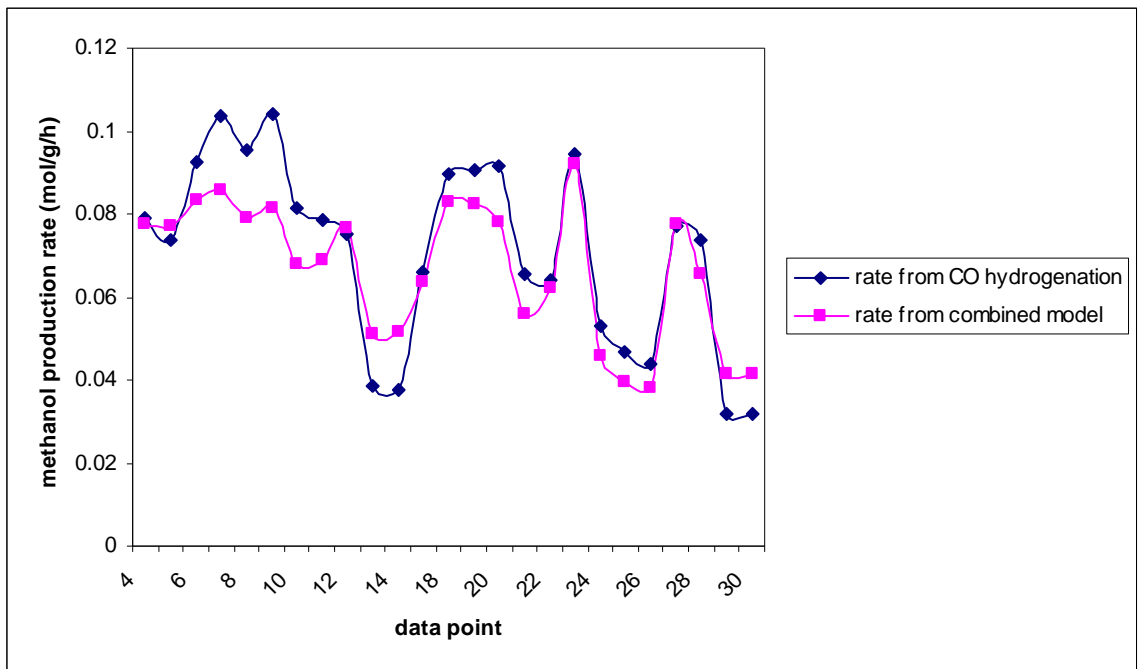


Figure 16. Plot of rates calculated from combined model and CO hydrogenation model when %  $\text{CO}_2$  in feed = 0.

The values of rates were quite close to each other suggesting the fact that in the absence of  $\text{CO}_2$ , the entire methanol was produced entirely from CO. The deviations could be a result of inadequate fitting of the models.

Results obtained from the combined model form the basis of studying a few trends related to methanol synthesis kinetics. Figure 17 shows overall rate plotted as a function of % CO in the feed in the absence of  $\text{CO}_2$ .

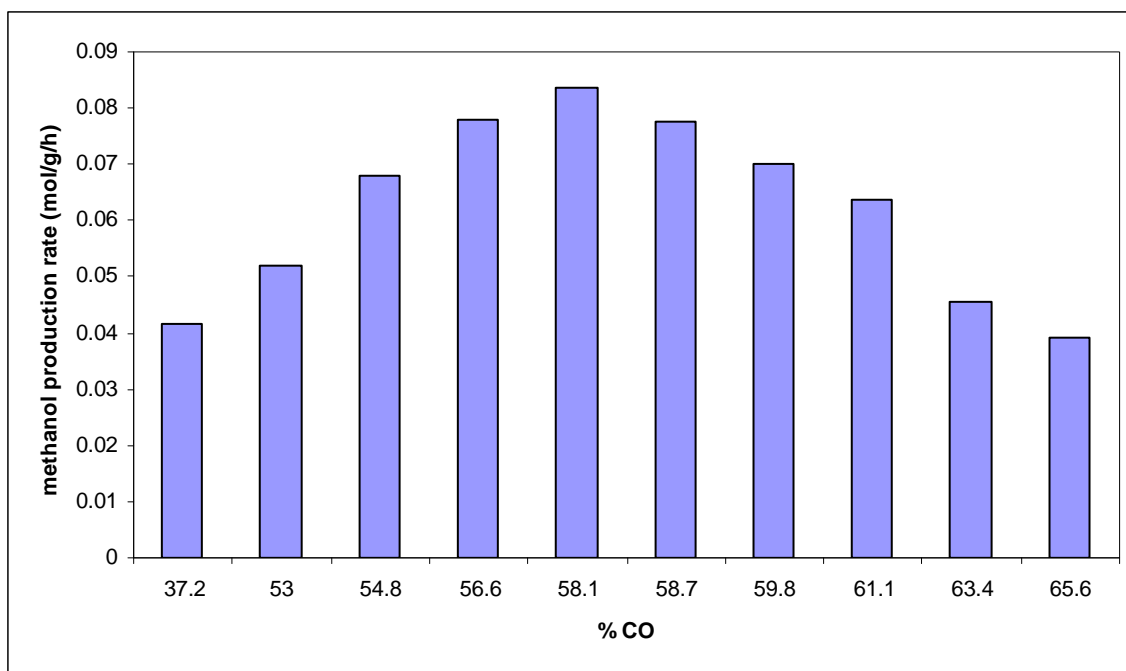


Figure 17. Plot of overall methanol synthesis rate as a function of % CO in feed when % CO<sub>2</sub> in feed = 0.

