

**Paper Published in Online Edition of
SCI-listed International Academic Journal *PeerJ Computer Science*
Sensitization Properties in Cosmetic Compounds**

PIGEON MANUFACTURING (SHANGHAI) CO., LTD. (Location: Qingpu District, Shanghai; Chairman: Ken Kaku), a subsidiary of Pigeon Corporation (Headquarters: Tokyo; President: Ryo Yano) responsible for advancing baby skin research within the Pigeon Group, is pleased to announce that its research paper regarding the "Detection and Evaluation of Skin Sensitizing Components using Machine Learning (AI)" has been published in the online edition of the SCI-indexed international academic journal, *PeerJ Computer Science*. The research was conducted at the company's Pigeon Skincare Research Center.

In its recent research, PIGEON MANUFACTURING (SHANGHAI) CO., LTD is exploring new methods for identifying latent allergens included in skincare compounds. When certain chemical substances come into contact with the skin, the body interprets them as a foreign substance, and subsequent contact with the same substance can make allergic reactions more likely. This is called *skin sensitization*. The animal testing formerly conducted to test for skin sensitization properties is now restricted, increasing the need for accurate non-animal testing methods. PIGEON MANUFACTURING (SHANGHAI) CO., LTD has a policy of not performing animal testing to confirm at the product development stage whether skin sensitization occurs. As an alternative method, it developed a system combining two kinds of skin cells: HaCaT keratinocytes and THP-1 cells. These cells were prepared to use machine learning technology. This led to the development of a better method for testing for skin sensitization properties, with no need to rely on animal testing.

Summary of research paper

Background

To improve the precision of identifying allergens in cosmetics, a system was developed combining two kinds of skin cells: HaCaT keratinocytes and THP-1 cells. These cells were prepared to be usable in machine learning technology. The objective was to establish a superior method for evaluating skin sensitization properties without relying on animal testing.

Methods

First, the aforementioned cell system combining two types of cells, HaCaT keratinocytes and THP-1 cells, was exposed to various chemical substances. By confirming cell health, we discovered safe exposure levels. Next, we extracted RNA from THP-1 cells and analyzed it using the genetic analysis technology RNA-Seq. From this analysis, we identified the genes that indicated different activation levels when exposed to chemical substances. After that, we processed and analyzed this data using various machine learning methods and constructed a model that can predict whether a substance will cause skin sensitization. Eight different

machine learning methods were tested and compared.

Results

This unified approach was proven effective. Several machine learning models showed high precision in predicting skin sensitization properties. The most superior models, “Random Forest” and “voom-based diagonal quadratic discriminant analysis (voomDQDA)” reached 100% precision in testing. Other models, such as “Support Vector Machine (SVM)” and “voom-based nearest shrunken centroids (voomNSC)” also showed extremely high performance at 96.7%. These results indicate that this method is able to successfully differentiate between substances that cause sensitization properties and those that do not.

Discussion

This research shows that it is possible to create a more accurate and comprehensive lab test for skin sensitization properties by combining a skin culturing system, advanced genetic analysis (RNA-Seq), and machine learning. This insight is a step forward in evaluating the safety of cosmetics and could prove useful in reducing the need for animal testing. The researchers discovered that the data preparation methods and genetic feature selection methods affect the model’s predictive precision. Issues such as sample size and model interpretation remain, but this research offers valuable insight for future development in this field.

Fig. 1. Using THP-1 cells to evaluate the cell toxicity of 15 types of test compound at concentrations between 1000 $\mu\text{g}/\text{mL}$ and $3.9\mu\text{g}/\text{mL}$. The cells’ survival rate was evaluated using a CCK-8 assay 48 hours after processing.

