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# Empirical Knock Model for Automatic Engine Calibration

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<i>Title and subtitle</i> <b>Empirical Knock Model for Automatic Engine Calibration (Emperisk knackningsmodell för automatisk motorkalibrering)</b>			
<i>Abstract</i> <p>Engine knock is an undesired phenomenon in spark ignited internal combustion engines; such as a gasoline engine running the Otto cycle. Knocking originates from abnormal combustions at timings other than those decided by controlled ignition. Individual abnormal combustions of this type is also referred to as auto-ignition. Knocking is not only a limitation on engine efficiency and thus of environmental concern too but also a destructive force, increasing engine wear-down. Current research of interest aim for an automatic engine calibration system. One part of calibration would be to find the knock boundary in engine operating condition space, so that when tuning an engine, it is guaranteed to stay within the boundary. This thesis describes a method to find the knock boundary by the use of an empirical knock model based on the Arrhenius equation, calculations of unburned gasoline air mixture temperatures by a temperature mean value approach and the use and improvement of a model parameter called the <i>K</i>-value</p>			
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*“So long, and thanks for all the fish” – D.A.*

*Per Ganestam – Susono, August 2010*

# 1. Introduction

## 1.1 A History with Knock

In the advent of automotive development the knock phenomena were common in spark ignition (SI) engines. In fact, it was so common that it was believed to be a part of the normal combustion. In the 1930s the automotive and petroleum industries in the United States had realized that knocking acted as a limitation on engine efficiency and a great deal of research was conducted to standardize the knock limit of a given fuel. This research resulted in two kinds of octane number named the motor method and the research method. Both determine – in slightly different ways – how tolerable a fuel is to knock. In Europe, and typically in Sweden, the most common fuel is lead free 95-octane by the research method. The octane number research used Cooperative Fuel Research (CFR) engines which run under highly controlled conditions.

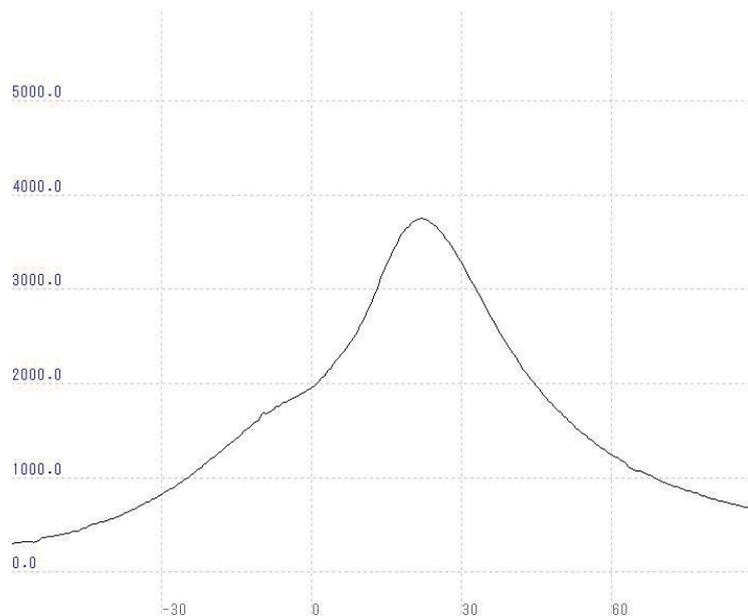


Figure 1.1: Pressure trace history from a well performing engine cycle with the y-axis as pressure and the x-axis as crank angle degrees.

With variable compression ratio – a specific feature of the CFR engine – octane numbers are determined by comparing the fuel ignition time delay – time between spark and start of combustion – with two predefined reference fuels of octane number 0 and 100. Even though octane numbers describe how resilient a fuel is against knock, the complete physical in-cylinder phenomena during combustion in an SI engine is complex and the octane number alone can not provide the information necessary to decide when and why knocking occur.

Engine knock is considered to be one main reason of increased engine wear down. It has been proved experimentally that engines running under knocking conditions tend to have more erosion on the piston close to the first piston ring than well tuned and well performing engines (Johansson, 2006). There is also the risk that eroded particles mixed with the lubricating oil increase friction in other parts of the engine, grinding metal until the particles are cleaned up by the oil filter. Engines running with heavy knock might even suffer immediate failure due to the high level of mechanical stress – higher than the designed tolerance of some engine components – due to pressure oscillations. In modern concepts of engines, down-sizing among others, aim to increase fuel efficiency. Down-sizing is an example where more fuel efficient turbo-charged engines with reduced size work under higher pressures. Unfortunately down-sizing have the disadvantage of being highly limited by knock. These limiting properties of knock showed for the importance of understanding auto-ignition – the actual abnormal combustion that creates the metallic knocking sound – in detail. Modeling knock has proved to be a daunting task and a continuous increase of research in the area has been conducted since the late 1950s.

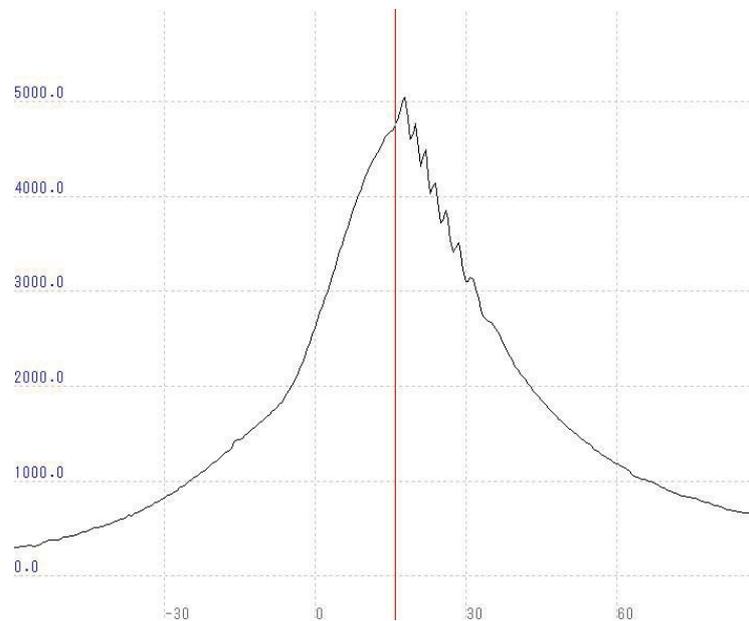


Figure 1.2: Pressure trace history from a heavy knocking cycle with the vertical line marking onset of knock. The y-axis is pressure and the x-axis is in crank angle degrees.

## 1.2 The Knock Phenomena

Ideal combustion starts with controlled ignition, usually somewhere around 10–40 crank angle degrees (CAD) before top dead center (BTDC). The choice of spark advance depends on, for example, engine speed and load, for maximum efficiency to be maintained. Pressure and temperature rise smoothly as the flame front propagates through the cylinder with a turbulent surface much larger than one of spherical shape. At optimal combustion, peak pressure is positioned a few crank angle degrees after top dead center (ATDC) in order to deliver maximum mechanical work on the piston as hot gas expands within the cylinder. Probabilities of auto-ignition in an SI engine increase as the operating conditions tend towards what is considered optimal combustion, and is closely related to spark advance. After ignition, as the turbulent flame propagates inside the cylinder and away from the spark plug consuming the fuel charge; pressure and temperature of the end gas – unburned fuel-air mixture ahead of the flame front – increase. If pressure and temperature in the unburned zone are too high during a too long time – for at least as long as the fuel time delay – a pocket of end gas in front of the flame might reach its critical state of combustion reactions before the fuel charge is completely consumed.

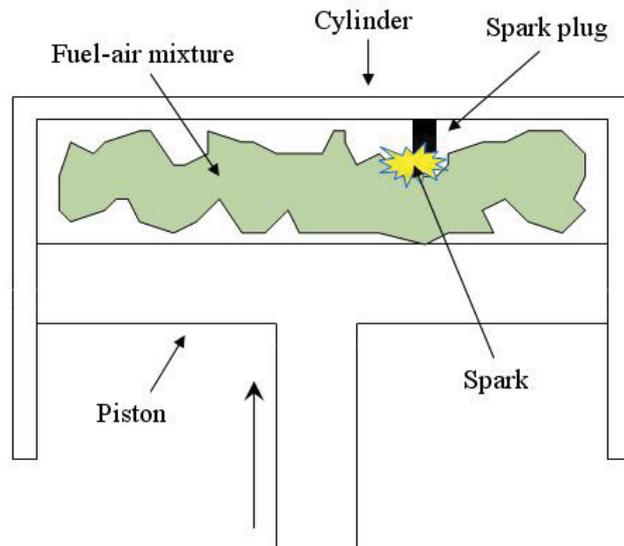


Figure 1.3: A normal combustion ignited from the spark plug.

Then the end gas might auto-ignite and thus generate a rapid rise in temperature and pressure. Auto-ignition creates a shockwave traveling through the cylinder with supersonic speed until it settles as a stationary wave with frequencies usually similar to the first harmonic of the cylinder. In normal sized engines the frequency of the first harmonic is somewhere in the range 3–10 kHz resulting in the metallic knocking sound from the engine that can be heard by human ears, hence the name knocking. Amplitudes of the pressure oscillations are generally proportional to the mass fractions of unburned fuel charge contained in the end gas. Pressure oscillations are the

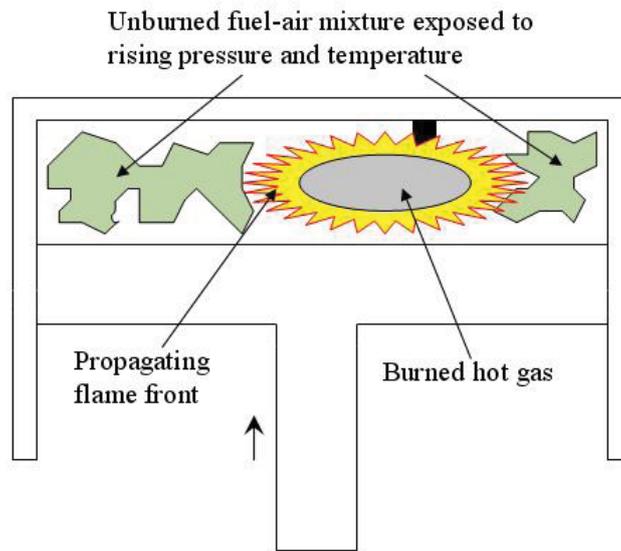


Figure 1.4: Rising pressure and temperature in the end gas as the flame front propagates through the cylinder.

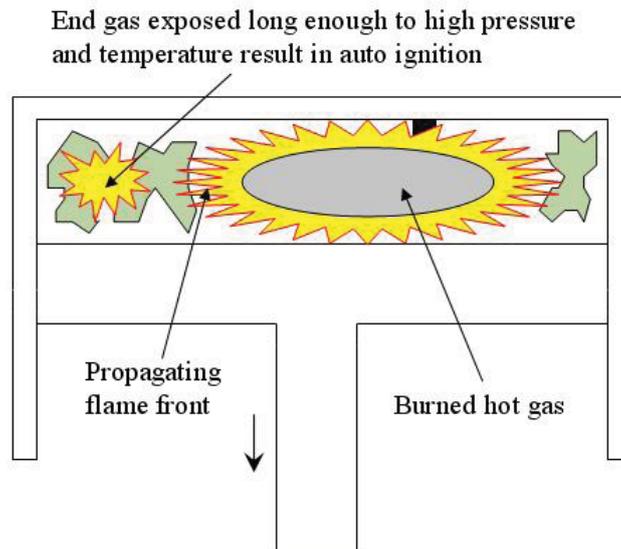


Figure 1.5: Once pressure and temperature exposure is long enough, the end gas auto ignites

typical characteristics of a knocking cycle and it is easy to recognize their pattern in a cycle's pressure trace history.