The rate increased as CO amount in the feed increased, while it decreased when % CO increased beyond 58 %. The increasing trend has also been shown by other authors, e.g., McNeil *et al.* [18], as shown in Figure 18.

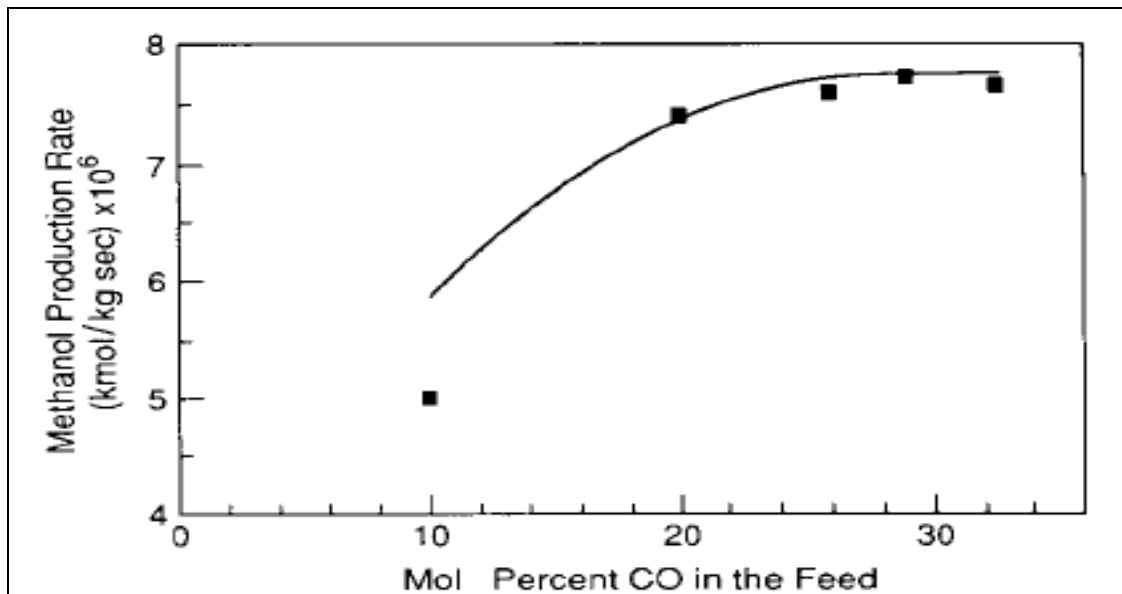
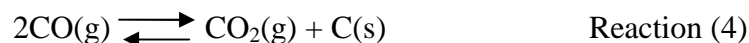


Figure 18. Predicted (-) compared to experimental (■) methanol production rate versus mole percent carbon monoxide in the feed at 513 K and 2.89/4.38 MPa (Reprinted with permission from [18]).

The decreasing trend can be explained by using the fact that in the absence of CO<sub>2</sub>, catalyst deactivation occurs via the Boudouard reaction resulting in carbon deposition and, therefore, decreasing methanol synthesis rate. The Boudouard reaction can be written as [39]:



As amount of CO increased, the reaction proceeded in the forward direction at a faster rate leading to more carbon deposition and fouling of the catalyst, and therefore, reducing methanol production rates. The volcanic shape of the plot shown in Figure 17 has also been reported by Grabow and Mavrikakis [34]. They observed a volcano-shaped curve when methanol production was plotted as a function of CO<sub>2</sub>/(CO+CO<sub>2</sub>) feed ratio for CO- rich feeds [34].

Another trend predicted by our model is that the contribution from CO hydrogenation to forming methanol decreased as % CO<sub>2</sub> increased. The relative contribution from CO hydrogenation in synthesizing methanol plotted as a function of % CO<sub>2</sub> is shown in Figure 19.

