# Al Mapß 2.0

Overview figure of issues and technologies for novice AI researchers as well as researchers and practitioners in other fields

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Al Map Task force, the Japanese Society for Artificial Intelligence

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# Al Map $\beta$ 2.0

## Overview figure of issues and technologies for novice AI researchers as well as researchers and practitioners in other fields

The field of AI research is expanding, and it is becoming increasingly difficult to step back and see the entire field. In addition, AI systems developed from the results of AI research are beginning to be applied in the real world, making it difficult to grasp the relationship between AI systems and AI technology. In response, we created AI Map $\beta$ 2.0 as a guide for novice AI researchers, as well as researchers and practitioners in other fields who aim to utilize AI. AI Map $\beta$  2.0 is an advanced version of the AI Map $\beta$  published in 2019 and comprises two map: an AI problems map and an AI technology map (Figure 1). An overview is presented below.

#### [AI problems map]

The AI problems map consists of a set of "problem cards," which feature approaches to problems that AI systems are expected to solve, and a "problems-relation map" showing the relationships among them. Researchers and practitioners in various fields can use the map to help them organize and explore issues from the perspective of AI utilization, while keeping their own issues in mind. We hope that the map will provide novice researchers with an overview of problems/approaches and help them set clear goals. Case studies of AI systems and their industrial applications are already widely available in print and online. This map is not intended to replace them but rather to provide a broader perspective of the issues and the relationships between these issues and AI technology, which may be difficult to obtain at present.

#### [AI technology map]

The AI technology map is a revised version of the AI Map $\beta$ , published in 2019. With input from the editorial committee of the Japanese Society for Artificial Intelligence (JSAI), we replaced the keywords with those used in technical papers and added some new ones as well. In addition, the standardization of keywords makes it possible to search technical papers published in the future by keyword. We believe the AI technology map will be a useful guidepost for researchers and practitioners in various fields, helping them collect information for research and development activities. We hope that novice researchers will recognize where their own research field fits into the larger puzzle and use it as a guide for their studies.

As shown in Fig. 1, the two maps complement each other and can be used to arrange various combinations of issues and technologies. We hope you will use Al Map $\beta$  2.0 to find an approach to research and system construction that is suitable for you by moving back and forth between the two maps.

This document also includes an updated map of JSAI special interest groups (SIGs map) and an illustration named "AI Map: From Everyone, for Everyone, for Everyone" visualizes trends of opinions and perspectives, and hopes and fears on AI-related technologies on the basis of frank voices from Japanese respondents by the National Museum of Emerging Science and Innovation

(Miraikan). (https://www.miraikan.jst.go.jp/en/resources/provision/aimap/)



# Target users

Figure 2 shows the target users of Al Map $\beta$  2.0. The horizontal axis shows the level of understanding regarding Al research and technology. The vertical axis shows the level of understanding of the problem to be solved.

The depth

of understanding

q

different

research

topics

٩

practical

issues

Al Map $\beta$  2.0 provides assistance in moving from the left side of the figure to the right.

Note that in practice, to deepen one's understanding, it is necessary to read published research papers and surveys, make progress in one's research, study under the supervision of professors, and build experience in performing real-world implementations. For these activities, Al Map $\beta$  2.0 aims to provide guidance and assistance on approaches or ways to find better solutions or to develop broader range of technologies.

Furthermore, there are times when certain methods will lead to dead ends in research and development. The latest techniques or the most popular methods may not necessarily be the best solutions for your problems.

We hope that AI Map $\beta$  2.0 will provide hints that lead to a solution or a reexamination of the issue.



Figure 2 Scope of The beginning stages of study

# Al problems map

As a result of progress in Al research, many Al information systems have been implemented in society. In the near future, more and more Al systems will be used to address a wide variety of societal needs. However, the diversification of Al research and its application have made it difficult to understand the relationship between these issues and Al research. Many Al systems consist of multiple modules where various results of Al research and technologies (ex. database or IoT) have been applied.

While the target users of this AI map may be capable of gaining experience and knowledge by working on such AI systems, it's possible that they get bogged down in viewing their problems/approaches within narrow scope and fail to see other possibilities. We consider it important to use this map to provide a broad perspective on groups of problems group as well as multifaceted information on the relationship between each problem and AI technology. In other words, our intention is to provide a simple and highly flexible perspective on problems group.