Auto-ignition is more common at lower speeds and, of course, at higher loads. Increased knocking at lower speeds might seem contra intuitive but makes perfect sense. In order to maintain constant charging efficiency at low speeds compared to

high speeds, each cycle needs to burn more fuel during a longer time – seconds, not crank angle degrees – resulting in more fuel at higher temperatures and pressure during a longer time. In other words, fewer combustions but each with larger explosions. These are precisely the criteria for auto-ignition to occur.

### 1.3 Previous Work

Different auto-ignition models developed over the years can be classified in the groups of detailed chemical kinetic models (Errico et al., 2007), reduced chemical kinetic models (Noda et al., 2004) and empirical models based on the Arrhenius equation (Kawai et al., 2009)(Douaud and Eyzat, 1978)(Elmqvist et al., 2003)(By et al., 1981)(Worret et al., 2002). The chemical kinetic models are extremely complicated and details of hundreds of sub-reactions of the species used must be taken into account to achieve accuracy. Due to the complexity of these models they are not suited for fast simulations or online calculations. They are also highly dependent on what fuel is used which reduce their general applicability. Empirical models based on the Arrhenius equation have proved to be able to predict onset of knock in simulations within a few crank angle degrees. They are flexible and it is possible to increase model complexity step-wise as needs of more general use and higher precision increase. Modern research using and developing similar models often refer to work made by Douaud and Eyzat (Douaud and Eyzat, 1978) and their findings of parameter correlations. The same goes for this work where their research lay out the base line of auto-ignition modeling.

### 1.4 Motivation

As already mentioned, knocking is more than just a ticking noise. It reduce engine efficiency, hence knocking is also of environmental concern. In the case of light knocking, it contributes to wear-down of the engine and in the case of heavy knocking; immediate engine failure might cause more than just material damage.

Calibration of engines under development, to acquire optimal fuel efficiency and minimal emissions and wear down, is a time-consuming task and an automated calibration system is a current target of research. One part of calibration would be to figure out at what spark advance the knock boundary of an engine running under any given operating conditions is. Also, during the early stages of engine development, it is important to know – even roughly – where the knock boundary is so that experiments can be made without risk of damaging neither engineers nor equipment.

The empirical knock model based on the Arrhenius equation is motivated due to its simplicity, generality and physical interpretation.

## 1.5 Objectives

Investigate the possibility of using an empirical knock model based on the Arrhenius equation in engine calibration. The goal is not only to determine onset of knock but also being able to find the knock boundary with minimal human interference.

## 1.6 Outline

In chapter 2, experiments made and methods of data gathering are explained. Chapter 3 subsequently describes the three main parts of modeling: knock model, temperature models and the  $K$ -value. Chapter 4 describes and discusses methods of predicting and usage of the model. Chapter 5 discuss the results and future of the described methods and model. Brief explanations of model implementation and genetic algorithms can be found in appendix A and B.

## 1.7 Methods and Tools

The main tool used for all modeling and programming is MATLAB. All experimental data from the engine test bench are gathered with DS-0228 real-time cycle measuring equipment developed by ONO SOKKI. Also, DS-0228 calculates heat release and exports pressure data via Microsoft Office Excel to MATLAB. Detecting knock and calculating knock probabilities at different engine operating conditions is done with TTDC<sup>1</sup> developed Panel 3. In addition, Panel 3 also present data about charging efficiency and absolute fuel charge injected per stroke. Experiments are conducted on a Toyota V6 SI gasoline engine and the same engine is used during all experiments. Unless something else is mentioned, throughout the thesis pressures are measured in kilopascal [kPa] and temperatures in Kelvin [K].

## 1.8 Limitations

Experiments at the test bench are limited to run the engine at no higher speeds than 1800 revolutions per minute (RPM). The reason is safety, towards both personnel and equipment. However this limitation also reduces the validation space of the model and the results can only be presented within the span of speeds 1000–1800 RPM. All experiments and validations are made on the same engine which also limits the knowledge of general use of the model. Throughout the thesis only spark ignition internal combustion engines running the Otto cycle are considered.

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<sup>1</sup>TOYOTA TECHNICAL DEVELOPMENT CORPORATION

## 2. Experiments

The experimental setup contains of a test bench with a Toyota developed V6 engine type 2GR-FSE and an AVL developed high performance piezo-electric pressure sensor (model GU12P) mounted inside one of the cylinders. Pressure cycles are measured with a sample size of one crank angle degree and recorded in real-time with DS-0228. A separate system – Panel 3 – with conventional knock detection is used to gather knocking statistics to determine a measured knock boundary for model calibration and validation. Both intake pressures and intake temperatures are measured in the surge tank, after the throttle and just before the intake manifold. A dynamometer connected to the engine controls engine speeds by increasing the load as more efficient spark advances yield higher torques. To reduce measurement discrepancies, no variable valve timings are used and the intake valve is closed at 31 CAD after bottom dead center (ABDC). Inside the engine room underneath the engine is a microphone, connected to a monitor in the control room, used to listen for engine knock. All experiments use the same fuel, 96 RON (research octane number).

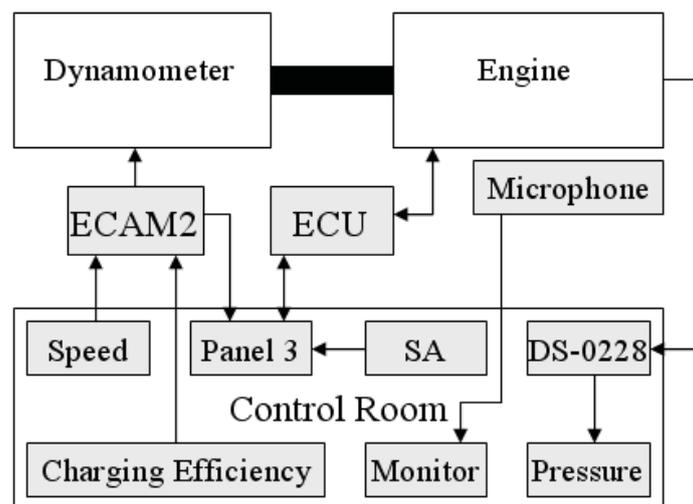


Figure 2.1: Experimental test bench setup. ECU is the engine control unit and ECAM is a controller and servo that set the throttle angle.

The following table describes the engine characteristics:

Engine Geometry	
Compression ratio	11.8
Bore	94 mm
Stroke	83 mm
Connecting rod	147.5 mm
Piston offset	0.5 mm

Table 2.1: Engine geometry.

All experiments follow the same procedure:

- Warm up the engine so that engine conditions are similar in both the beginning and at the end of experiments.
- Set charging efficiency to a fixed value of interest.
- Increase spark advance – with constant speed and charging efficiency – until distinct knocking cycles are heard by ear from the engine.
- Retard spark advance 10–15 CAD.
- Measure and record 200 cycles and 20 seconds of knocking statistics. Note intake air pressure and temperature.
- Step-wise increase spark advance one crank angle degree and repeat the measurements until a spark advance of a few crank angles past the knock boundary.
- Increase speed or load to the next engine operating condition and repeat the previous steps until all engine operating conditions to be investigated are covered.

The following table lists the different engine operating conditions where pressure data and knocking statistics have been gathered.

Speeds (RPM)	Charging Efficiencies		
	40%	50%	60%
1000	x	x	x
1100		x	x
1200	x	x	x
1300		x	x
1400	x	x	x
1500		x	x
1600	x	x	x
1700		x	x
1800	x	x	x

Table 2.2: Experimental matrix.

## 3. Modeling

Predicting knock requires a few sub models working together. This section describes in detail the components needed to find the knock boundary.

First, the knock model is described and its similarities to a chemical reaction rate model known as the Arrhenius equation, which can be related to ignition time delay of a fuel. Subsequently, a method using the ignition time delay information to calculate onset of knock is described. In addition to pressure history of an engine cycle, temperatures of unburned end gas needs to be calculated and implemented together with the knock model. To achieve increased precision and introduce better knowledge of when to stop the search of knock onset at any given cycle, the  $K$ -value (Worret et al., 2002) is introduced. In addition, the  $K$ -value also opens up for a method to calculate a distance or size from the current spark advance to the position where knock occur. This is however described in the next chapter – Prediction – rather than in the modeling chapter.

### 3.1 Knock Model

#### Empirical auto-ignition model

The idea behind the Arrhenius equation that motivates its use – or its cousin’s use – in the auto-ignition model is its dependencies of the rate constant of chemical reactions on the temperature and some activation energy. The Arrhenius equation is commonly expressed as

$$k = A \exp\left(\frac{E}{RT}\right) \quad (3.1)$$

where  $k$  is the rate constant,  $A$  is a pre-exponential factor,  $E$  activation energy,  $R$  the gas constant and  $T$  is temperature. The similarities between the Arrhenius equation and the ignition time delay model is clear, as the latter is modeled as

$$\tau = t_k - t_0 = C_1 p^{-C_2} \exp\left(\frac{C_3}{T}\right), \quad (3.2)$$

where  $p$  and  $T$  are pressures and temperatures of the end gas,  $t_k$  and  $t_0$  the time at which auto-ignition occur and the ignition timing respectively and  $C_1$ ,  $C_2$  and  $C_3$  are model coefficients to be determined (Douaud and Eyzat, 1978). In the cases when the physical state of the mixture is constant,  $\tau$  is referred to as ignition time delay. Under these conditions, and since the unburned gas is compressed and expanded continuously, it can be assumed that

$$\frac{d}{dt} \left( \frac{x}{x_c} \right) = g \left( \frac{t}{\tau} \right), \quad (3.3)$$

with  $x$  as the concentration of reaction components, the constant  $x_c$  as a critical concentration leading to auto-ignition and  $g$  as a function of time and ignition time delay (Worret et al., 2002). The function  $g$  cannot be determined by ignition time delay data – fuel octane number – only (Douaud and Eyzat, 1978) so, if it is assumed that the reaction rate does not change with time during a fixed state process, then

$$g \left( \frac{t}{\tau} \right) = \frac{1}{\tau}. \quad (3.4)$$

Using equation (3.3) and (3.4) with equation (3.2) and integrating yields

$$\frac{x}{x_c} = \int_{t_0}^{t_k} \frac{1}{\tau} dt \equiv 1, \quad (3.5)$$

where  $\frac{x}{x_c}$  – the critical concentration ratio – equals one if and only if the critical concentration of the species is reached. The time at where the integral reaches one is then the timing of knock onset (figure 3.1).