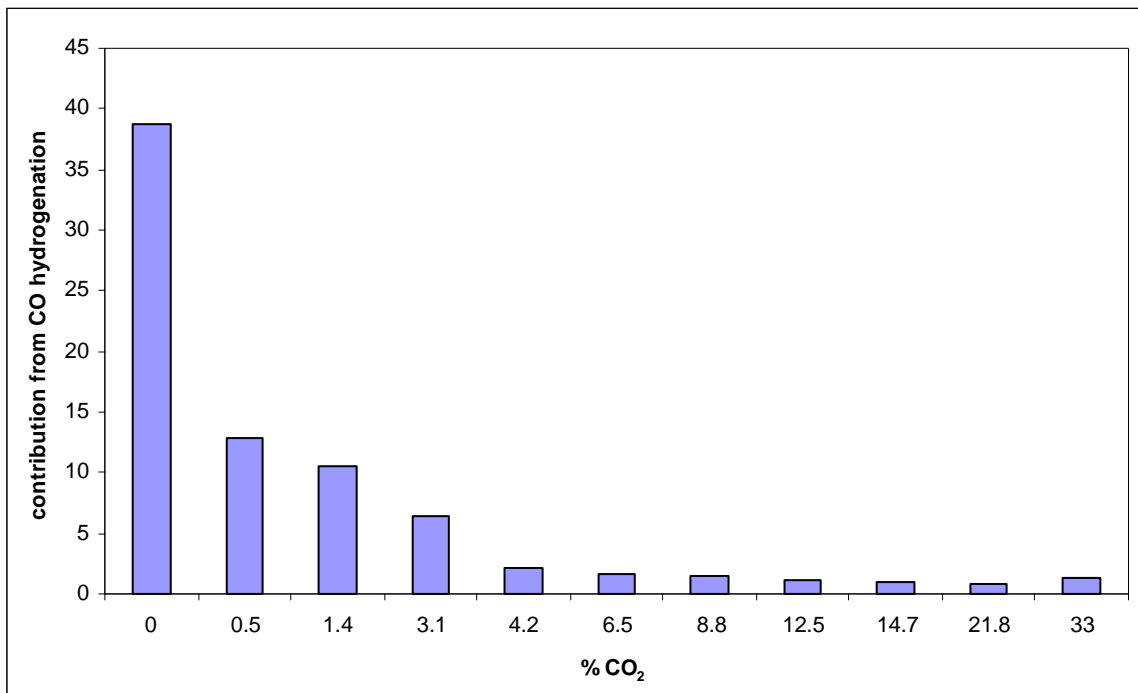


Figure 19. Plot of relative contribution of CO hydrogenation vs. % CO<sub>2</sub> in the feed.

The plot shows expected behavior since a high CO<sub>2</sub> content can lead to inhibition of CO hydrogenation due to the strong adsorption of CO<sub>2</sub> on active Cu sites necessary for CO activation.

It has been predicted by our model that the major fraction of methanol resulted from CO<sub>2</sub> hydrogenation, as shown in Figure 20.



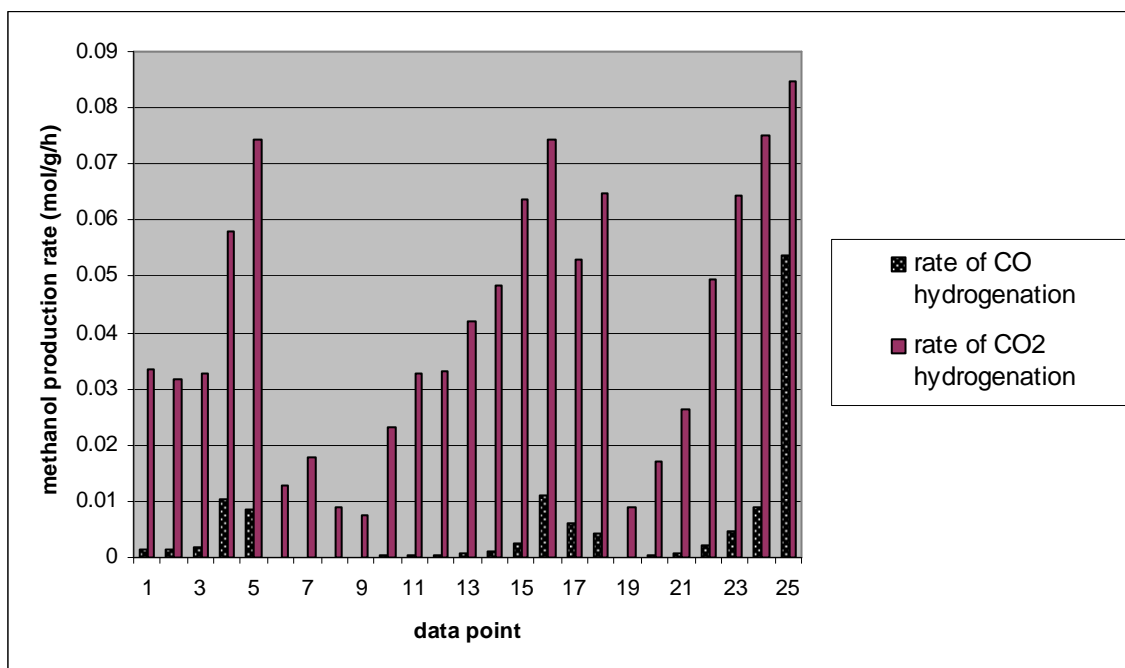


Figure 20. Comparison of CO and CO<sub>2</sub> hydrogenation rate.

