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# Study on Judgment Method of Combustion Mode on dual-mode Scramjet

Q. Chen<sup>a</sup>, L. H. Chen<sup>a</sup>, H. B.Gu<sup>a</sup>, X. Y.Zhang<sup>a</sup>, P. Wang<sup>b,\*</sup>

<sup>a</sup>State Key Laboratory of High-Temperature Gas Dynamics, Institute of mechanics, Chinese academy of sciences, Beijing, 100190, China <sup>b</sup>China University of Petroleum, Beijing, 102249, China

#### Abstract

It was very significant to judge the combustion mode of engine correctly, because the distributions of fuels and other parameters of combustion mode switching depended on it. This paper proposed to a judgment method of combustion mode of engine, namely artificial neural network method, based on the dual-mode scramjet experiments and analysis results. It made use of experimental measurement values, and the parameters along engine were obtained through one dimensional analysis. This method provided the basis for the combustion mode design of engine in the future.

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Keywords: Combustion mode, Scramjet, Artificial neural network

## Nomenclature

A area

 $C_{f}$  skin friction coefficient

 $C_{\text{final}}$  coefficient of fuel distribution

 $c_p$  specific heat at constant pressure

h specific enthalpy

M Mach number

p static pressure

 $R_{4a}$  area ratio of combustor outlet to inlet

statictemperature

<sup>\*</sup> Corresponding author. Tel.: +86-10-89731770. *E-mail address:* wangpei@amss.ac.cn