To simplify calculations and increase understanding of the process it is convenient to transform the integral into crank angles degrees rather than time,

$$1 = \frac{1}{6\omega} \int_{\theta_0}^{\theta_k} \frac{1}{\tau} d\theta, \quad (3.6)$$

where  $\omega$  is engine speed in RPM and  $\theta$  are crank angles;  $\theta_0$  start of calculations – which can be chosen arbitrarily – and  $\theta_k$  is the crank angle at which knock occur. The scalars 6 and  $\omega$  are results of scaling from time in seconds to crank angle degrees, where one cycle rotates 720 degrees, two whole revolutions. Combining

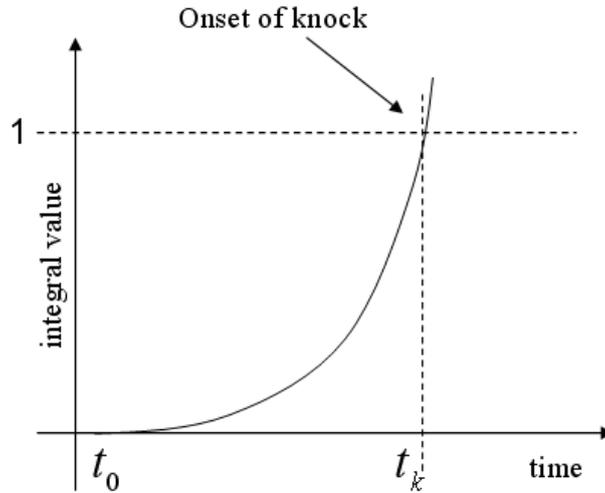


Figure 3.1: Integral value as a function of crank angle degrees. Onset of knock is found at  $t_k$ .

constants and expanding the expression of ignition time delay  $\tau$ ; the integral becomes:

$$1 = \frac{1}{C_1 \omega} \int_{\theta_0}^{\theta_k} \frac{1}{p(\theta)^{-C_2} \exp\left(\frac{C_3}{T(\theta)}\right)} d\theta, \quad (3.7)$$

with  $p$  and  $T$  – in this formulation – as crank angle dependent pressure and temperature variables.

Using the integral mean value theorem for integration described in appendix C and reordering equation (3.7) results in

$$\theta_k = C_1 \omega \bar{p}^{-C_2} \exp\left(\frac{C_3}{\bar{T}}\right) + \theta_0, \quad (3.8)$$

where  $\bar{p}$  and  $\bar{T}$  are the mean values of pressure and temperature. This is a more suitable representation concerning implementation.

## Finding model coefficients

Due to the nonlinearities of the knock model – with  $C_2$  as an exponent to pressure and temperature itself as an exponent – linear methods such as the least square method are not suited for finding model coefficients. Also, in this case the evaluation function is rather different since the value of interest is not a function variable in

normal sense, but the upper limit of the integrand interval. Taking this into account together with the non-linear properties of the knock model motivates a heuristic coefficient search; and in this thesis a genetic algorithm is implemented and used.

Genetic algorithms are well suited for optimization of non-linear problems, and even though an optimal solution can not be guaranteed, genetic algorithms have proven to deliver good results in many applications. Another advantage of genetic algorithms is the possibility of using almost any function as a fitness function. As long as it is possible to implement some error measurement, a genetic algorithm is capable of finding a solution, no matter how the error itself is defined. More details about genetic algorithms and the implementation of one are found in appendix B.

Steps made to fit the coefficients with help of a genetic algorithm are:

- Measure a few cycles showing light knock at different engine operating conditions. The reason of keeping knocking as light as possible is to achieve high model sensitivity. Since there are three unknowns in the model at least three engine operating conditions are needed.
- Measure an average onset of knock at each condition and average the cycles.
- Start the algorithm in a large search space so that the values are not limited by size; but what is found might be a bit rough.
- Narrow the search space around the new coefficients and repeat the run to improve precision (this step depends on the implementation and is not always necessary).

The engine operating conditions used with the genetic algorithm here are 1000 RPM and 1200 RPM at 40% charging efficiency and 1000 RPM at 50% charging efficiency. The resulting coefficients are shown in table 3.1.

$C_1$	$C_2$	$C_3$
305.731	1.7914	3188.7424

Table 3.1: Static model coefficients.

Unfortunately, investigation found the initial model coefficients to be insufficient. As speed increased the model seemed to fall behind, never reaching one even though it should. Because of this, the model could only find the onset of knock at engine operating conditions close to the once used for finding the model coefficients and not at all outside of this narrow space. This gave rise to the idea of implementing adaptation of the model. However, while trying to understand the problem a simpler solution was found.

At first glance it was noticed that the integral calculations became too small as speed increased. Since Elmqvist et al. (Elmqvist et al., 2003) choose to optimize their model only in regard of  $C_1$  to find the correct properties of calculations, and manual tuning was an approach by Worret et al. (Worret et al., 2002); some experiments manually changing  $C_1$  were done, adjusting the coefficient until correct calculations was found. The first experiments aimed to describe these changes with a function approximation, but since the changes needed to achieve correct calculations seemed to be exponential another idea came to mind. Instead of changing  $C_1$ , which is a scalar outside of the knock integral a change in  $C_2$  – the exponent to pressures – seemed to be a motivated choice for tuning the model. Similar investigations as with  $C_1$  was made with  $C_2$  and the changes that needed to be done with the exponent  $C_2$  was discovered to be linear.

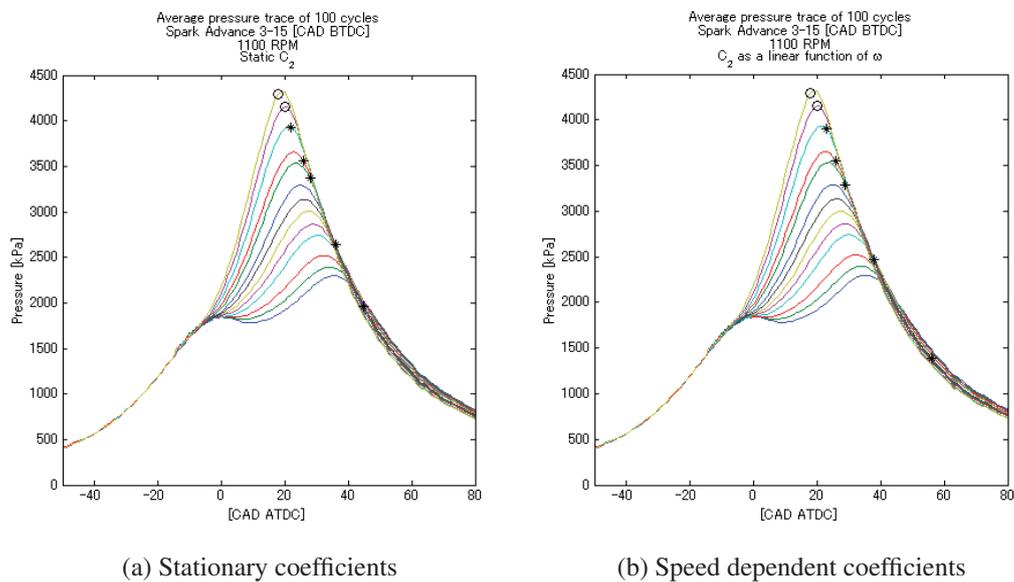


Figure 3.2: To visualize the error in relation to increased engine speed the left figure use stationary coefficients while the right figure use a speed dependent  $C_2$ . The circles mark the knocking engine operating conditions. All cycles are measured at 1100 RPM.

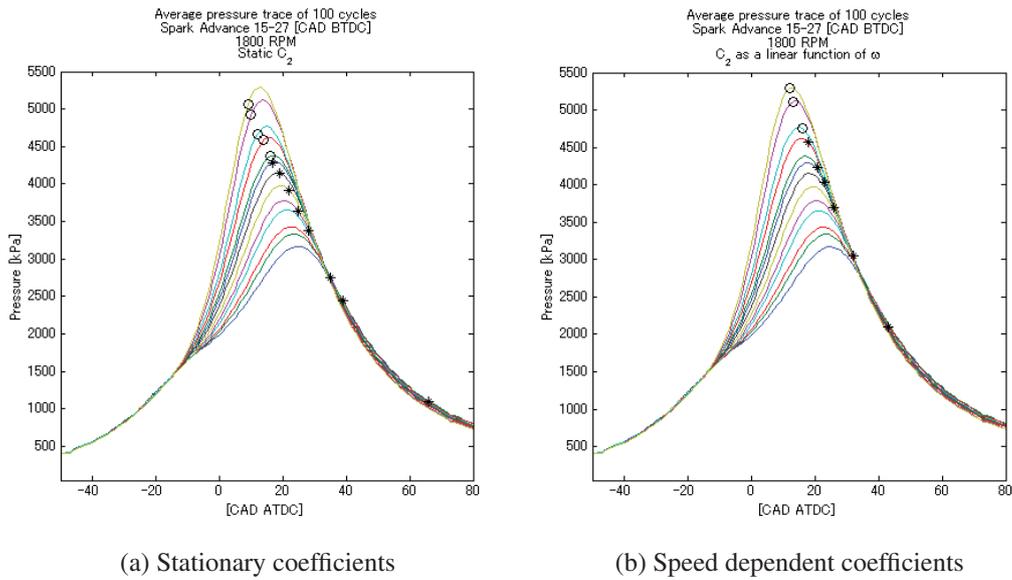


Figure 3.3: As seen above, the left figure using stationary coefficients fail to decide which operating conditions that are knocking (the three highest peaks are measured as knocking engine operating conditions) where a linear dependence on speed is enough to find the correct knocking engine operating conditions. The cycles are measured at 1800 RPM.

The last part of fitting the model coefficients is to measure another point in speed – in this case 1500 RPM at 50% charging efficiency – and extrapolate a line from the two available points in speed.

The final variable model coefficients are given in table 3.2.

$C_1$	$C_2$	$C_3$
305.731	$1.7914(-3 \cdot 10^{-5}\omega + 1.03)$	3188.7424

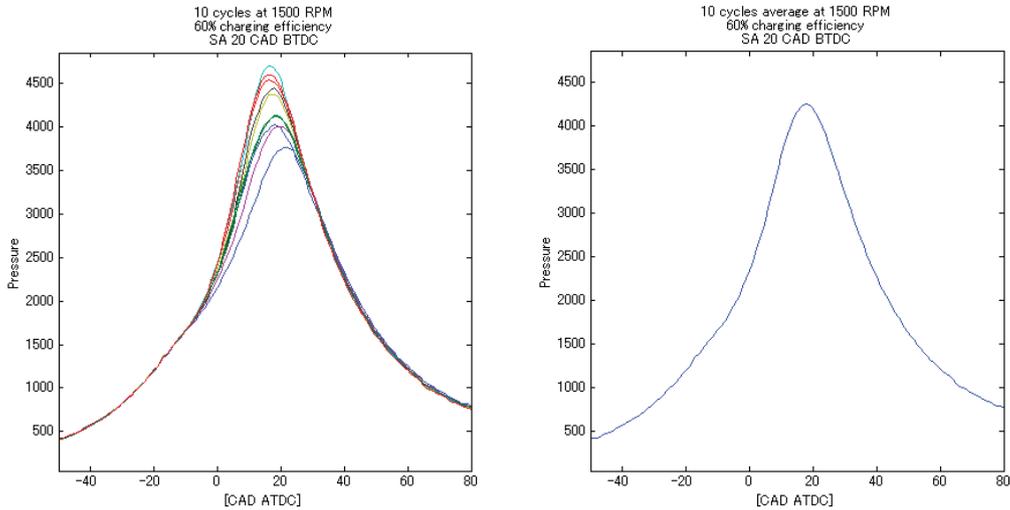
Table 3.2: Coefficients with  $C_2$  as a linear function of engine speed  $\omega$ .