Sahibzada *et al.* also showed that the intrinsic rate of CO<sub>2</sub> hydrogenation was twenty times faster than CO hydrogenation and at CO<sub>2</sub> > 1%, it was the main source of methanol production [21]. This aspect was also studied by Grabow and Mavrikakis who showed that larger fraction of methanol was formed from CO<sub>2</sub>. However, they used a different feed composition [34].

#### 5.4 Summary

Based on the regression results from POLYMATH, the combined model proposed in this study was selected to be the best fit kinetic model that describes methanol synthesis kinetics most appropriately. Predictions from this model have been successfully used to explain the trends related to methanol synthesis kinetics. It can be concluded that no generalization can be made regarding the carbon source in methanol.

Instead, the relative contribution of CO/CO<sub>2</sub> hydrogenation in methanol production depends on various reaction conditions like conversion, pressure, CO/CO<sub>2</sub>, and hydrogen content in the feed. Therefore, experimental data and results should be cautiously extrapolated and interpreted from low pressure/low conversion laboratory conditions to high pressure/high conversion industrial conditions.

## CHAPTER 6

### CONCLUSION

This study comprised of investigating various kinetic models proposed in literature for methanol synthesis and selecting the most appropriate model using regression techniques. POLYMATH software was the non-linear regression tool used in fitting different models to published experimental data collected at a temperature of 558 K and pressures of 50 and 100 atm over a Cu/ZnO/Cr<sub>2</sub>O<sub>3</sub> catalyst. The results of fitting revealed that the combined model including both CO and CO<sub>2</sub> hydrogenation rate terms was the best fit model, thereby confirming the hypothesis made in this research. A kinetic model like this one that can describe methanol synthesis kinetics satisfactorily can prove to be very useful in kinetic studies of methanol leading to a better understanding of the process and improvements in yields and profits.

Kinetic aspects of methanol synthesis, primarily the relative contribution of CO and CO<sub>2</sub> hydrogenation in producing methanol was also studied based on the results predicted by the best fit kinetic model developed in this work. The results suggest that no generalization can be made regarding the more dominant reaction pathway. Instead, the contribution from each hydrogenation pathway depends on reaction conditions like conversion, pressure, CO/CO<sub>2</sub>, and hydrogen content in the feed. Methanol production can be maximized by optimizing these conditions. However, it is recommended to carefully interpret experimental data and extrapolate results from low pressure/low conversion laboratory conditions to high pressure/ high conversion industrial conditions when studying the relative importance of CO<sub>2</sub> and CO hydrogenation reactions. Owing

to the industrial importance of methanol, there will always be a scope to improve the productivity of the process. Therefore, further studies should be conducted in order to reveal more information regarding the kinetic aspects of methanol synthesis.

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## Appendix A

### ADDITIONAL DATA

The experimental results reported by Calverley are listed in Table A.1. The reported results included pressure, feed flow rate, catalyst weight, inlet mole fraction for CO, H<sub>2</sub>, methanol and CO<sub>2</sub> and the outlet mole fraction of methanol for a total of 51 runs.

Table A.1. Experimental results published by Calverley (Reprinted with permission from [35]).

Run #	Feed flow rate (mol/h)	Pressure	Catalyst mass	Mole fraction in feed				exit mole fraction
				CO	H <sub>2</sub>	CH <sub>3</sub> OH	CO <sub>2</sub>	CH <sub>3</sub> OH
1	1.834	99.7	1.56	0.482	0.312	0.019	0.089	0.0725
2	1.799	99.7	1.56	0.491	0.318	0	0.091	0.0656
3	1.799	99.7	1.56	0.491	0.318	0	0.091	0.0618
4	1.828	99.7	1.56	0.587	0.311	0.019	0	0.0492
5	1.793	99.7	1.56	0.598	0.317	0	0	0.0414
6	2.709	99	1.56	0.581	0.309	0	0	0.03
7	2.709	99	1.56	0.581	0.309	0	0	0.0285
8	2.786	99	1.56	0.566	0.301	0.027	0	0.0455
9	2.786	99	1.56	0.566	0.301	0.027	0	0.0433
10	2.874	99.7	1.56	0.548	0.293	0.053	0	0.0664
11	2.874	99.7	1.56	0.548	0.293	0.053	0	0.0654
12	1.774	99.7	1.56	0.58	0.317	0	0	0.0402

Run #	Feed flow rate (mol/h)	Pressure	Catalyst mass	Mole fraction in feed				exit mole fraction
				CO	H <sub>2</sub>	CH <sub>3</sub> OH	CO <sub>2</sub>	CH <sub>3</sub> OH
13	1.8	99.7	1.56	0.54	0.323	0	0	0.0607
14	1.833	99.7	1.56	0.53	0.317	0.018	0	0.0673
15	1.81	97.6	1.57	0.57	0.322	0	0.043	0.0415
16	1.807	97.6	1.57	0.419	0.501	0	0.042	0.0586
17	1.805	97.6	1.57	0.611	0.273	0	0	0.0332
18	2.709	99	1.57	0.581	0.309	0	0	0.0306
19	2.714	98.3	1.57	0.583	0.307	0.006	0	0.0329
20	2.786	99	1.57	0.566	0.301	0.027	0	0.0463
21	1.81	98.3	1.57	0.657	0.226	0	0	0.0252
222	1.793	84.7	1.57	0.556	0.32	0	0	0.0308
23	1.839	84.7	1.57	0.407	0.504	0	0	0.0426
24	1.839	84	1.57	0.634	0.227	0	0	0.0192
25	2.412	70.4	1.57	0.656	0.235	0	0	0.0144
26	2.431	70.4	1.57	0.651	0.233	0.008	0	0.0183
27	1.851	98.3	1.56	0.554	0.327	0	0	0.0391
28	1.851	84.7	1.56	0.554	0.327	0	0	0.0296
29	0.959	50	1.56	0.372	0.548	0	0	0.0298
30	0.959	50	1.56	0.372	0.548	0	0	0.0308