The members of the AI Map Task force decided to create a map with two layers, one containing problem cards and the other a problems-relation map.

The problem cards employ intermediate expressions for specific problems, and act as a bridge between specific problems and various AI technologies. For example, "scheduling" problem card summarizes specific problems such as deliveries scheduling or meetings scheduling, and shows typical approach to solve the problem; ex. a multi-agent system or a genetic algorithm.

The problems-relation map shows the relationships between the problem cards. For example, "scheduling" belongs mostly to the "design" group and it is clear that it is closely related to the problem cards for "placement/design" and "operation plan." This page and the next explain how to read the problem cards and problems-relation map.



#### Problem card pp. 7-10

The legend of a problem card is shown in Figure 3. In total, there are 28 cards and each represents a group of specific problems. The cards show the application keywords, data types required for input data, and examples of expected output. Use of technical term is avoided in supplementary explanation. Keywords related to AI research and technology are listed on the bottom of each card. The cards are color-coded according to classification. For example, blue indicates problems in the "prediction and control" classification.

#### Problems-relation map pp. 11–12

The legend of a problems-relation map is shown in Figure 4. The map shows the classification of each problem card and how the cards relate to each other. Problem cards of the same classification are closely placed. The background colors of problem cards indicate the classifications. It is naturally expected that problems within a classification are strongly related, but there are cases where problems belonging to different classifications are related from application and technological aspects. In such cases, problem cards are connected by lines.



Figure 4 Legend of the problems-relation map.

# **Tutorial**

#### Example of AI problems map usage

To utilize the results of AI research, it is necessary to consider problems to be solved from the perspective of applying AI technology. However, a wide variety of problems can be understood only by the people involved. Therefore, AI maps may not be able to provide direct support for problem solving.

Considering such aspect, we prepared a template (see right) called "My Problem Sheet" in the Al problems map. Please use this template when tackling your own problems. The completed sheet will be useful for future research and development as well as interviews with experts.

Furthermore, on the next page, steps 1–5 are a tutorial for using the AI problems map. Using the problem card and problems-relation map, you can imagine activities to organize and delve deeper into your problem to a manner that can be applied to AI. The usage of the AI problems map is not limited to this example, but we recommend following this tutorial at first. First, give your problem a simple name.

Be as specific as possible by describing the current situation, how you want to improve it, and so on.

Describe what you want the solution and the behavior of AI to be, including judgment and prediction results, response text, voice output, and so on.

Describe the type, quantity, diversity, and quality of the Al input data.

Describe the allotted processing time, the minimum accuracy, budget, effort, and so on. Please include expert scarcity, computational resource constraints, communication constraints, and so on.

You can leave this blank at first and add details later by using the Al problems map.

**My Problem Sheet** Problem name – 1. Purpose (what you want to achieve) 2. The output you want to obtain 3. The information and data collected so far 4. Constraints and achievement indicators

5. Related AI research and technical keywords



## Prediction and control

\Prediction and control/ Numerical prediction

predict numerical values in the near future

#### [application example keywords]

energy consumption, prices, train delays, hospital waiting times, traffic jam forecasts, electricity demand forecasts, weather forecasts

numerical value

07

#### text

[Keyword]

market design multi-agent Bayesian estimation

statistical learning deep learning neural network sparse modeling knowledge acquisition / discovery simulation



predicted value

#### [related methods / technologies]

regression analysis, RNN, LSTM, Kalman filter, state space model, statistical time series model (ARIMA / SARIMA), data assimilation

\Prediction and control/

## **Probability prediction**

predict the probability of the near future event

#### [application example keywords]

market size, delivery probability, congestion rate, behavior model, weather forecast

#### numerical value text

probability

#### [Keyword]

statistical learning state space model graphical model deep learning neural network sparse modeling



knowledge acquisition / discovery simulation market design

[related methods / technologies] Bavesian network, data assimilation

#### \Prediction and control/

## **Operation and control**

move devices automatically according to the purpose

#### [application example keywords]

automobile, heavy machinery, airplane, machine tool, agricultural machinery, ship, traffic light, plant, forklift

control value



manual input

#### [Keyword]

simulation multi-agent reinforcement learning deep learning semi-supervised learning neural network HRI