## 3.2 Discussion and results

This empirical knock model was initially designed to simulate knocking in engine cycle simulation software, where the knock integral is used to calculate the onset of knock at individual simulated cycles. Previous work with this type of knock model have proved results within four crank angle degrees offset to the true knock timing (Kawai et al., 2009) (Elmqvist et al., 2003) (Worret et al., 2002).

The primary goal here is to use the model directly on real engine data, with some

averaged cycles to get as close as possible to an ideal combustion cycle at the current engine operating condition. Applying the model to real data has both its pros and cons. An advantage is that complexity in combustion that could be lost in simulations is guaranteed to be accounted for with measured data. A disadvantage is the large variations between cycles. Pressure peaks occasionally differ with sev-



(a) Pressure trace history of 10 cycles.

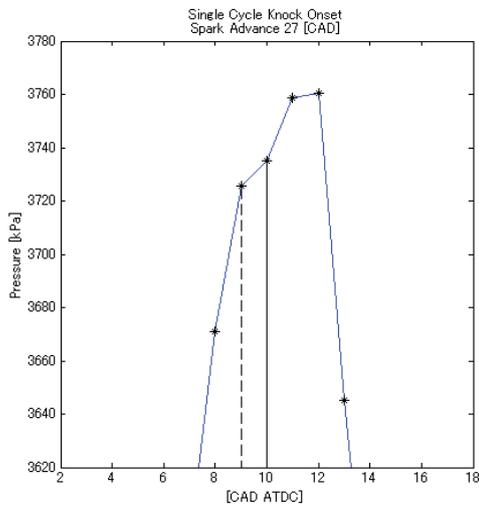
(b) An average value of the same 10 cycles.

Figure 3.4: Due to large variations in pressure peaks between individual cycles an average of some cycles is necessary.

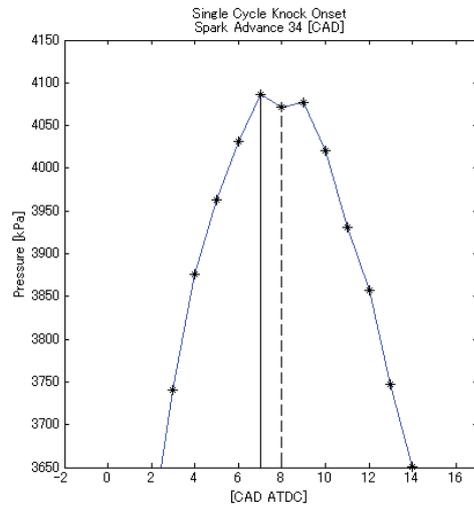
eral tenths of percentage between cycles running under the same engine operating condition. This is why an averaging of cycles is needed (figure 3.4).

Knock onset from single cycles are – with this model and on real engine data – found within 3 crank angle degrees. Some examples of these results are seen in figures 3.5 and 3.6.

The model parameters found are in the same magnitude as most previous work and not too far away from the findings of Douaud and Eyzat (Douaud and Eyzat, 1978). The only difference is the linear approximation applied to  $C_2$  for the model to be accurate. The reason might be the lack of some important physical phenomena not taken into account. Other models include for example the fuel octane number (Worret et al., 2002), air-fuel ratio (Douaud and Eyzat, 1978) and even more complex components such as in-cylinder residual gas and several models at different temperature ranges (Kawai et al., 2009). In this work complexity is kept to a minimum and experiments are run with stoichiometric air-fuel mixture and the same fuel is used at all investigations. Still, under these conditions it seems like something is missing, hence the linear change in  $C_2$ . The function dependence on  $C_2$  can be compared to the different model ranges found by Kawai et al..

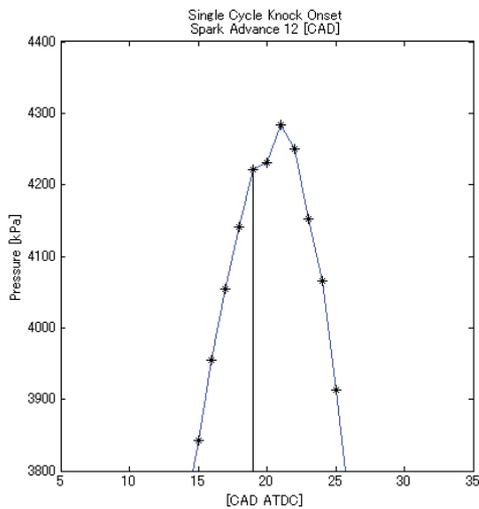


(a) 1000 RPM

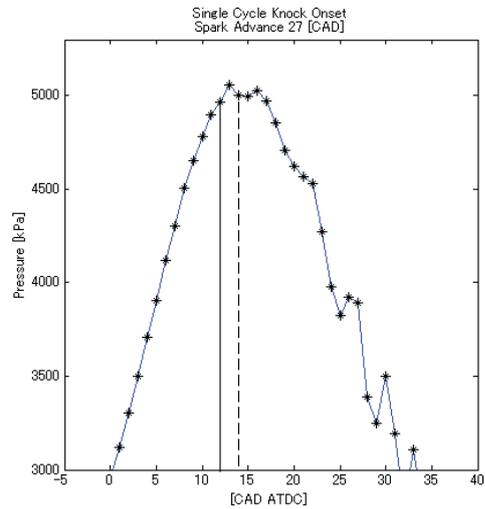


(b) 1400 RPM

Figure 3.5: Knock onset at different engine operating conditions. Calculated knock onset is found at the dashed line and measured knock onset is marked by the solid line. Both figures show pressure at 40% charging efficiency but different speeds.



(a) 1000 RPM



(b) 1800 RPM

Figure 3.6: Knock onset at different engine operating conditions. Calculated knock onset is found at the dashed line and measured knock onset is marked by the solid line. Both figures show pressure at 60% charging efficiency but different speeds.

### 3.3 Temperature Model

There is more than one approach to model in-cylinder combustion temperatures. However, in the knock model described in the previous section, there is no interest in knowing the high temperatures of the hot burned gas. Only temperatures of the cooler unburned end gas are the necessary temperature information needed.

The temperature model of choice is called a temperature mean value approach (Klein and Eriksson, 2004)(Eriksson and Andersson, 2002) and contains of a single-zone mean charge temperature model and a two-zone temperature model.

#### Single-zone mean charge temperature model

To find the temperature in the single-zone model the state equation

$$pV = mRT \quad (3.9)$$

is used under the assumptions that the total mass of charge  $m$  and the mass specific gas constant  $R$  are constant,

$$mR = \text{const.} \quad (3.10)$$

These assumptions are justified by the fact that the molecular weights of the reactants and products are close to equal (Klein and Eriksson, 2004). With equations (3.9) and (3.10) relations between pressures, volumes and temperatures at two different timings are described by

$$\frac{p_1 V_1}{T_1} = \frac{p_2 V_2}{T_2}. \quad (3.11)$$

If pressure, volume and temperature are evaluated at a known reference condition – such as the timing of when the intake valve close (IVC) – the single-zone temperature  $T_{sz}$  is given by

$$T_{sz} = \frac{T_{IVC}}{p_{IVC} V_{IVC}} pV. \quad (3.12)$$

## Two-zone temperature model

There are – as the name implies – two zones in a two-zone model. Divided by an infinitesimal thin flame front the two zones are one of burned hot gas behind the flame front and one zone with cooler unburned gas ahead of the flame front. Pressure is considered to be identical between both zones but temperatures are individual for each zone, however thought of as homogenous distributed within the zones respectively.

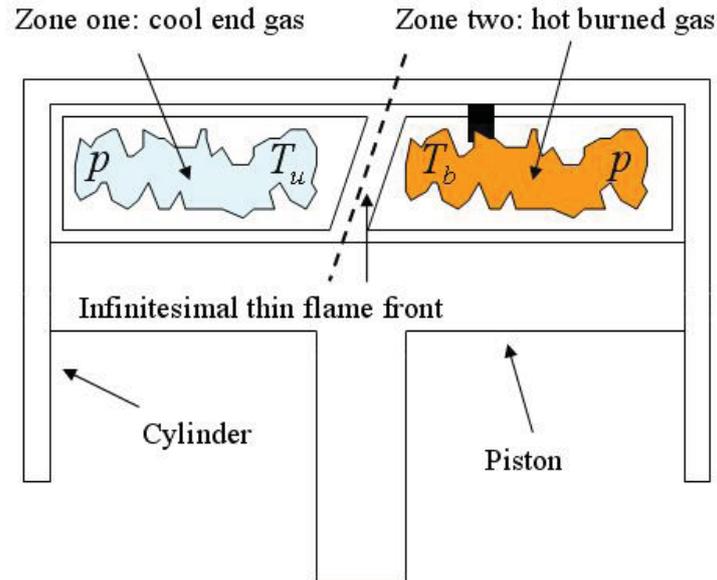


Figure 3.7: Two zone model: different temperatures divided by an infinitesimal thin flame front but with the same pressure throughout the cylinder.

The two-zone model could be used to find both the unburned gas temperature  $T_u$  and the burned gas temperature  $T_b$ . Finding the burned gas temperature is not necessary for the knock model itself and is mentioned only to show a thermodynamic balance between the single-zone and the two-zone models; and thus not explained in detail. The part of the two-zone model used is a fast and simple way of calculating the unburned end gas temperatures.

Assuming adiabatic compression of the unburned fuel charge it is known that:

$$pV^\gamma = const, \quad (3.13)$$

and that the relation between pressure and volume at two different times during compression (Johansson, 2006) is known by

$$p_1V_1^\gamma = p_2V_2^\gamma \implies p_2 = p_1 \left( \frac{V_1}{V_2} \right)^\gamma, \quad (3.14)$$

or what is of interest in this case:

$$\left(\frac{p_1}{p_2}\right)^{\frac{1}{\gamma}} = \frac{V_2}{V_1}. \quad (3.15)$$

The temperatures after compression are given by combining (3.15), the ideal gas law and adiabatic compression in the following way,

$$\left. \begin{array}{l} \frac{p_1 V_1}{T_1} = \frac{p_2 V_2}{T_2} \\ \frac{V_2}{V_1} = \left(\frac{p_1}{p_2}\right)^{\frac{1}{\gamma}} \end{array} \right\} \Rightarrow \frac{T_2}{T_1} = \frac{p_2 V_2}{p_1 V_1} = \frac{p_2}{p_1} \left(\frac{p_1}{p_2}\right)^{\frac{1}{\gamma}} = \left(\frac{p_1}{p_2}\right)^{\frac{1}{\gamma}-1} = \left(\frac{p_2}{p_1}\right)^{1-\frac{1}{\gamma}} \quad (3.16)$$

and  $T_2$  is then given by

$$T_2 = T_1 \left(\frac{p_2}{p_1}\right)^{1-\frac{1}{\gamma}}. \quad (3.17)$$

The initial temperature  $T_{u,i}$  of the unburned zone is known from the single-zone model, evaluated at IVC, and then calculated at start of combustion; in this case at ignition timing,

$$T_{u,i} = T_{sz,ig} = \frac{T_{IVC}}{p_{IVC} V_{IVC}} p_{ig} V_{ig}. \quad (3.18)$$

The unburned zone temperature after ignition is then calculated by combining  $T_{u,i}$  with equation (3.17),

$$T_u = T_{u,i} \left(\frac{p}{p_{ig}}\right)^{1-\frac{1}{\gamma}}. \quad (3.19)$$

The complete unburned zone temperature is described by the timings before ignition and after ignition,

$$T_u(\theta) = \begin{cases} T_{sz}(\theta) & \text{if } \theta \leq \theta_{ig} \\ T_{u,i} \left(\frac{p(\theta)}{p(\theta_{ig})}\right)^{1-\frac{1}{\gamma}} & \text{if } \theta > \theta_{ig} \end{cases} \quad (3.20)$$

Finally according to the laws of thermodynamics, the energy balance between the single-zone model and the two-zone model is described. With subscript  $b$  as burned and  $u$  as unburned and with  $m$  as mass of gas mixtures the balance becomes,

$$(m_b + m_u) c_v T_{sz} = m_b c_{v,b} T_b + m_u c_{v,u} T_u, \quad (3.21)$$

which – if wanted – could be used to calculate the burned zone temperature under the assumptions that  $c_v = c_{v,u} = c_{v,b}$ , meaning calorically perfect gas.