Run #	Feed flow rate (mol/h)	Pressure	Catalyst mass	Mole fraction in feed				exit mole fraction
				CO	H <sub>2</sub>	CH <sub>3</sub> OH	CO <sub>2</sub>	CH <sub>3</sub> OH
31	0.965	50	1.56	0.243	0.558	0	0.147	0.0383
32	0.965	76	1.56	0.243	0.558	0	0.147	0.0787
33	0.965	50	1.56	0.243	0.558	0	0.147	0.0351
34	0.981	50	1.56	0.188	0.553	0	0.218	0.0254
35	1.03	50	1.56	0.283	0.326	0	0.33	0.0127
36	0.964	50	1.56	0.272	0.571	0	0.125	0.0393
37	0.934	50	1.56	0.297	0.57	0	0.088	0.0446
38	0.932	50	1.56	0.297	0.57	0	0.088	0.0432
39	0.937	50	1.56	0.33	0.571	0	0.065	0.0505
40	0.961	50	1.56	0.346	0.557	0	0.049	0.0496
41	0.959	50	1.56	0.362	0.568	0	0.02	0.0532
42	0.949	50	1.56	0.387	0.567	0	0.005	0.0457
43	1.8	99.7	1.56	0.533	0.331	0	0.043	0.0619
44	3.306	50	1.56	0.35	0.561	0	0.028	0.0211
45	3.306	50	1.56	0.165	0.583	0	0.223	0.0102
46	3.306	50	1.56	0.217	0.576	0	0.16	0.0126
47	3.306	50	1.56	0.252	0.578	0	0.119	0.0138
48	3.345	50	1.56	0.342	0.569	0	0.062	0.0182

Run #	Feed flow rate (mol/h)	Pressure	Catalyst mass	Mole fraction in feed				exit mole fraction
				CO	H <sub>2</sub>	CH <sub>3</sub> OH	CO <sub>2</sub>	CH <sub>3</sub> OH
49	3.421	50	1.56	0.372	0.559	0	0.031	0.0191
50	3.342	50	1.56	0.367	0.569	0	0.014	0.0186
51	3.381	50	1.56	0.382	0.559	0	0	0.0089

The information given in Table A.1 was used to predict the exit gas composition and the partial pressure of each species using material balance calculations.

The reactor was operated in integral mode during the experiments. Therefore, the following procedure was used to calculate the rates:

- At a given temperature and pressure, conversion for each run was calculated using the inlet and outlet composition of reactant, CO. Conversion is calculated using the following expression:

$$X_A = 1 - \frac{F_A}{F_{A_0}}$$

where,

$X_A$  = conversion

$F_{A_0}$  = inlet molar flow rate of reactant

$F_A$  = outlet molar flow rate of reactant

- The ratio of catalyst weight to inlet molar flow rate of CO was also computed
- For a PFR, the rate equation can be written as,

$$-r_A = \frac{F_{A_0} dX_A}{dW} \quad \text{Equation A.1}$$

or

$$-r_A = \frac{dX_A}{d\left(\frac{W}{F_{A_0}}\right)} \quad \text{Equation A.2}$$

where,

$-r_A$  = rate of reaction

$F_{A_0}$  = inlet molar flow rate of reactant

$W$  = catalyst weight

$X_A$  = conversion

- $X_A$  was plotted as a function of  $W/F_{A_0}$  and a curve was fit through the points, with the curve passing through the origin.
- The rates were then calculated by finding the slope of the curve at each data point.

The polynomial function obtained was differentiated to give reaction rates at the corresponding value of conversion. The plot of  $X_A$  vs.  $W/F_{A_0}$  is shown in Figure A.1. As shown in the graph, the curve fits to the data points satisfactorily with an  $R^2$  value of 0.81.