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velocity
X_{H,O,vit} mole fraction of water vapor in the vitiator products
         position in x-direction
x
Y
         mass fraction
Greek symbols
         ratio of specific heat
         combustionefficiency
η
         stoichiometric combustion efficiency
\eta_{sto}
         density
ρ
         stoichiometric ratio
Subscripts
         component
```

#### 1. Introduction

In the range of flight altitude 18~30 km and fight Mach number 4~7, the dual-mode scramjet with hydrocarbon fuels is one of the most competitive air breathing propulsion systems [1, 2]. In order to maintain the high performance of engine in the range of flight altitude and Mach number, the combustion mode in combustor is necessary to be switched [3]. In general, at lower flight altitude and Mach number, an engine with subsonic combustion mode attains higher performance than an engine with supersonic combustion mode. On the contrary, a supersonic combustion mode engine has the higher performance at higher altitude and Mach number. It was very significant to judge the combustion mode of engine correctly, because the distributions of fuels and other parameters of next combustion mode switching depended on it.

With the drastic development of computer technology, the artificial neural network method had made great applications in many fields, such as high performance aircraft autopilots, flight path simulations, aircraft component fault detectors [4]. One of the most important applications was pattern recognition technology. A neural network was able to learn to recognize the pattern from the observed data or experiment data. That was a novel method to judge the combustion mode of dual-mode Scramjet engine.

Based on the dual-mode scramjet experiments and analysis results, this article proposed to a judgment method of combustion mode of engine, namely artificial neural network method. It made use of experimental measurement values, such as burned and unburned pressure distributions, fuel injection positions, and fuel equivalence ratios. The parameters along engine were obtained through one dimensional analysis. Then they were treated as learning cases of the neural network. After being trained by the learning cases, the judgment model was established, providing the basis for the combustion mode design of engine in the future.

# 2. Experimental Setup and Analysis Method

# 2.1. Experimental Setup

The experiments applied to the paper were performed on the direct-connected facility which was specially designed for dual-mode scramjet combustor experiments. The experimental gas was heated by a vitiator, which burned hydrogen and replenished oxygen to maintain oxygen mole percentage at 21% in the experimental gas. There were two types of condition at the entrance of isolator. The details of the flow parameters were shown in

Table 1.

Mach number	Total temperature(K)	Total pressure (MPa)	Mass ratio(kg/s)
1.8	950	0.6	1.8
2.5	1650	1.0	1.2

Table 1Operation parameters of facility

There were also three types of test models, which were named as Model-1, Model-2, and Model-3 to perform experiments. The schematics of the test models were shown in Fig.1. The test model consisted of isolator, combustor and nozzle. Three models had the same isolator. The differences of the models were the expansion angels of the combustor. The combustor of Model-1 had three expansion sections with angles of 1.5°, 2.0° and 3°. However, Model-2 and Model-3 only had two expansion sections and the angles were 1.5°, 2° and 1.5°, 3° respectively. The fuel  $C_2H_4$  was injected into and burned in a cavity-based flame holder. The positions of fuel jet were shown in Fig.1.

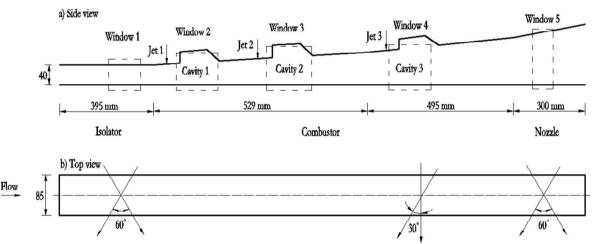


Fig. 1Schematic of direct-connected scramjet test facility

#### 2.2. Quasi 1-D AnalyticalMethod

In order to analyze the experimental data deeply, this paper developed a quasi-1-D analytical model based on the experimental data. One step chemical reaction was assumed that includes only the major species of  $C_2H_4$ ,  $H_2O$ ,  $CO_2$ ,  $O_2$ , and  $N_2$ . The chemical equation was shown in Equ.(1)where  $\phi$  and  $\eta$  respectively represented stoichiometric ratioand combustion efficiency.  $X_{H_2O,vit}$  was the mole fraction of water vapor in the vitiator products.

$$\phi C_2 H_4 + 3 \left( O_2 + \frac{X_{H_2 O, vit}}{0.21} H_2 O + \left( 3.76 - \frac{X_{H_2 O, vit}}{0.21} \right) N_2 \right) = (1 - \eta) \phi C_2 H_4 + 3 \left( 1 - \phi \eta \right) O_2 + \left( 2\phi \eta + 3 \frac{X_{H_2 O, vit}}{0.21} \right) H_2 O + 2\phi \eta C O_2 + 3 \left( 3.76 - \frac{X_{H_2 O, vit}}{0.21} \right) N_2$$

$$(1)$$

Equ.(2)~(5) were the governing equations of the analytical method. They were mass, momentum, energy conservation equations and state equation. Assuming that the combustor wall was adiabatic, the term of convective heat transfer did not exist in Equ.(3).

$$\frac{\mathrm{d}\,\rho}{\mathrm{d}\,x} = -\frac{\rho}{V}\frac{\mathrm{d}\,V}{\mathrm{d}\,x} - \frac{\rho}{A}\frac{\mathrm{d}\,A}{\mathrm{d}\,x} \tag{2}$$

$$\frac{\mathrm{d}V}{\mathrm{d}x} = -\frac{V}{\gamma M^2} \left( \frac{1}{p} \frac{\mathrm{d}p}{\mathrm{d}x} + 2 \frac{\gamma M^2 C_f}{D} \right) \tag{3}$$