### 3.4 Discussion and results

Using these models has proved precisions good enough to implement together with the empirical knock model. The following images show temperatures calculated at different engine operating conditions where knocking is just possible. As seen, the temperatures are close to equal at this point.

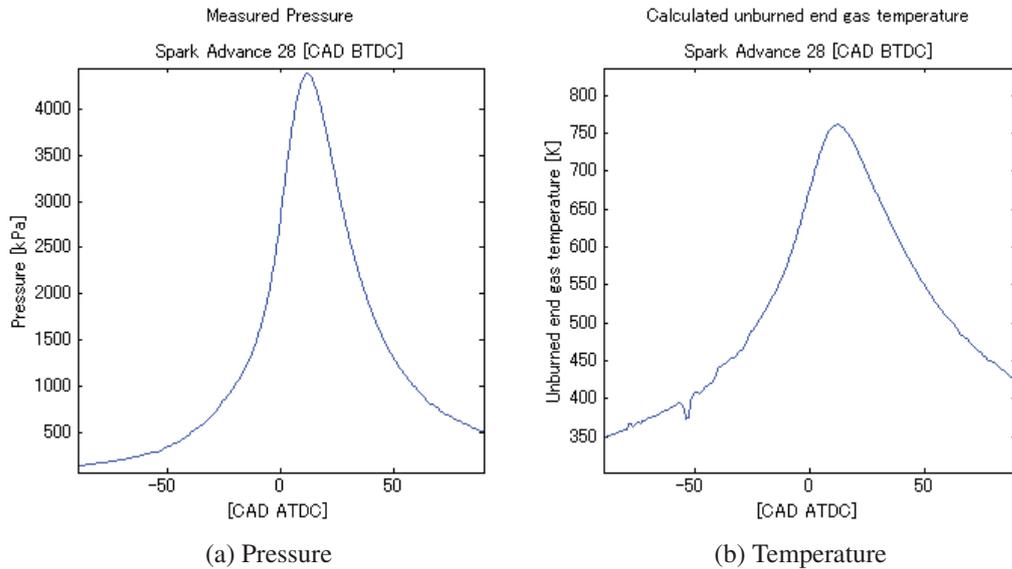


Figure 3.8: Pressure and its corresponding calculated temperature: 50% charging efficiency and 1600 RPM.

The downsides of this method are that it lacks at least two sources of temperature transfer. After combustion and after the exhaust stroke, the cylinder walls might still carry some excess heat into the next combustion stroke. This addition of energy is ignored and if taken into account it would increase the end gas temperature slightly. Another source of heat transfer ignored is radiation from the burning flame front and the hot burned gas. This too would slightly increase the end gas temperatures. As a final conclusion, this model approximates the temperatures well enough but will always slightly underestimate the end gas temperatures.

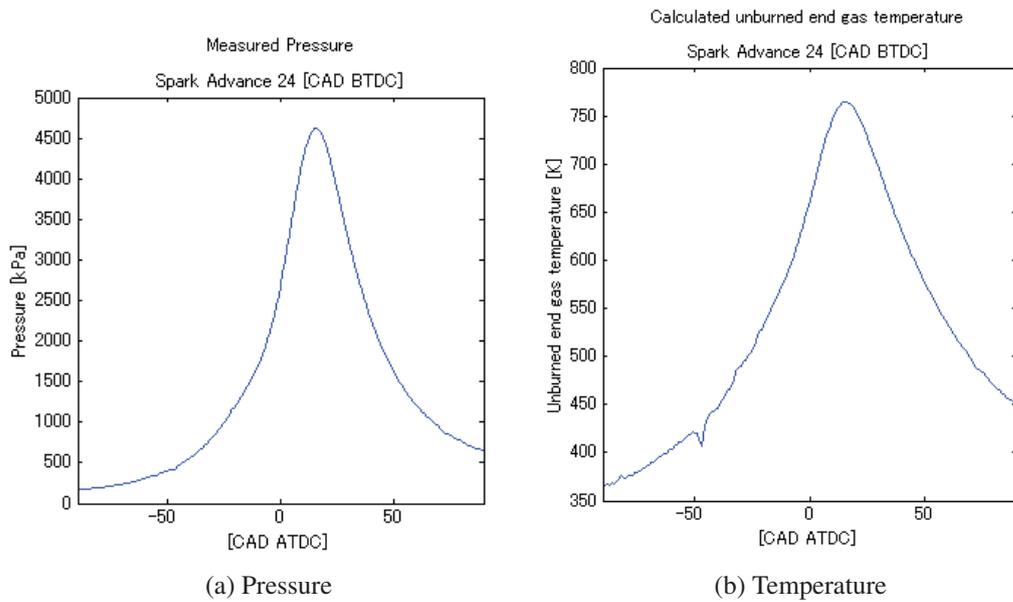


Figure 3.9: Pressure and its corresponding calculated temperature: 60% charging efficiency and 1800 RPM.

### 3.5 The $K$ -value and the Critical Crank Angle

First introduced by a researcher named Franzke and later evaluated and investigated by Worret et al. (Worret et al., 2002) is the  $K$ -value. The idea with the  $K$ -value is to increase precision of the knock model by acquiring a better estimate of how big mass fractions burned that is possible at where knock still might occur. Prior to the  $K$ -value, the critical mass fraction burned has been defined by the user of the model, usually somewhere close to 90% mass fraction burned.

There has been no satisfactory motivation why to use the  $K$ -value described nor any explanation of the improvements it introduce. It has also been noted that the  $K$ -value seem to deviate about 5–15% from the value one (Worret et al., 2002) depending on how it is implemented. The following parts of this section describe the  $K$ -value, motivates it and propose an explanation of its deviations.

The  $K$ -value is defined as:

$$K = \frac{\theta_k - \theta_{soc}}{\theta_{eoc} - \theta_{soc}} \quad (3.22)$$

where  $\theta_k$  is the onset of knock,  $\theta_{soc}$  start of combustion and  $\theta_{eoc}$  end of combustion. When the  $K$ -value was first introduced, the start and end of combustion was defined as 1% mass fraction burned and 95% mass fraction burned. As mentioned earlier, it is very hard to know these values with any precision and the choice of start and end of combustion is rather defined as 10% mass fraction burned at the crank angle  $\theta_{10}$

and 90% mass fraction burned at  $\theta_{90}$ . The  $K$ -value is also proposed to be constant at the knock boundary which motivates a new model parameter; the critical crank angle  $\theta_c$ . The following transposition of the  $K$ -value, with  $K_{ref}$  instead of  $K$  and  $\theta_c$  instead of  $\theta_k$  yields

$$\theta_c = \theta_{10} + K_{ref}(\theta_{90} - \theta_{10}). \quad (3.23)$$

With the assumption that  $K$  is constant on the knock boundary, a reference  $K$ -value,  $K_{ref}$  can be calculated at knock onset from a known knocking cycle. Later, with cycles at engine operating conditions with unknown knock onset, the critical crank angle with help of  $K_{ref}$  is calculated as the latest crank angle of where auto-ignition could possibly occur.

When measuring a new cycle, the knock integral value has to reach one before the crank angle  $\theta_c$  if knock is to occur. The crank angle at where the knock integral actually do reach one – before  $\theta_c$  – is known as the onset of knock.

Regarding the noted deviation in  $K$  at different engine operating conditions, it is here proposed to be a natural cause based on the reasons of auto-ignition. Without the  $K$ -value, the same fixed mass fraction burned is used at all engine operating conditions to decide whether or not it is possible for knock to occur. However, this is a faulty assumption since the critical mass of fuel charge left in the engine at a specific mass fraction burned differs greatly between engine operating conditions. If the initial fuel charge is large, then 90% mass fractions burned, i.e. 10% mass fractions fuel charge left in the cylinder is bigger than 10% fuel charge left from a smaller initial charge. There is only a minor change in the size of fuel charges between speeds and this difference can safely be ignored. The important changes are in variations between loads – or rather charging efficiency – where the size of the fuel charge has to change a lot. The change in  $K$  can be seen as a calibration from mass fractions left in the cylinder to absolute fuel charge left in the engine and – correctly – result in changes in  $K$  at different engine operating conditions.

The proposition of changing  $K$ -values is backed by investigations at different charge efficiencies with constant speed. The following tables (3.3 and 3.4) relates absolute fuel charges to mass fractions burned, calculated  $K_{ref}$  at the knock boundary, their associated critical crank angles  $\theta_c$ , measured mass fractions burned at this crank angle and expected mass fractions burned.

It should be mentioned – again – that measured mass fractions burned higher than 90% do not have any good precision. Also, the calculations of expected mass fractions burned are based on measurements from 60% charging efficiency. Even though the values does not match perfectly, there is a clear trend in the results which strengthen the  $K$ -value proposal.

Worret at al. improved their results by introducing the  $K$ -value, but in addition to their findings; here a motivation of the variations in  $K$  is proposed and  $K$  is used as

Charging efficiency	Absolute charge (mm <sup>3</sup> /stroke)	Mass fractions fuel left when the absolute charge left are equal
60%	39	10%
50%	32	12.2%
40%	26	15%

Table 3.3: Relations between charging efficiencies, absolute fuel charges,  $K$ -values and mass fractions burned.

$K_{ref}$	$\theta_c$	Measured mass fractions burned (approximate values)	Expected mass fractions burned
1.1	28	96%	96%
1.08	24	94.5%	95.2%
1	13	93%	94%

Table 3.4: Continued: relations between charging efficiencies, absolute fuel charges,  $K$ -values and mass fractions burned.

a model parameter, changing with engine operating conditions.

## 3.6 Modeling Summary

This chapter has described and discussed models of three different key parts needed to search for the auto-ignition boundary in engine operating condition space.

- An empirical auto-ignition model based on the Arrhenius equation used to find the onset of knock.
- A method to calculate temperatures from given pressure trace histories; based on the combination of a single-zone temperature model and a two-zone temperature model.
- An important addition to the auto-ignition model – the  $K$ -value – which not only improves precision but also introduce – which will be described in detail in the next chapter – a measure of distance from knock.

The auto-ignition model is capable of finding the onset of knock within 3 crank angle degrees in the engine operating conditions described by the experiments. Even though the temperature model slightly underestimates the true temperature it has been found accurate enough to be combined with the auto-ignition model. Finally the  $K$ -value is introduced, which is based on the mass fractions burned and helps finding a better estimate of the latest possible crank angle where auto-ignition might occur.

## 4. Predicting

If a human were to search for the knock boundary manually the task would be to increase spark advance in each operating condition, listening via a monitor connected to a microphone in the engine room and trying to identify the sound of auto-ignition. This method would yield different results depending on the persons who were doing the experiments and it would take a long time to cover all the necessary engine operating conditions. This chapter explains the distance to knock and discuss how it might be used to predict the knock boundary. It also investigates and compares simpler linear searches of spark advance with 10 and 100 averaged cycles respectively.