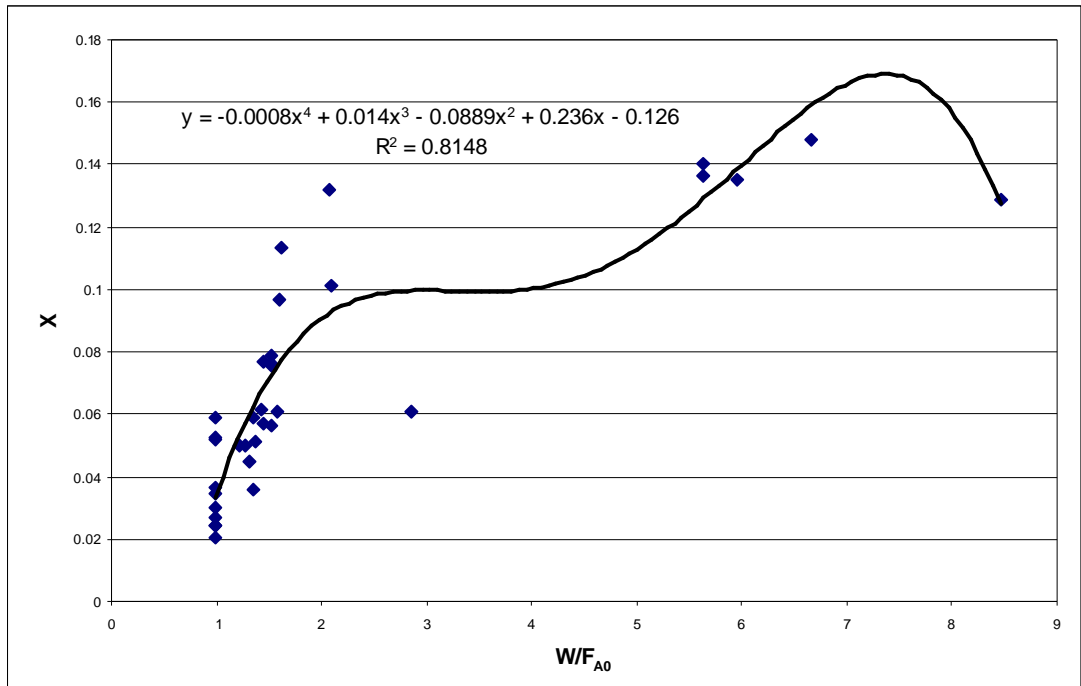


Figure A.1 Conversion plotted as a function of  $W/F_{A0}$ .

- A fourth order polynomial describes the curve and can be written as

$$X = -0.0008TF^4 + 0.014TF^3 - 0.0889TF^2 + 0.236TF - 0.126 \quad \text{Equation A.3}$$

TF is the turnover frequency, used interchangeably for  $W/F_{A0}$ .

- Differentiating this polynomial, we get

$$\frac{dX}{dTF} = 0.236 - (2 * 0.0889) * TF + (3 * 0.014) * TF^2 - (4 * 0.0008) * TF^3 \quad \text{Equation A.4}$$

Rates are obtained by finding the above mentioned differential at each value of conversion. The calculated values of rates are shown in Table 2 in Section 4.2.

## Appendix B

### ADDITIONAL RESULTS

Experimental data including a range of low and high inlet CO<sub>2</sub> partial pressures was used in the regression procedure. The model proposed by Graaf was fit to the low CO<sub>2</sub> inlet partial pressure data and that proposed by Rozovskii was fit to the data with high CO<sub>2</sub> content in the feed. As already explained in Section 4.4, residual plots show the deviation between the experimental values and the corresponding values calculated from the models. For a good fit, the residuals should be randomly distributed and not follow a clear trend around the line of  $\text{err} = 0$ . The residual plots generated as a result of fitting Graaf's and Rozovskii's models to the kinetic data are shown in Figures B.1 and B.2.

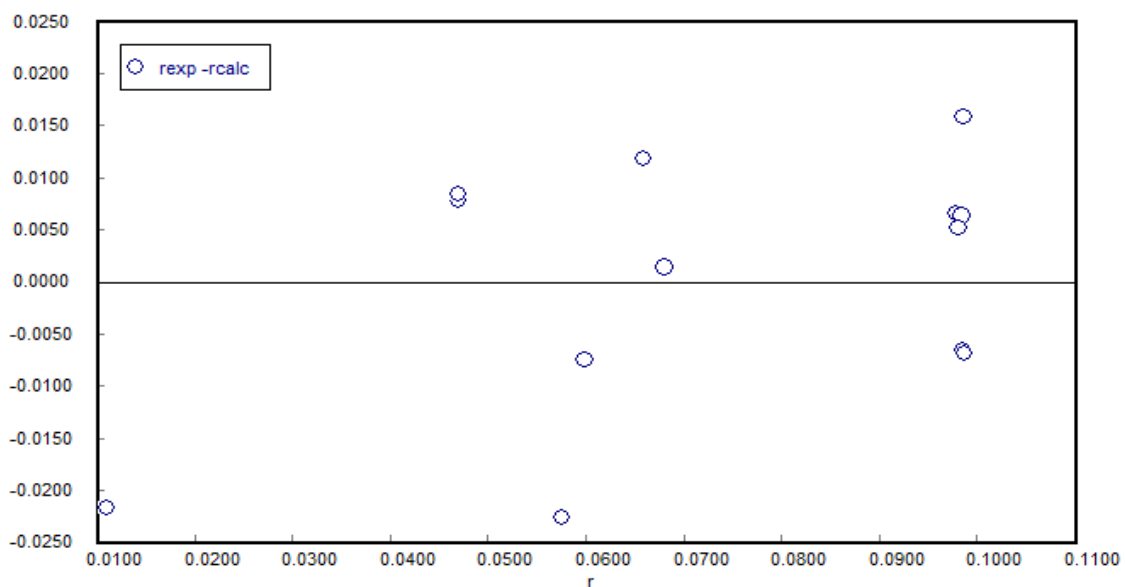


Figure B.1. Residual plot generated by fitting Graaf's model to low CO<sub>2</sub> inlet partial pressure data.