[related methods / technologies]

cloud robotics, probabilistic robotics

### \Prediction and control/ **Predicted candidate** presentation

present diverse possibilities in the future

#### [application example keywords]

typhoon outbreak location, new services / markets, regional economy, location of failure



#### [Keyword]

Bayesian estimation semi-supervised learning neural network knowledge acquisition / discovery auction market design Web intelligence behavior estimation multi-agent

[related methods / technologies] simulation, scenario planning

#### \Prediction and control/

## **Operation plan**

make a operation plan that maximizes the objective under given condition

#### [application example keywords]

device operation plan, workforce plan, material usage plan, beer factory, personnel shift, delivery plan



#### [Keyword]

planning genetic algorithm evolution calculation simulation multi-agent reinforcement learning heuristics



[related methods / technologies] meta-heuristic. search

### Recognition and estimation

\Recognition and estimation/

## State estimation

estimate invisible internal states such as quality and health

#### [application example keywords]

machine, patient, food and farm product, operation mode, quality, congestion, infrastructure monitoring

sensor data Image

numerical value text

#### [Keyword]

Bayesian estimation pattern recognition deep learning transfer learning semi-supervised learning adversarial learning neural network data mining

knowledge acquisition / discovery

#### [related methods / technologies]

filter bank, blind signal separation, state space model, Kalman filter, hyper spectrum analysis

\Recognition and estimation/

## Anomaly detection

find anomalies that exceed normal or acceptable ranges.

#### [application example keywords]

machine, manufacturing site, historical data, natural phenomena, human body, collective action, transaction data, defective product, incident detection, satellite, power generator vibration, railroad vehicle vibration, falling, sudden illness



[Keyword] anomaly detection data mining deep learning representation learning (embedding) semi-supervised learning computer vision

[related methods / technologies] exception detection, anomaly detection, one-class SVM, MT method, kernel density estimation, subspace method, invariant method, auto encoder

#### \Recognition and estimation/

## State change detection

estimate state changes in device such as degradation or clogging.

#### [application example keywords] noise / sound, image, plant, wear,

cutting machine, valve, motor, gear, roller, filter





Bayesian estimation semi-supervised learning representation learning (embedding) transfer learning adversarial learning

deep learning clustering

[Keyword]

#### [related methods / technologies]

hidden Markov model, state space model, density ratio estimation

#### \Recognition and estimation/

Sensor data recognition recognize objects based on sensor data (ex. whether it's a man or an object / whether it's a craw or a crane.)

## [application example keywords]

ultrasonic sensor, temperature sensor, vibration sensor, line sensor, distance sensor, LIDAR, gas sensor, electromagnetic radar, biosensor, behavior history



#### [Keyword]

pattern recognition deep learning **Bayesian** estimation representation learning (embedding) transfer learning adversarial learning

[related methods / technologies]

SHOT feature descriptor, PPF descriptor, 3D-DNN, Point Net, dead reckoning, DP matching

#### \Recognition and estimation/

## Indicator creation

give an index to the nature of an object under complex and ambiguous criteria

#### [application example keywords]

negotiation skill, design, health, development capability, movement capability, resume, economic indicators, sports



auction

#### [related methods / technologies] regression analysis, PCA

(principal component analysis), A/B test, hierarchical clustering

#### \Recognition and estimation/ Authentication

identify a person based on biological information or historical data

#### [application example keywords]

fingerprint authentication, face authentication, vocal cord authentication, gait authentication, history authentication



#### [Keyword]

pattern recognition Image recognition voice recognition statistical learning Bayesian estimation



[related methods / technologies] life science, face authentication. DNA authentication

#### \Recognition and estimation/

## Media change detection

recognize objects or what's heard from image, video, or sound information

#### [application example keywords]

speech recognition, Image recognition, visual inspection, waste, products, people, trees, automobiles, animals, heavy machinery