### 4.1 Methods

The idea is to use the earlier mentioned distance from knock derived with the  $K$ -value to implement a search scheme with faster than linear search time. Previous methods of finding the onset of knock has only been concerned about if the integral value reaches one before a certain percentage mass fractions burned. With the  $K$ -value comes the critical crank angle  $\theta_c$ , which has an individual value at each engine operating condition. In the same way as earlier studies of this model, the integral has to become one before this specific crank angle is reached. The improvements are that  $\theta_c$  changes with engine operating conditions and it is also possible to continue the integral calculations until they actually reach one after the critical crank angle. The value between  $\theta_c$  and the crank angle where the integral reach one can be considered a distance or rather a size, since the function how the size decrease with spark advance is unknown. The function of size behave in an exponential matter but it is hard to decide an approximation since its coefficient – whatever they might be – also change with different engine operating conditions.

The following image (Figure 4.1) visualizes the concept of distance together with the critical crank angle, spark advance and the knock integral. It can also be noted that cycles without knock reach one to the right of  $\theta_c$  while knocking cycles reach one precisely on  $\theta_c$  or earlier.

The optimal way of finding the knock boundary fast would be to know how the

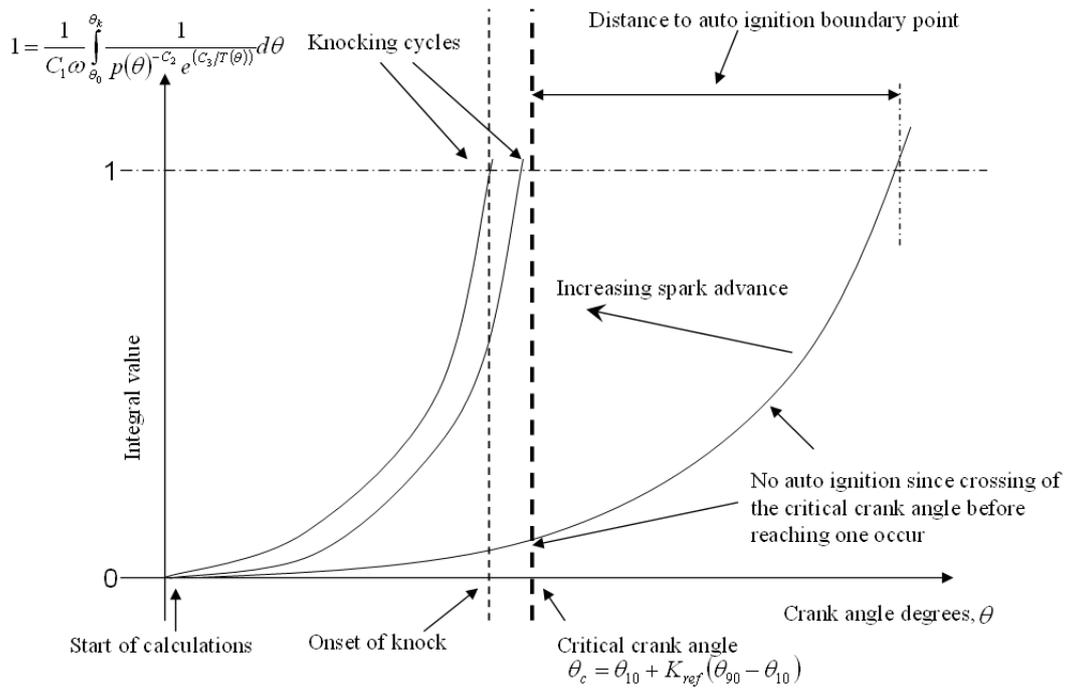
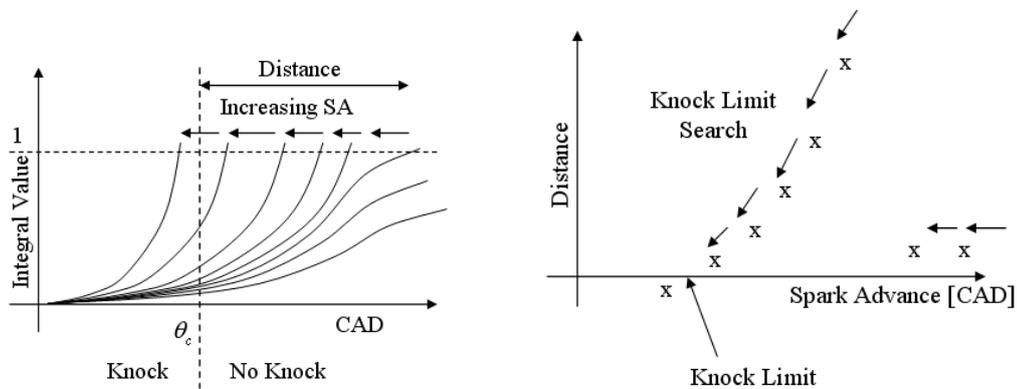


Figure 4.1: The knock integral as function of crank angle degrees with the critical crank angle  $\theta_c$  dividing knocking cycles from non-knocking cycles.



(a) Integral values as functions of CAD. The knock limit search increase spark advance in the direction of the arrows.

(b) Knock limit search. The arrows indicate steps of increasing spark advance. The outliers with huge distances are arbitrarily positioned where they are.

Figure 4.2: The above figures explain how the knock limit search is performed for each engine operating condition.

distances from knock changes with spark advance. Then all that would be needed is to measure one point in spark advance to calculate where the current operating condition would start to knock. This is not currently possible, but still the distance could be used in some smart ways. One concept could be to measure two points and extrapolate a line from the two. The position where the line cuts the zero on

the y-axis is how far ahead the spark advance can be moved and a new point is measured at this spark advance. This procedure is repeated until the knocking spark advance is found. Figure 4.3 explains the concept. An even simpler method would be to define a spark advance step-size that can be used until the measured distance is small enough for more careful measurements to take place, see figure 4.4.

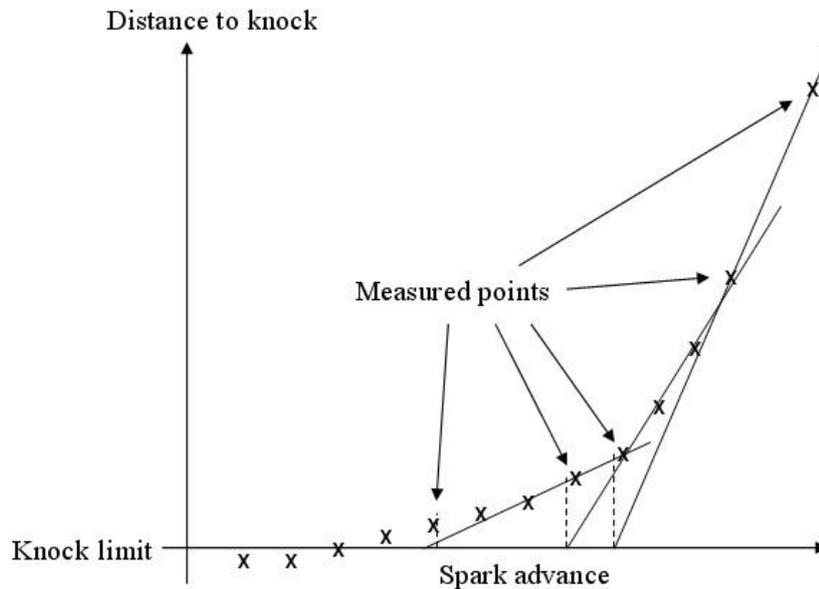


Figure 4.3: Faster search scheme to find the knock limit.

If it is not important to average more than a few cycles it could be sufficiently fast just to measure every point instead of using a faster search scheme. However, fewer averaged cycles results in lower precision due to the high variations in engine combustions. And with lower precision, using the a search scheme is risky since some outliers might break the exponential pattern; hence there is a high probability that the search results in spark advances far behind the knock boundary.

The methods proposed are thus either an average of many cycles – about 100 – and use any of the above mentioned searches to decrease the number of measurements needed, or just to measure an average of a few cycles – about 10 – and with lower precision do a linear search with every spark advance until the knock limit is found or if necessary, do the same with 100 averaged cycles instead.

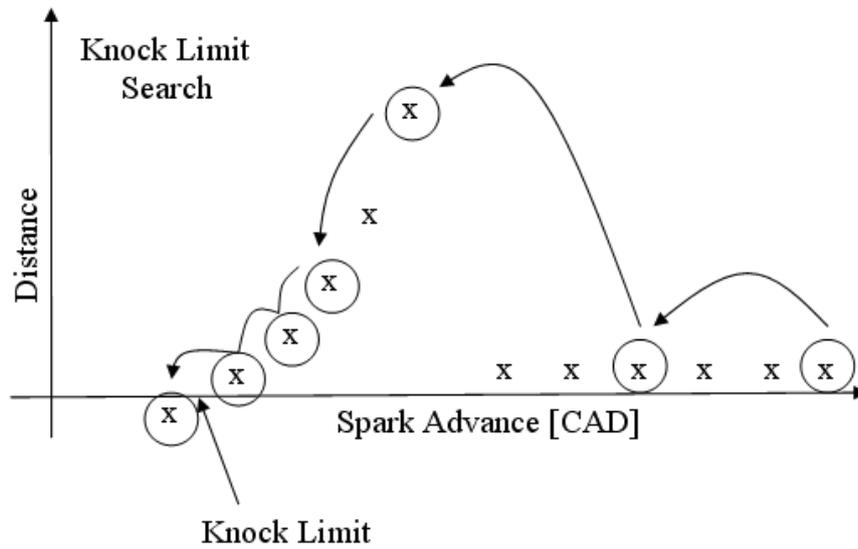
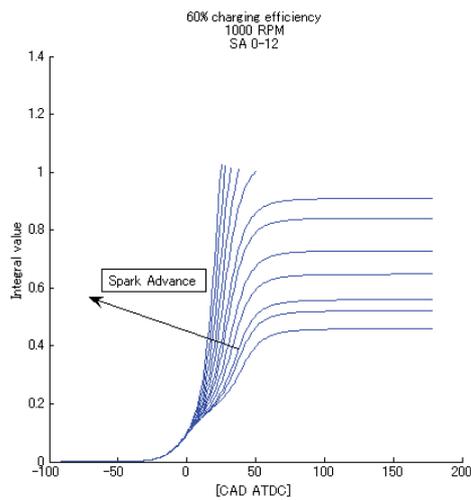


Figure 4.4: A simpler search scheme to find the knock limit.

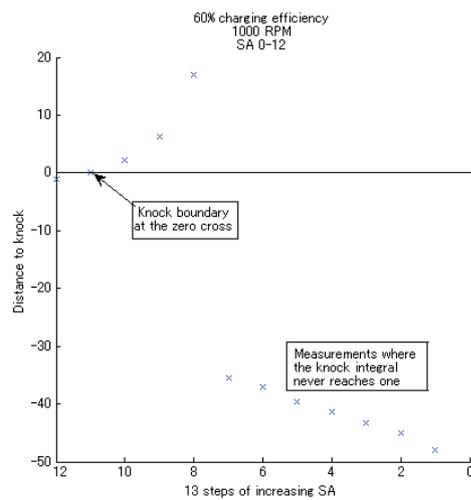
## 4.2 Discussion and Results

The final results of finding the knock boundary with the models and with the implementation described in appendix A are found to be satisfying. The knock boundaries are predicted within a maximum deviation of 2 crank angle degrees from the measured knock boundaries at 50% and 60% charging efficiency and it is possible to do a rough automatic knock boundary search. At 40% charging efficiency and at higher speeds the engine operating conditions is outside of the model. It is also very hard to get the engine to knock under these conditions. What happens is that when the spark advance is too early, pressure peaks before TDC resulting in similar pressure trace histories at earlier and later spark advance. Since there is no detectable difference the model can not distinguish these engine operating conditions from each other and cannot find the knock boundary.