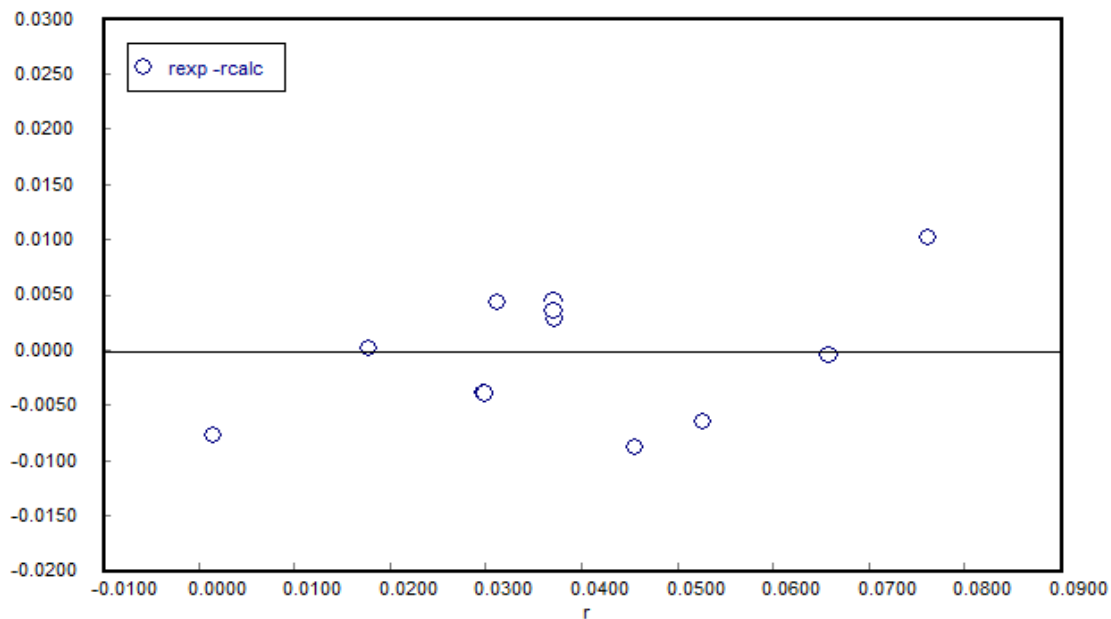


Figure B.2. Residual plot generated by fitting Graaf's model to low CO<sub>2</sub> inlet partial pressure data.

As shown in the Figures B.1 and B.2, the residuals were distributed in a random manner around the line of  $err = 0$  and did not follow a clear trend indicating the goodness of fit of the two models. The polymath reports for the same regression models are shown in Tables B.1 and B.2 displaying the statistical features of the regression.



Table B.1. Polymath report generated by fitting Graaf's model to low CO<sub>2</sub> inlet partial pressure data.

<b>POLYMATH Report</b>	No Title
Nonlinear Regression (L-M)	21-Nov-2011

**Model:**  $r = (k \cdot K_{co} \cdot (p_{co} \cdot p_{h_2}^{1.5} - p_m / (p_{h_2}^{0.5} \cdot 0.000388))) / ((1 + K_{co} \cdot p_{co} + K_{co}^2 \cdot p_{co}^2) \cdot (p_{h_2}^{0.5} + (K_{wh}) \cdot p_{h_2}^2))$

Variable	Initial guess	Value	95% confidence
k	0.1	0.0535024	6.141E-05
Kco	0.01	0.0022467	2.907E-06
Kco2	0.001	0.0184968	0.0066304
Kwh	10.	1011.	4.803157

**Nonlinear regression settings**

Max # iterations = 64

**Precision**

R <sup>2</sup>	0.8149573
R <sup>2</sup> adj	0.7532763
Rmsd	0.0032336
Variance	0.0001963

**General**

Sample size	13
Model vars	4
Indep vars	5
Iterations	29

Table B.2. Polymath report generated by fitting Rozovskii's model to high CO<sub>2</sub> inlet partial pressure data.