$$\frac{\mathrm{d}T}{\mathrm{d}x} = -\frac{1}{c_n} \left( \sum_i h_i \frac{\mathrm{d}Y_i}{\mathrm{d}x} + V \frac{\mathrm{d}V}{\mathrm{d}x} \right) \tag{4}$$

$$\frac{1}{\rho} \frac{\mathrm{d}\rho}{\mathrm{d}x} + \frac{1}{T} \frac{\mathrm{d}T}{x} - \frac{1}{p} \frac{\mathrm{d}p}{\mathrm{d}x} = 0 \tag{5}$$

The skin friction coefficient  $C_c$  in Equ.(3)was determined using the method given by JAXA [5]where:

$$C_f = \frac{0.38 \left(1 + \frac{\gamma - 1}{2} M^2\right)^{-0.467}}{\left(\log \operatorname{Re}_x\right)^{2.58}} \tag{6}$$

For the governing equations, a continuous wall pressure distribution p(x) wasneeded to solve the equations system. This distribution function could be obtained from the discrete experimental data by creating 3-peak Gaussian fits. The Gaussian peaks were encountered in many areas of science and engineering, and was given by

$$p = \sum_{i=1}^{3} a_i \exp \left[ -\left(\frac{x - b_i}{c_i}\right)^2 \right]$$

Where a, b, c were respectively the amplitude, the centroid (location) and the peak width. The engineering enthalpy of each species was a function of the temperature  $(h_i(T))$  [6]. These values were obtained at a given temperature from the tabulated thermodynamic data in the Burcat's report.  $Y_i$  was the mass fraction of species i, and the term  $dY_i/dx$  could be written as the function of  $d\eta/dx$ . Because the mole quantities did not change during the processing of  $C_2H_4$  combustion, the average molecular weight did not change. So, the state equation could be written as Equ.(5).

In the system of equations, there were nine unknownvariables which were  $\rho$ , V, T,  $\eta$ ,  $Y_i$ . And there were also nine differential equations including four equations of  $dY_i/dx$  and  $d\eta/dx$ . So, the equations system could be integrated through the numerical method.

#### 2.3. Radial Basis Function (RBF) neural network

RBFneural network (Fig.2) was a feed forward network with three layers based on regularization theory. A Gaussian RBF monotonically decreased with distance from the center (Fig.2(b)). So,Gaussian-like RBFs were local (give a significant response only in a neighborhood near the response only in a neighborhood near the center) and are more commonly used than multiquadric-type RBFs which have a global response. They are also more biologically plausible because their response is finite.

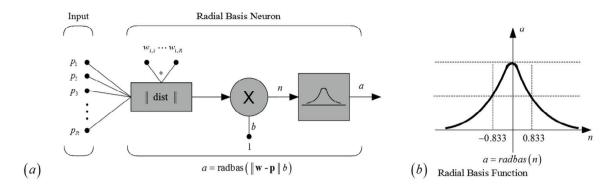


Fig.2Architecture of RBF neural networks,(a) Radial basis neuron,(b) Radial basis function

At present, the RBF Neural network can deal well withthe problem including classification and pattern discrimination. The problem of Scramjet combustion modes diagnose belonged to the category. RBF Neural network required a supervised learning the existing classification results, then the network would update the weights of neurons. After the learning processing was completed, the network would be able to classify the new inputs.

In this paper, considering the characteristics of scramjet combustion parameters, the inputs of RBF network in this problem were listed in Table 2.  $R_{Ac}$  represented the extend of combustor expansion,  $C_{fuel}$  represented the conditions of fuel distribution, and the bigger the value was, the distribution of fuel was near to the combustor outlet.  $\eta_{sto}$  represented the relative quantities of heat release.

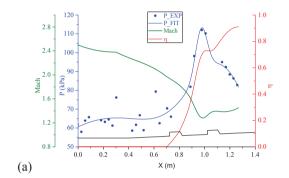
Input	Expression	Range of input	Clarification
$M_{iso,in}$	-	1.8, 2.5	Mach number at outlet of isolator
$R_{Ac}$	$A_{combustor,out} / A_{combutor,in}$	1.8525, 1.895, 1.9825	Area ratio of combustor outlet to inlet
$C_{\mathit{fuel}}$	$\sum (\phi_{i}/\phi) \cdot (x_{\mathit{fuel\_jet\_i}}/L_{\mathit{combustor}})$	0.55~0.86	Coefficient of fuel distribution
$\eta_{\scriptscriptstyle sto}$	$\eta \cdot \phi$	0.12~0.55	Stoichiometric combustion efficiency

#### 3. Results and Discussion

# 3.1. Analysis of the experimental results

There had been 30 experiments with different conditionsfor three types of engine models, which were carried out at the direct-connected scramjet test facility. Among the experiments, there were 14 times of experiments whose condition of the entrance was Mach number 1.8, and other experiments were Mach number 2.5. The fuel equivalence ratio was between 0.3 and 0.8 at these experiments. In Fig.3, two typical experimental parameters distributions were shown. The blue dotsshowed in the illustrations represented the experimental pressure distributions along the combustor. The black lines at the bottom of the figure depicted the inner passage of the combustor. The Mach number at the entrance was 2.5 in Fig.3(a), 1.5 in Fig.3(b). And the other detailed flow parameters at entrance were shown in Table 2 and Table 3. In experiment (a) the fuel  $C_2H_4$  was injected into the combustor at two different positions and the total equivalent ratio was 0.38. In experiment (b), the fuel  $C_2H_4$  was injected into the combustor at 4 positions and the equivalent ratio was 056. At the aspect of the distribution parameter of fuel  $C_{fuel}$ , the fuel layout of the experiment (a) was front of experiment (b) relatively.

