

# The Evaluation Index System of Technology Maturity: Taking Hybrid Electric Vehicle as an Example\*

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**Abstract:** Technology maturity, as an important indicator to measure development state and future trends of technology, can effectively control the risk of technology research and application. It is widely used in technology prediction of national defence, high-tech and strategic emerging industries. Based on a comprehensive review of the existing evaluation method and application research of technology maturity, a multi dimension evaluation model is proposed, including the proportion of papers, patents and references, the density and efficiency of patent network, a total of ten indicators, which overcomes the defect of single index. And taking the hybrid electric vehicle as an example, the calculated results show that, the hybrid electric vehicle technology has been mature in 2003, and entered into a new boom period after 2009, because of the new breakthroughs in scientific research.

**Index Terms** - technology maturity; evaluation index system; hybrid electric vehicle

## 1. Literature review of technology maturity

In abroad, the research of the technology maturity has begun long time ago, the United States is the first to study and analysis this theory<sup>[1]</sup>. Domestic scholars have researched this theory since the 1990 s. Overall, the existing researches on technical maturity can be classified into the following several direction.

### 1.1 Based on the TRL technical maturity level evaluation research

In the 1970s, NASA put forward the Technology Readiness Level (TRL) to divide the technical maturity into nine grades as the initially standard level to evaluate the maturity of the new technology. This is the first evaluation metrics of technical maturity. Mankins first tried to use TRL to establish the difficulty index and the methodology of maturity<sup>[2]</sup>. Mr. William in the research on the basis of research of NASA's TRL invented the product technical maturity calculator<sup>[3]</sup>. In domestic, Lan Yuanpei and Guan Zhidong based on the TRL method classified the maturity level of aviation composite technology<sup>[4]</sup>. Wang Gang, Chen Xiang dong and Niu Xin made the research on the coordination mechanism of aerospace products R&D project based on TRL. This system provides reference for aerospace enterprise to build normative R&D mechanism and the corresponding technical maturity management mechanism<sup>[5]</sup>.

### 1.2 Based on the theory of TRIZ technical maturity prediction research

The professor G. S. Altshuller of former Soviet union found that the change trend of the number of patents related to product technology development stage, and it is concluded

that there is a corresponding relationship between invention of the product quantity, level of invention, performance and profitability and s-shaped curve of technology life cycle, thus it is concluded that four standard curve<sup>[6]</sup>. Kow Alick called these four standard curves The Four Relationship Curves Operator (FRCO)<sup>[7]</sup>. Domestic scholars Li Zhiguang and Tan Runhua applied the S-curve of technology maturity prediction method of TRIZ theory to the liquid crystal display technology for the first time<sup>[8]</sup>. Wang Kun, Gao Yuhang and Yuan Shixiong used the product technology maturity prediction technology of TRIZ theory on education and game industry to predict the product technology maturity, and draw the product technology maturity prediction curve<sup>[9]</sup>.

### 1.3 Based on the bibliometrics technical maturity stage research

Roper thought the ratio between the number of journal papers and the number of conference papers could be used to analyze the product technology maturity<sup>[10]</sup>. Godin B thought we could analyze product technology maturity by changes of keywords nature in literature<sup>[11]</sup>. Martino mainly used the nature and the number of changes of relevant literature about product technology to judge technology maturity<sup>[12]</sup>. Lou Yan, Fu Xiaoyang, Huang Lucheng come up with a series of methods of bibliometrics to analyze technology maturity, provides a new way of thinking and methods for maturity of technology evaluation<sup>[13]</sup>.

## 2. Evaluation index system of the Hybrid electric vehicle industry technology maturity

### 2.1 Design Evaluation System

Most of the previous studies used a single indicator or a few indicators to determine the technical maturity of products; it is difficult to make a comprehensive, accurate and efficient determination of technical maturity. In view of this, this paper based on bibliometrics and patent statistical analysis, build a a multi-dimensional technology maturity evaluation index model, including the ratio of conference papers and journal papers, the ratio of EI papers and SCI papers, the ratio of the process patents and the total number of patents, the growth rate of the number of patents, the structural efficiency of patent network, patent network density, papers homogeneity, patents heterogeneity, spatial structure of patents distribution, and the ratio of patent citation and paper citation ten indexes, as shown in Table 1.

\* Fund project: Henan Science and Technology Research Project (142102310141, The research on long-term development program model and key technology of Henan technology-economy system; 132102310528, Research on population resources and environment harmonious control key technology of Henan province); Key Project of National Natural Science Funds (71033002, the research on national independent innovation system internationalization theory and policy under the framework PORC).