It turned out that using the first search scheme described in the Prediction chapter did not improve search speed much. The main problem is that there are many cycles with infinite distance i.e. the integral never reaches one, and when the first cycle that do reach one is measured, commonly only a few – less than five – more measurements are needed to find the knock boundary. At most – with this implementation and model parameters – the number of measurement skipped during a search is two. If 10 steps of spark advance increase are needed to find the knock boundary, this corresponds to a 1000 measured cycles and with two (at best) points skipped – 200 cycles – the search time is reduced by 20%. On the other hand, the second very simple method can – with good choices of cut-off distance for more detailed measurements – almost cut the search time in half.

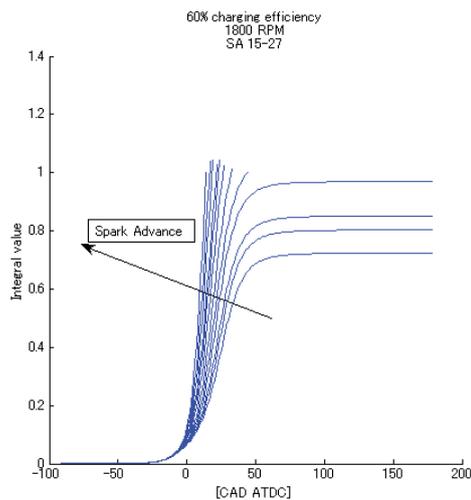


(a) Integral values at different SA, those that never reaches one result in infinite distance.

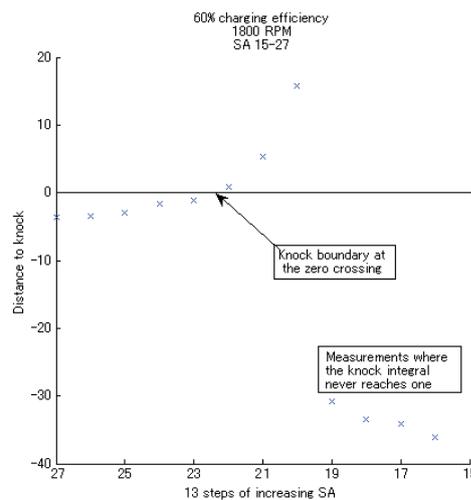


(b) Knock limit search, the outliers with infinite distance has been placed where they are on purpose.

Figure 4.5: Too few measurable distances before the knock limit in order for the first search scheme to make any difference, however the second method is well suited.



(a) Integral values at different SA, those that never reaches one result in infinite distance.



(b) The knock limit found with good precision but the search scheme cannot increase speed.

Figure 4.6: Knock limit search at another engine operating condition.

Measurements using both a 10 cycles average and a 100 cycles average have been investigated and using only an average of 10 cycles, the knock boundary of 50% and 60% charging efficiency are found within 4 crank angle degrees deviation. Since the precision of finding the knock boundary depends on how well the onset of knock is found, these results are believed to be similar as earlier works would be, applying the empirical auto-ignition model on simulation software. The search time of the same example as with the search scheme would thus only be a total of 100 measured

cycles. Increasing the measurements to 100 cycles average gets even closer to the true knock boundary with a maximum deviation on the available data of 2 crank angle degrees.

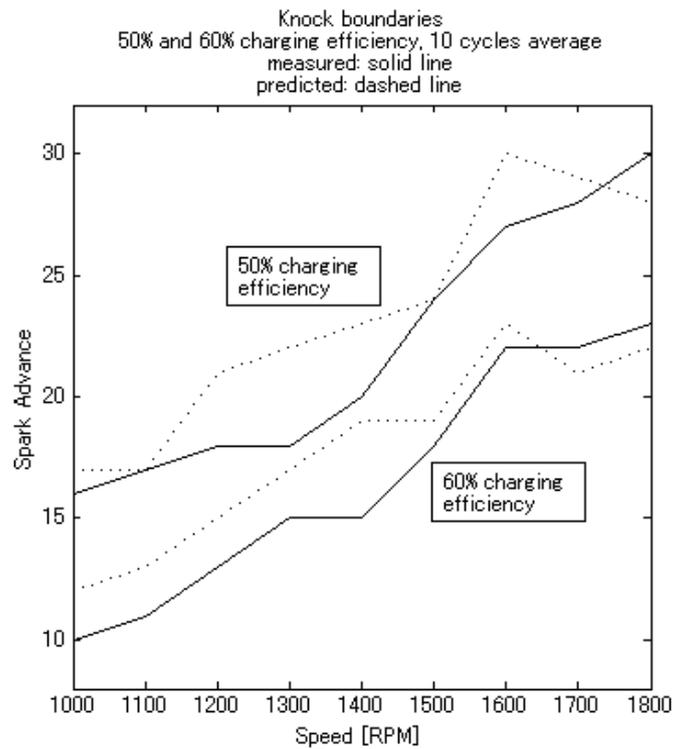


Figure 4.7: Knock boundary based on 10 averaged cycles.

It has not been tested here since only one engine has been available, but it is believed that this model is independent on what (SI) engine is used (also based on the facts that other researchers have verified their model with different engines (Kawai et al., 2009) (Worret et al., 2002)). The only information needed about an engine to the model is its geometry and valve timings and this enters the model indirect as temperature calculations. All other data needed to the knock integral and the  $K$ -value are measured, so that it does not matter what engine is being used.

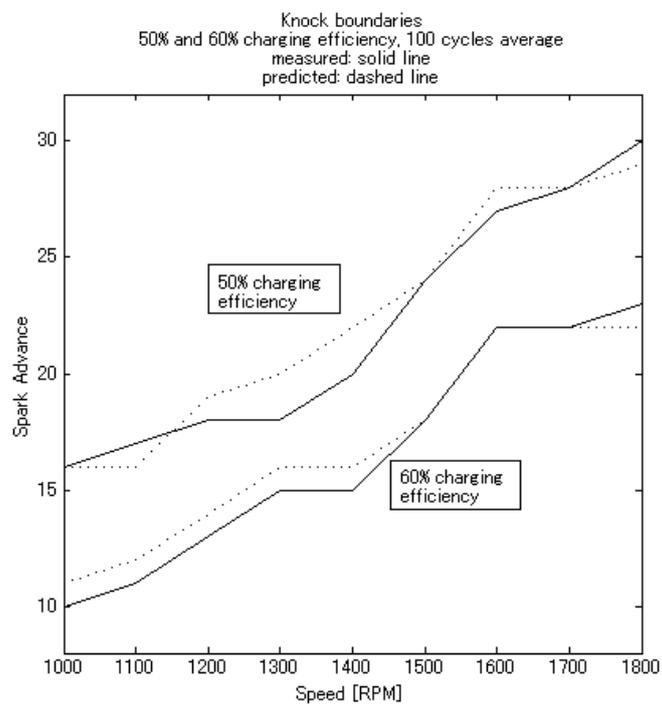


Figure 4.8: Knock boundary based on 100 averaged cycles.

## 5. Conclusions and Future work

The main objective was to be able to find the knock boundary automatically. This can be done – after model calibration – within a deviation of 2 crank angle degrees, if an average of 100 cycles is used. The primary improvements from most earlier works is how the  $K$ -value and its related critical crank angle is implemented and used. Here the  $K$ -value is not only used to improve precision of finding onset of knock but also works as an important part in the methods of finding the knock boundary by introducing a distance from knock measurement. The distance from knock, based on the critical crank angle and the position where the knock integral reaches one can be used by a search scheme to reduce the necessary measurements and thus reduce the total knock boundary search time.

A future task that would greatly improve the general use of this model would be to find a method to understand and describe how the  $K$ -value changes with engine operating conditions. Perhaps even include its minor differences between different speeds to achieve even higher precisions.

It is known that other correlations of knock integral coefficients can be found, and some of these might have properties so that the problem of infinite distance never happens. Then the distance to knock could greatly improve the knock boundary search. In addition to this, understanding or being able to describe the distance to knock as a function of spark advance would probably be the final goal of this method. Once this is possible, predicting the knock boundary would be almost instantaneous with only one – or a few – measurements at each engine operating condition.

Other improvements are to implement more parameters into the model. This has already been done by Kawai et al. and even more extensive versions of the model are under development. To improve model generality it could typically include air-fuel ratio dependence, fuel octane number and residual gas. If variable valve timing is used then it has to be implemented as well.

A higher sample frequency is possible since, for example the limit of DS-0228 is 0.5 CAD sample size. Higher sample frequency would not only introduce more details but also reduce overshoot of the knock integral. Higher sample frequency has not been used in this thesis to reduce size of the already huge sets of data.

## A. Implementation

Implementation is mostly straight forward with only a few things to take into extra consideration.

Even though the model and all calculations are based on the discrete sample of some crank angle degrees it is important to implement and calculate everything with real numbers. The critical crank angle  $\theta_c$  and the crank angle  $\theta_k$  – where the integral value reach 1 – are highly sensitive to round off errors. If any of these two are rounded to their closest integer values before all calculations and predictions are done, the error will be of great significance. Instead, not until a real number of the knock onset crank angle is found it can be rounded to its closest discrete sample value.

Another problem is overshoot of the knock integral. Since the samples are only in one crank angle degree, the integral might be very close to one at a given crank angle and then greatly overshoot when the next crank angle is included in the calculations. This is solved by a linear approximation between the two points before and after crossing 1 on the  $y$ -axis, so that the precise real crank angle where the integral reach one can be determined.