[related methods / technologies] phonetics, acoustic scene analysis, pre-learning



type



## Numerical analysis

clearly show analysis results by inspecting big and various numeric data

#### [application example keywords]

statistical data, operation data, management data, stocks, financial report, sales amount, shipping record, output, amount of power generation, numerical inspection record, number of users

numerical value		trends			
numerical value	$\rightarrow$	group			
attribute		relation			
		relation			
[Keyword]		topics			
data mining		•			
data science		and tout			
clustering		HE -			
semi-supervised learning					
information visualization					
representation lea	irning (ei	nbedding)			
sparse modeling					
[related methods / technologies]					
privacy preserving data mining,					
secure computing, Bayesian networks					

#### \Analysis and summarization/

## **Causal inference**

find causal relationship based on data; predict what changes what

#### [application example keywords]

epidemiology, economics, chemistry, sleep disorders, sales changes, root cause of failure estimation

numerical value	、 、	
text	_>	causal relation

#### [Keyword]

Al understandability semantics search/logic / inference algorithm clusterina knowledge graph

#### [related methods / technologies]

statistical causal analysis, structural equation modeling, causal graph, independent component analysis, LiNGAM

#### \Analysis and summarization/ Language data analysis

clearly show analysis results by inspecting big and various text data

#### [application example keywords]

Web data, SNS, e-mail, questionnaire, speech transcription data, call center, news article, dictionary, popular words, Q&A data, new market analysis, news topic extraction







computational social sciences knowledge graph social media

#### [related methods / technologies] pre-training, statistical analysis of text, corpus, privacy preserving data mining, secure computing, word2vec

\Analysis and summarization/

## Media data analysis

clearly show analysis results by inspecting big and various image / video data

#### [application example keywords]

image, sound, vibration, surveillance image. fixed-point camera, microscope image, manufacturing line image, sports image





data mining data science information visualization

representation learning (embedding)

#### [related methods / technologies]

privacy preserving data mining, secure computing

#### \Analysis and summarization/

## **Summarization**

clearly show the gist of large amount of information

#### [application example keywords]

text, numerical data, video, web data, report, academic material, SNS, news article and video, Q&A summary, questionnaire result, document, article



#### [Keyword] summarization

text minina reinforcement learning Web intelligence segmentation

#### [related methods / technologies]

extractive summarization, abstract summarization lead method GAN pointer networks, pre-training, LexRank

#### \Design/ Placement and design

decide complicated arrangements and combinations to meet the required conditions

#### [application example keywords]

production planning, procurement planning, personnel shift, investment planning, layout planning, layout optimization, shelving allocation

example



#### [Keyword]

planning constraints satisfaction problem / satisfiability testing (CSP/SAT) genetic algorithm simulation evolutionary computation graph theory multi-agent heuristics market design



\Design/

Scheduling

Design

Analysis

and

summarization

distributed cooperation evolutionary computation

### \Design/ Coordination

show proposals from many combinations

#### [application example keywords]

fashion, travel plans. class attendance plans, food menus



#### [Keyword]

information recommendation genetic algorithm kansei onomatopoeia









\Collaboration and trust formation/

## Ordering and selection

show appropriate selection criteria or order. and present candidates for selection

#### [application example keywords]

screening, tournaments, selection

conditions	\ \	order
ndidate data	_>	combination

#### [Keyword]

car

planning constraints satisfaction problem / satisfiability testing (CSP/SAT) genetic algorithms knowledge sharing / management knowledge acquisition / discoverv Al fairness social problem application, market design multi-agent decision-making and consensus building information visualization swarm intelligence sparse modeling



\Collaboration and trust formation/

Mediation and planning

support fair consensus building

and give advice on ethical issues

[application example keywords]

voting, consensus building, compliance

text

#### \Generation and dialogue/

### Speech dialogue respond appropriately by understanding people's

intentions based on natural language, intonation, facial expressions, etc. (paralanguage)

#### [application example keywords]

handling at the counter, call center, web service, elderly people support

speech		speech
text	$\rightarrow$	text
Image		Image

#### [Keyword]

Generation and

dialogue

dialogue processing / dialogue system speech recognition speech generation non-task-oriented dialogue conversation understanding / discourse understanding / intention understanding HAI

multimodal interaction

[related methods / technologies] cognitive science

\Generation and dialogue/

**Advice** 

display candidates that match the user

based on expert knowledge and considering

#### \Generation and dialogue/

## Media transformation

generate target data by transformation or augmentation of input data

#### [application example keywords]

photo, line art, manga, 3D, speech quality, image compression



[Kevword]

image generation speech generation adversarial learning deep learning pattern recognition ontology knowledge graph