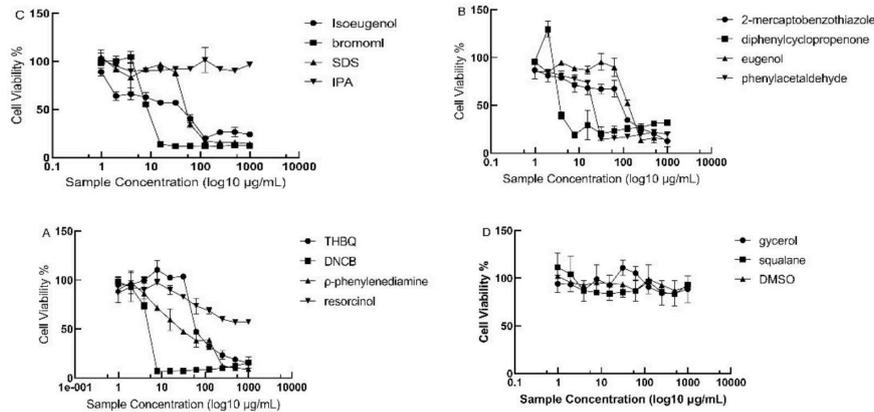


Fig. 2. Analysis of different expressed genes. (A) PCA of allergy and non-allergy group. (C) DEG volcano plot.

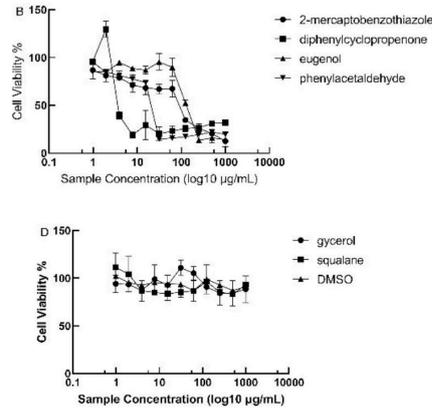


Fig. 3. WGCNA analysis. (A) Gene dendrogram obtained via clustering differences. (B) Relationship between consensus module feature genes and allergies.

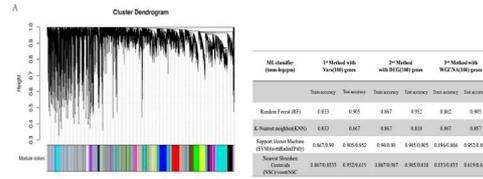
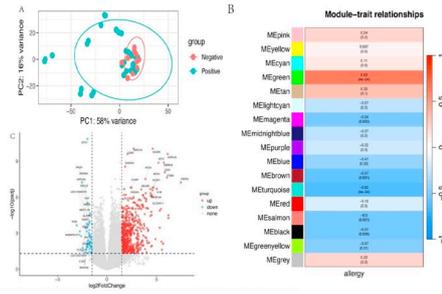


Table Comparison of Training and Test Accuracies for Three Feature Selection Methods Using different Processing

ML classifier (Base feature)	1 st Method with Top100 genes	2 nd Method with 10000 genes	3 rd Method with WGCNA300 genes	4 th Method with WGCNA300 genes	
Random Forest (RF)	0.875	0.838	0.867	0.862	0.865
E-Nearest Neighbor (EN)	0.867	0.838	0.867	0.867	0.867
Support Vector Machine (SVM) with Radial Basis Function (RBF) kernel	0.8233803	0.8053807	0.8050383	0.8050383	0.806190
Support Vector Machine (SVM) with Linear kernel	0.8233803	0.8053807	0.8050383	0.8050383	0.806190
Support Vector Machine (SVM) with Polynomial kernel	0.8233803	0.8053807	0.8050383	0.8050383	0.806190



The Pigeon brand offers baby care products, maternity products, and childcare services. By providing products and services based on more than 60 years of research, we work to make the world a more baby-friendly place.

We also aim to cultivate the wonderful power innate to babies and create a world where all babies can shine just as they are.

Learn more about our initiatives around the world toward creating a baby-friendly future:

<https://www.pigeon.com/vision-of-a-baby-friendly-future/>