<b>POLYMATH Report</b>	No Title
Nonlinear Regression (L-M)	21-Nov-2011

**Model:**  $r = \frac{(k \cdot K_{co} \cdot (p_{co} \cdot p_{h_2}^{1.5} - p_m / (p_{h_2}^{0.5} \cdot 0.000388)))}{(1 + K_{co} \cdot p_{co} + K_{co}^2 \cdot p_{co}^2) \cdot (p_{h_2}^{0.5} + (K_{wh}) \cdot p_{h_2}^2)}$

Variable	Initial guess	Value	95% confidence
k	0.1	0.0535024	6.141E-05
Kco	0.01	0.0022467	2.907E-06
Kco2	0.001	0.0184968	0.0066304
Kwh	10.	1011.	4.803157

**Nonlinear regression settings**

Max # iterations = 64

**Precision**

R <sup>2</sup>	0.8149573
R <sup>2</sup> adj	0.7532763
Rmsd	0.0032336
Variance	0.0001963

**General**

Sample size	13
Model vars	4
Indep vars	5
Iterations	29

The residual plot generated as a result of fitting the combined model to the entire range of data is shown in Figure B.3. The polymath report of the same regression is shown in Table B.3.

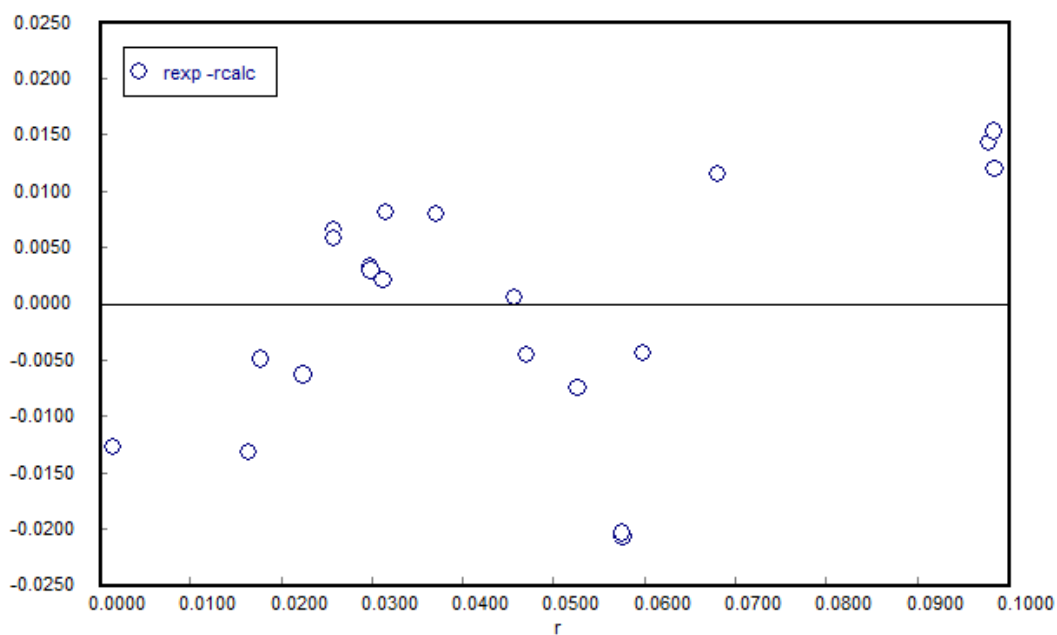


Figure B.3. Residual plot generated by fitting combined model to entire range of kinetic data.

The residuals as shown in Figure B.3 are randomly distributed and no clear trend was observed suggesting the combined model represents the kinetic data appropriately.

Table B.3. Polymath report generated by fitting combined model to entire range of kinetic data.

**POLYMATH Report** No Title  
 Nonlinear Regression (L-M) 21-Nov-2011

**Model:**  $r = (k \cdot \text{ph}_2 \cdot (1 - (\text{pm} \cdot \text{ph}_2 / (0.000077 \cdot \text{ph}_2^3 \cdot \text{pco}_2)))) / (1 + \text{Kh}_2\text{o} \cdot \text{ph}_2 + (\text{Kh}_2\text{o} \cdot \text{ph}_2 / \text{Kco}_2 \cdot \text{pco}_2)) + (k_1 \cdot \text{Kco} \cdot (\text{pco} \cdot \text{ph}_2^{1.5} - \text{pm} / (\text{ph}_2^{0.5} \cdot 0.000388))) / ((1 + \text{Kco} \cdot \text{pco} + \text{KCO}_2 \cdot \text{pco}_2) \cdot (\text{ph}_2^{0.5} + (\text{Kwh}) \cdot \text{ph}_2))$

Variable	Initial guess	Value	95% confidence
k	0.001	0.0009681	2.729E-06
Kh2o	0.01	0.0032128	6.479E-05
Kco2	0.01	0.0226146	0.0004574
k1	0.01	0.0231806	4.222E-05
Kco	0.001	0.0024066	4.973E-06
KCO2	0.01	0.0624938	0.0015774
Kwh	0.1	11.09971	0.4651571

**Nonlinear regression settings**

Max # iterations = 64

**Precision**

R <sup>2</sup>	0.8501624
R <sup>2</sup> adj	0.7859462
Rmsd	0.0022748
Variance	0.000163

**General**

Sample size	21
Model vars	7
Indep vars	5
Iterations	17

The statistical information displayed in Table B.3 also indicated that the combined model was a statistically sound model.