The complete implementation and usage of the model is described in the following flow chart:

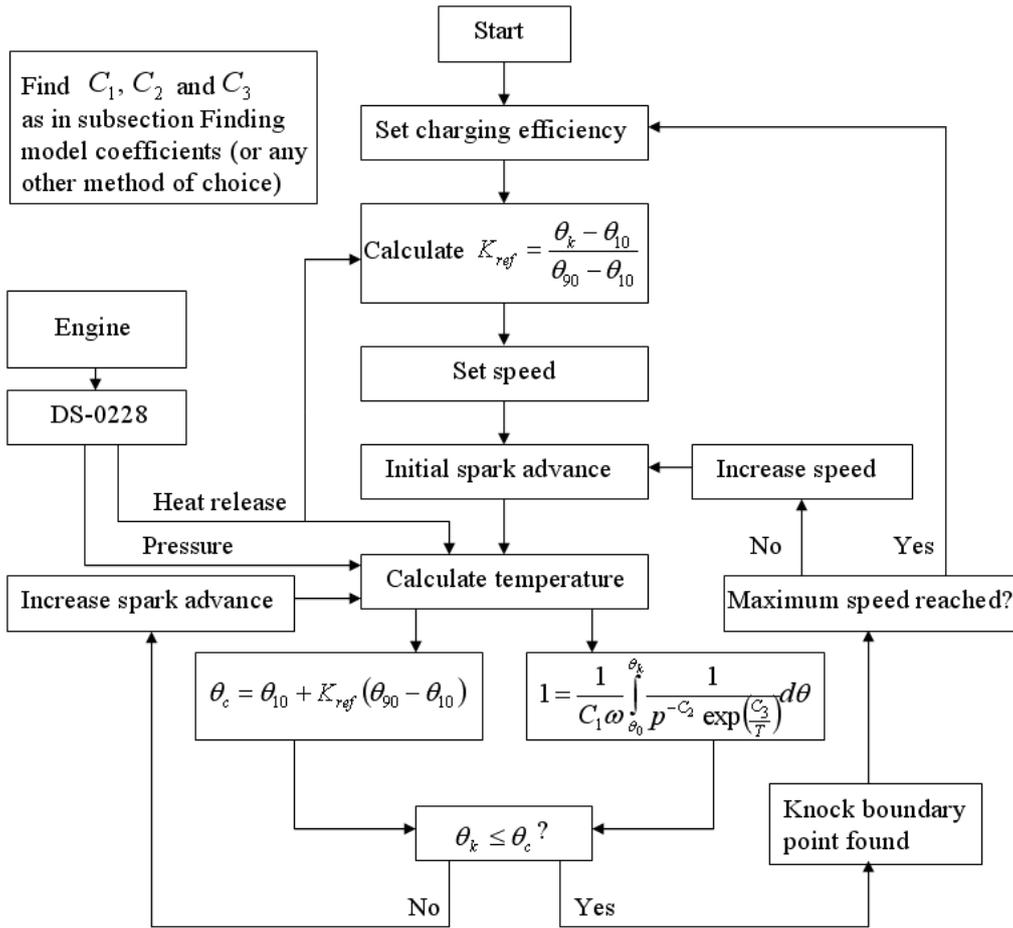


Figure A.1: Flow chart of implementation and calculations.

## B. Genetic Algorithm

The concept and function of genetic algorithms are based on the biology phenomena known as evolution and is a type of stochastic search strategy. A more general terminology of genetic algorithms is evolutionary algorithms or in the case of automatic programming, evolutionary programming. There is a lot of criticism surrounding evolutionary algorithms. This is due to the fact that it is hard to mathematically describe their functionality, how they work and how reliable they are; and since they are heuristic methods, an optimal solution is not guaranteed. There is even philosophical and metaphysical debate about these methods. Nevertheless evolutionary algorithms continue to deliver great results and have even at some points outperformed human engineering. One of the most popular examples of programs outperforming humans is an implementation of genetic programming that designed a new construction to mount antennas on satellites. It managed to create a weirdly twisted truss unimaginable to the human mind with increased oscillatory damping properties and lower weight. More extensive reading about genetic algorithms can be found in “An introduction to genetic algorithms” (Mitchell, 1998).

Genetic algorithms are based on a population of candidate solutions, also known as chromosomes. In each iteration – or generation – every chromosome is evaluated and ranked according to some fitness function and ranking rules. The probability of reproducing or even surviving to the next generation depends on the ranking of a chromosome. This process is repeated until some maximum number of generations is reached or an acceptable solution is found. As long as the solutions can be described by a chromosome and it is possible to measure some error with the fitness function, genetic algorithms are applicable to a wide area of problems.

Chromosomes are constructed by a set of genes and each gene has a number of loci. Each locus can take a value from the allele of choice, the set of valid values. Alleles are commonly binary so that the allele – or state – of a locus is zero or one. The number of loci in a gene needed is a tradeoff between complexity of the problem, precision and computational efficiency. The same goes for the population of chromosomes. Initialization of a chromosomes can be either randomly or – if available – an educated guess.

As an example, the chromosomes of the implementation used to find the knock integral coefficients have three genes, one for each coefficient. Each gene contains of 44 loci with the alleles 0 and 1 and describes, with some precision a real number.

The size of the population is 150 chromosomes and a typical number of generations are 50–100.

Evolution of chromosomes is based on genetic operators. The most important and commonly used operators are crossover, mutation and inversion:

- Crossover can be seen as breeding, where two parents create a child by combining half of their genes respectively into a new chromosome.
- Inversion is a more abstract operator that basically just invert the chromosome or some chosen subset of the chromosome.
- Mutation is another genetic operator with its foundation in biology. When a chromosome mutates it simply switch state of a randomly chosen locus.

All operations are based on probability. For example, a mutation can not happen too often since then the population never gets a chance to converge. However, it has to mutate some times or else the population will lose its diversity hence not being able to search the entire problem space. Common probabilities are 0.75 for crossover to happen, about 0.1 for inversion and 0.001 for mutation.

Finally there is the process of selection. Selection decides which chromosomes that will survive to the next generation. The decision is made by some sort of battle between the chromosomes, according to the concept “survival of the fittest”. In this implementation the roulette wheel method is used and consequently it is the only method described.

From the fitness value of a chromosome a normalized fitness is calculated and with that the cumulative norm of each chromosome is created (by calculating the cumulative sum of all the chromosomes normalized fitness). Then a set of random numbers – as many as there are chromosomes – between 0 and 1 are generated. If the random value is between the cumulative norm of a given chromosome and the cumulative norm of the chromosome prior to it in the list of chromosomes, the given chromosome is allowed to carry on to the next generation. In this process the most fit chromosomes survive in multiple copies while the worst fitted chromosomes with time disappear.

The following pseudo code implements a simple genetic algorithm that can be used to find for example the knock integral coefficients in this thesis.

```
begin
  initialize(chromosomes)
  while i < max generations do
    evaluate(chromosomes)
    if best(chromosomes) better than current best
      current best = best(chromosomes)
    end
    roulette_wheel_selection(chromosomes)
    for each chromosome do
      if rand() < 0.75
        crossover()
      end
      if rand() < 0.1
        inversion()
      end
      if rand() < 0.001
        mutation()
      end
    end
    i = i + 1
  end
end
```

## C. Mean value theorem for integrals

The first mean value theorem for integration states that if  $F$  is a continuous function on the interval  $(a, b)$  on  $\mathbb{R}$  and  $g$  is an integrable and positive semi-definite or negative semi-definite function on the interval  $(a, b)$ , then there exist a  $\xi \in (a, b)$  such that

$$\int_a^b F(x) g(x) \, dx = F(\xi) \int_a^b g(x) \, dx. \quad (\text{C.1})$$

If  $g(x) = 1$  for all  $x$  in  $(a, b)$  then there exist a  $\xi \in (a, b)$  such that

$$\int_a^b F(x) \, dx = F(\xi)(b - a). \quad (\text{C.2})$$

What this theorem says is that if the conditions are as stated above and with  $g(x) = 1$ ,  $F(\xi)$  can be considered the mean value of the function  $F$  on the interval  $(a, b)$ .

Temperature and pressure trace history are both positive definite and completely known prior to calculations thus the mean value theorem for integrals can be applied.

# D. Terminology and Nomenclature

## Terminology

### Crank angle degrees (CAD)

One four stroke cycle rotates 720 crank angle degrees – two whole revolutions – and as an example, combustion usually last some 25 crank angle degrees.

### Mass fractions burned and combustion

The percentage of fuel burned at a given crank angle degree is referred to as mass fraction burned. Combustion is most commonly defined between 10% and 90% mass fractions burned. This interval, slightly shorter than 0% to 100% mass fractions burned is due to the high level of uncertainty at the edges of combustion. It is hard to find where combustion actually end.

### Charging efficiency

A common measure of energy input and conversion is charging efficiency. Charging efficiency  $\eta_c$  is defined as

$$\eta_c = \frac{G_a}{V \frac{\omega}{120} \gamma_{a_0}} \quad (\text{D.1})$$

with  $G_a$  as air mass flow into the cylinder in g/s,  $V$  is in-cylinder volume with the piston at bottom dead center (BDC). Engine speed  $\omega$  is in RPM and  $\gamma_{a_0}$  is defined as air density at ambient pressure and temperature of 100 kPa and 25 degrees centigrade(Toy, 2005).

## Spark advance (SA)

Increasing spark advance is defined as moving the ignition point to an earlier position (in crank angle degrees) and usually somewhere BTDC; hence it is preferably expressed in CAD BTDC rather than ATDC (the latter would yield a negative increase in spark advance).

## End gas

The term end gas refers to the cooler unburned pockets of gas – as in gasoline and air mixture – ahead of the combustion flame front.

## Adiabatic compression

In thermodynamics, adiabatic compression or more commonly, an adiabatic process, is a thermodynamic process where no heat is transferred to or from the substance being compressed. An ideal gas exposed to adiabatic compression behaves slightly different than the normal ideal gas law,

$$pV^\gamma = \text{const}, \quad (\text{D.2})$$

where  $p$  is pressure,  $V$  volume and

$$\gamma = \frac{C_p}{C_v} \quad (\text{D.3})$$

with  $C_p$  as the specific heat for constant pressure and  $C_v$  the specific heat for constant volume (Johansson, 2006).

## Ignition time delay

Terminology differs between authors and ignition time delay is sometimes named auto-ignition time delay or just time delay. It is commonly used as the time between start of combustion and the timing of when auto-ignition occurs (or the time of critical exposure needed for any fuel to combust).

## Nomenclature

Abbreviations	
ABDC	After Bottom Dead Center
ATDC	After Top Dead Center
BDC	Bottom Dead Center
BTDC	Before Top Dead Center
CAD	Crank Angle Degrees
CFR	Cooperative Fuel Research (engine)
ECAM	Electronic Cam
ECU	Engine Control Unit
RON	Research Octane Number
RPM	Revolutions per Minute
SA	Spark Advance
SI	Spark Ignited (engine)
TDC	Top Dead Center

Symbol and Variable Descriptions	
$\eta_c$	Charging efficiency
$G_a$	Air mass flow
$V$	Cylinder volume (piston at BDC)
$V_{ig}$	Volume at ignition timing
$\omega$	Engine speed (RPM)
$\gamma_{a_0}$	Ambient air density
$p$	Pressure
$\bar{p}$	Mean pressure
$p_{ig}$	Pressure at ignition timing
$const$	Arbitrary constant
$C_v$	Specific heat for constant volume
$C_p$	Specific heat for constant pressure
$\gamma$	$C_p/C_v$
$k$	reaction rate constant
$A$	Arbitrary pre-exponential factor
$E$	Arbitrary activation energy
$R$	Gas constant
$m$	mass

Symbol and Variable Descriptions	
$\tau$	Ignition time delay
$t$	Time
$t_k$	Timing at onset of knock
$t_0$	Start of calculations
$C_1, C_2$ & $C_3$	Knock model coefficients
$x_c$	Critical concentration
$\theta$	Crank angle degrees
$\theta_k$	Crank angle at onset of knock
$\theta_0$	Start of calculations
$\theta_{soc}$	Crank angle at start of combustion
$\theta_{eoc}$	Crank angle at end of combustion
$\theta_{10}$	Crank angle at 10% mass fraction burned
$\theta_{90}$	Crank angle at 90% mass fraction burned
$\theta_c$	Critical crank angle
$\theta_{ig}$	Crank angle of ignition timing
$T$	Temperature
$\bar{T}$	Mean temperature
$T_u$	Unburned end gas temperature
$T_{sz}$	Single zone temperature
$T_{sz,ig}$	Single zone temperature at ignition timing
$T_b$	Burned gas temperature
$T_{u,i}$	Initial unburned gas temperature
$K$	Defined by equation (3.22)
$K_{ref}$	Reference $K$ -value

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