Applying the quasi-one-dimensionanalytical method mentioned in section 2.1, the distributions of parameters could be obtained in the combustor. The distributions of Mach number (green lines), static pressure P (blue lines), and combustion efficiency (red lines) were shown in Fig.3. The figure showed that the trend of static pressure distribution measured by experiments was well fitted through the method of Gaussian fitting. Experiment (a) was at supersonic combustion mode, because the Mach number was is greater than 1 in the combustor. However, for experiment (b), Mach number was under 1 in some region, though the flow returned to supersonic flow at back of combustor. So, experiment (b) would be judged as the subsonic combustion mode. At the aspectof combustion efficiency, the combustion of supersonic mode was relatively severer than subsonic mode, because combustion efficiency curve of supersonic mode rose rapidly the shorter region. However, the efficiency curve of subsonic combustion modewas more uniform in combustor.



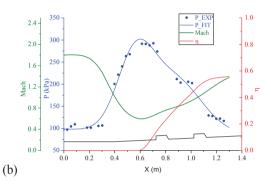


Fig.3 Distributions of flow parameters in the combustor for (a) supersonic combustion mode and (b) subsonic combustion mode

Input	(a)	(b)	
$M_{{\scriptscriptstyle iso,in}}$	2.5	1.8	
$R_{Ac}$	1.982	1.895	
$C_{\mathit{fuel}}$	0.77	0.81	
. $\eta_{ extit{sto}}$ .	0.35	0.32	

Table 3 Parameters of experiment (a) and (b)

# 3.2. RBFneural networkmodeling

Depending onMach number distribution along the engine, the combustion mode of the experiment could be judged.For 30 experiments under different working conditions, the distributions of Mach number could be obtained through the method introduced in section 2.1. Then the RBFneural network model for combustion mode determining ould be established according to the method from section 2.2. The RBF neural network's inputs contained four groups of parameters were shown in Table 2.

In order to verify the robustness of the network, the 25 samples were randomly selected from 30 experiments as the training set. And the five rest samples (twoexperiments of supersonic combustion mode and three experiments of subsonic combustion mode) were used as the test set, to verify the judgment ability of the network.

The neural network of mode determining wasconsisted of 25 neurons and divided into two layers. By learning from samples, the neuron weight matrix wasupdated. For the five test samples, the network had predicted the combustion mode rightly. Namely, the RBF neural network had good adaptability to the problemsof combustion mode classification.

## 3.3. The parameters analysis of engine combustion mode

The parameter analysis of combustion mode was carried out in this paper through RBF neural network model. The supercritical curve of supersonic/subsonic combustion mode was obtained when some parameters was fixed. Fig. 4 showed the combined effects of the coefficient of fuel distribution  $C_{fuel}$  and stoichiometric combustion efficiency  $\eta_{sto}$  on combustion mode when  $M_{iso}$  in and  $R_{dc}$  were fixed.

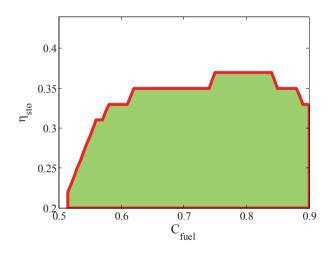


Fig.4 Effects of  $\,C_{\it fuel}\,$  and  $\eta_{\it sto}$  onthe combustion mode

Fig.4 showed when the situations were in the green range, the scramjet was at supersonic combustion mode. But other regions the scramjet was at subsonic combustion or unstarted mode. It also could be known when  $C_{fuel}$  is smaller than 0.65 (fuel was mainly injected at the forward section of combustor), the engine mode was affected by the combined influences of  $C_{fuel}$  and  $\eta_{sto}$ . The engine could not maintain the supersonic modeunless the fuel mainly released heat at back of combustor when  $\eta_{sto}$  rose. When  $C_{fuel}$  was greater than 0.65, the relationship between mode and fuel distribution coefficient of the engine was no longer significant. In addition, when  $\eta_{sto}$  was greater than 0.35, the engine could not maintain supersonic mode no matter how the fuel distribution in the combustor. The engine would turn into the subsonic or unstarted mode.

# 4. Conclusions

In this paperthe combustion mode of dual-mode scramjet judgment method was developed. Direct-connected experimental results of three scramjet combustor models and two entrance situations were analyzed by a one-dimensional method. The important parameters were obtained, such as  $C_{\textit{fuel}}$ ,  $\eta_{\textit{sto}}$  and the combustion mode. Then the judgment model based on the RBF neural network was built by learning the obtained combustion mode. The followings were the conclusions:

- (1) One-dimensional analysis methodwas able to calculate the flow parameters of the engine combustor effectively.
- (2) RBF neural network models could be applied to judgethe engine combustion mode, and the accuracy of judgment was acceptable.
- (3) Under the inner geometryand entrance conditions unchanged, the combustion mode was affected by  $C_{\it fuel}$  and  $\eta_{\it sto}$  when  $\eta_{\it sto}$  was relatively small. However, when  $\eta_{\it sto}$  was larger, the combustion modewas less affected by  $C_{\it fuel}$ .

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