Table 1 Evaluation Index System of Technology Maturity

Index	Computing Method	Meaning
the ratio of conference papers and journal papers	The number of conference papers/The number of journal papers	Reflect the importance of conference communication to the journal papers
the ratio of EI papers and SCI papers	The number of EI papers/The number of SCI papers	Reflect the importance of the engineering application relative to the basic research
the ratio of the process patents and the total number of patents	The number of process patents/The total number of patents	Reflect the ratio of the process patents and the product technology patents
the growth rate of the number of patents	(The total number of patents in the $t$ year – The total number of patents in the $t-1$ year)/The total number of patents in the $t$ year	Reflect the growth rate of patents
the structural efficiency of patent network	Structural holes index data calculated by Ucinet	Reflect the degree of the patent network structure interaction and network overall effectiveness
patent network density	Whole network density index data calculated by Ucinet	Reflect the density of patent network
papers homogeneity	Formula: $1 / \sum_{i=1, \dots, m} (Y_i / Y)^2$ Ps: $Y_i$ is the number of papers in the field $i$ , $Y$ is the total number of papers.	Reflect the papers repetitiveness.
patents heterogeneity	Formula: $HI = \sum_{i=1, \dots, m} (X_i / X)^2$ Ps: $X_i$ is the number of patents in the field $i$ , $X$ is the total number of patents.	Reflect the degree of innovation of patents.
spatial structure of patents distribution	The number of patents in Japan/The total number of patents in the world	Reflect the spatial concentration distribution of patents.
the ratio of patent citations and paper citations	The number of patent citations/The number of paper citations	Reflect the importance of patents to papers

## 2.2 Methods of data collection and index calculation

In this paper, take the hybrid vehicles as the example of new energy vehicles, estimates the maturity of hybrid vehicles technology. According to the technical maturity evaluation model established in this paper, we should collect these data about hybrid vehicle industry, including the number of EI papers, SCI papers, conference papers, technical patents, all of patents and other data. English presentation of hybrid cars are mainly Hybrid Electric vehicle and Hybrid vehicle two kinds, which were referred to as "HEV" and "HV", other major classification codes of hybrid vehicle patents application are X21-A01D, X22-P04A, X22 -P04 and X21-A01D1, which also represents the theme of hybrid vehicle technology, as shown in Table 2. In this paper, a hybrid vehicle-related data collected in 1991-2013, the specific collection method is as follows in Table 2.

Table 2 Major Classification Codes of Hybrid Vehicle Patents Application

MC	Technology Topic
X21-A01D	Hybrid electric vehicle, use motor and engine
X22-P04A	Electric hybrid vehicles
X22-P04	Hybrid vehicles
X21-A01D1	parallel hydraulic hybrid vehicle

## 3. Calculation and analysis of Hybrid vehicle technical maturity

### 3.1 Evaluation index system of technology maturity data set

According to the above index data collection method, calculate the each year data of hybrid vehicles technical maturity evaluation index system in 1991-2013, as shown in table 3.

Table 3 Evaluation index system of technology maturity data set (partial data)

Year	the ratio of conference papers and journal papers( $X_1$ )	the ratio of EI papers and SCI papers( $X_2$ )	the ratio of the process patents and the total number of patents( $X_3$ )	the growth rate of the number of patents( $X_4$ )	the structural efficiency of patent network( $X_5$ )	patent network density( $X_6$ )	papers homogeneity( $X_7$ )	patents heterogeneity( $X_8$ )	spatial structure of patents distribution( $X_9$ )	the ratio of patent citations and paper citations( $X_{10}$ )
1991	0.1079	0.7597	0.2101	0.0080	0.0000	0.0000	1.6277	0.0933	0.0111	1.7110
1995	0.1030	0.7939	0.2485	-0.1605	0.3200	0.1607	4.2261	0.1846	0.0368	1.6157
2000	0.1962	1.0256	0.8124	0.4661	0.5000	2.0179	4.9494	1.5346	0.2911	1.0785
2001	0.1635	1.1034	0.8245	-0.0146	0.4100	3.4464	5.5428	1.5152	0.2991	0.9336
2005	0.1953	1.8891	0.9505	0.1589	0.4900	7.3929	5.4768	1.7580	0.4196	2.1983
2010	0.1153	1.8689	0.9837	0.1506	0.1900	22.1071	6.4364	1.4035	0.3836	4.5076
2013	0.1436	1.5361	0.9835	0.2084	0.5700	14.0536	5.1202	1.3288	0.2972	10.7294

### 3.2 Calculation and analysis of Hybrid vehicle technical maturity

In this paper, using Principal Component Analysis (PCA) analyze the hybrid electric vehicle technology maturity index data (table 3). First take principal component analysis for ten indicators data of standardization, its 10 characteristic value and the corresponding contribution rate as shown in table 4.

Table 4 Characteristic value and contribution rate of each index

Index	Characteristic Value	Contribution Rate
1	5.92	59.202
2	1.718	17.176
3	0.824	8.24
4	0.706	7.06
5	0.326	3.263
6	0.224	2.239
7	0.176	1.76
8	0.076	0.757
9	0.026	0.257
10	0.005	0.046

The table 4 shows that the contribution rate of first two indicators of were 59.2%, 17.17%, their cumulative contribution rate is 76%, thus it can be used for make evaluation of each index. By principal component analysis (PCA), the first two principal components and the weight of each index as shown in table 5.

Table 5 First Two Principal Components and the Weight of Each Index

Index	First principal components	Second principal components	weight
the ratio of conference papers and journal papers	0.270	0.494	0.1347
the ratio of EI papers and SCI papers	0.373	-0.186	0.1039
the ratio of the process patents and the total number of patents	0.400	-0.039	0.1266
the growth rate of the number of patents	0.255	0.030	0.0859
the structural efficiency of patent network	0.132	0.511	0.0913
patent network density	0.320	-0.400	0.0664
papers homogeneity	0.338	0.108	0.1203
patents heterogeneity	0.385	0.108	0.1356
spatial structure of patents distribution	0.392	0.033	0.1308
the ratio of patent citations and paper citations	0.166	-0.523	0.0046

Then, by the original data and the weight of each index, calculate the standard value, set up the following technical maturity formula as shown in (1), it can measure hybrid vehicle technical maturity index for every year.

The evaluation model of the maturity of the technology:

$$I = \sum_{i=1}^{10} \theta_i X_i / X_{i0} \quad (1)$$

In formula (1),  $I$  is the technology maturity,  $X_i$  is the actual value of the index  $i$ ;  $\theta_i$  is the weight of the index  $i$ , it can be calculate by principal component analysis;  $X_{i0}$  is the standard value of the index  $i$ .

In figure 1 can be found, the hybrid vehicle technology in the world got mature in 2003, and after 2009 because of a new technological breakthrough, makes technical maturity index appeared a downward trend, it is realistic. In fact, the Toyota Prius hybrid cars released 1997 technical maturity is reached 58%.

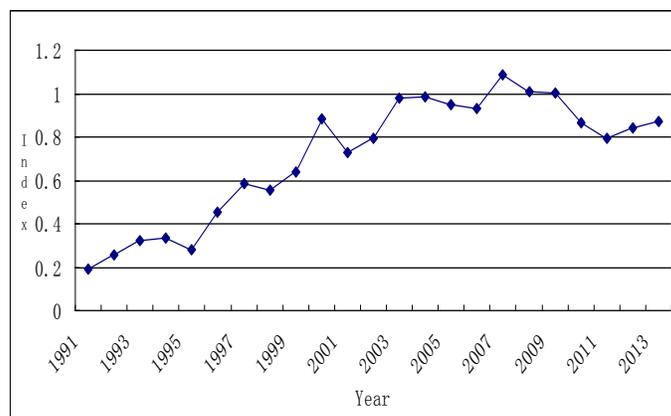


Figure 1 The tendency of the Hybrid electric vehicle technology maturity indicators

### 4. Conclusion

(1)Based on the TRL theory, TRIZ theory, scientometrics, patentometrics and other theories and methods, learn from analysis methods such as Fisher-Pry model, a multi-dimensional technology maturity evaluation index system model can be constructed include the ratio of conference papers and journal papers, the ratio of EI papers and SCI papers, the ratio of the process patents and the total number of patents, the growth rate of the number of patents, the structural efficiency of patent network, patent network density, papers homogeneity, patents heterogeneity, spatial structure of patents distribution, and the ratio of patent citation and paper citation ten indexes.

(2) This multi-index evaluation system model overcome the shortcomings of single indicators evaluation system; make a more comprehensive evaluation of technology maturity. Hybrid vehicles estimates indicate that the world's hybrid vehicle technology has matured in general in 2003. And when Toyota released the hybrid vehicle Prius in 1997, the hybrid cars technology maturity of the world had got 58%.

(3) However, later in 2009, hybrid vehicle technology has made new breakthroughs on scientific research. The proportion of Japanese patent, the patent network density, the ratio of EI papers and SCI papers, the ratio of the conference papers and journal articles, papers homogeneity and other indicators declined, indicating that the hybrid vehicle technology innovation has entered a new period.

(4) From the overall perspective of the technology track, including nickel-metal hydride battery technology track (such as Toyota) and lithium-ion battery technology tracks (such as BYD), estimate the hybrid vehicles technical maturity around the world. It is the world's overall estimates. For a technical track, for example, nickel-metal hydride battery technology track, its technology has reached maturity period much earlier than 2003; while for the lithium-ion battery technology track, the technology got mature period later than 2003.

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