[related methods / technologies] Style Transfer, VGG, GAN, Cycle GAN

#### \Design/

## Personalization

customize the displayed contents to match the users' (hidden) preferences

#### [application example keywords] news articles, video distribution, dialogue,

services, advertisement distribution





category

#### [Keyword]

information recommendation dialogue processing / dialogue system text mining knowledge acquisition / discovery kansei onomatopoeia

[related methods / technologies] privacy preserving calculation privacy preserving data mining

#### \Generation and dialogue/ **Knowledge organization**

understand and structuralize meaning from documents for extracting relevant knowledge

#### [application example keywords]

FAQ generation, Web search, risk assessment, investment decision, information retrieval. data sharing, knowledge sharing

document

#### [Keyword]

ontology summarization crowdsourcing knowledge graph text mining web interaction expert system onomatopoeia intelligent UI knowledge base

#### [related methods / technologies] database, knowledge management

complex influences [application example keywords] finance, health care, legal consultation.

fitness, daily matters consultation, energy conservation, safe driving



information recommendation reinforcement learning expert system knowledge base dialogue processing / dialogue system knowledge acquisition



#### ontology knowledge graph [related methods / technologies]

GAN, DeepFake, StyleGAN, speech synthesis, Text to Speech (TTS), hidden Markov model (HMM), Deep Belief Network, spectral envelope



Design



numerical value







text

knowledge sharing / management

discovery Al ethics HAI multimodal interaction

> [related methods / technologies] A/B test

### \Generation and dialogue/ Media generation

Automatically generate article, conversation or CG from data

#### [application example keywords]

news article script. CG of sign language. novel, music



sound speech generation image generation video processing conversation understanding /

discourse understanding / intention understanding summarization knowledge sharing / management







## Correspondence between the AI problems map and AI technology map

Research subject	oveloestice	application	AI technology map			
classification	explanation	fields	MapA	MapC	MapD	МарЕ
Prediction and control	<ul> <li>Prediction of short-, mid-, and long-term future states</li> <li>Device control based on predictions</li> </ul>	Utilized mainly in industrial sectors(manufacturing, infra- structure, logistics, energy, and telecommunications), with some application in wholesale and retail as well as event management	Evaluation Objective Operation selection Execution Robots and the real world	Machine learning, Metaheuristics, Agent, Image, Audio, and Media processing, Robotics, Robots and the Real world, Human interface, Environment, Art / Entertainment applications, Logic / Reasoning, Al and Society, Fundamentals and Theory, Medical and Biolo- gy, Management, Environment, Industrial application	Learning, Recognition, Prediction, Body, Robots, Motion	Fundamentals and Theory Machine learning Agent Robots and the Real world Al applications
Recognition and estimation	<ul> <li>Image and sound/ noise recognition</li> <li>Estimation of past and present states</li> </ul>	Utilized in the security, medicine, and industrial sectors	Perception Interpretation Evaluation	Machine learning, Image, Audio, and Media process- ing, Robotics, Robots and the Real world, Knowledge engineering, Machine learning, Agent, Medical and Biology, Art / Entertainment applications, Education, Al and Society, Environment, Fundamentals and Theory, Industrial application	Learning, Recognition, Prediction, Inference, Knowledge, Language,	Image, Audio, and Media processing Fundamentals and Theory Machine learning Al applications
Generation and dialogue	<ul> <li>Response upon listening to a human utterance</li> <li>Generation of new images, data, and sentences</li> </ul>	Utilized in the service and media art industries	Human Dialogue Emotion Media	Language media processing, Image, Audio, and Media processing, Knowledge engineering, Use and Sharing of knowledge, Social computing, Web intelligence, Agent, Human interface, Medical and Biology, Art / Entertainment applications, Robotics, Robots and the Real world, Education, Logic / Reasoning, Al and Soci- ety, Fundamentals and Theory, Industrial application	Discovery, Search, Creation, Human, Dialogue, Emotion, Evolution, Life, Growth	Human interface Robots and the Real world Image, Audio, and Media processing Language media processing Agent Use and Sharing of knowledge
Analysis and summarization	•Analyze, summarize, and visualize data	Utilized in office work, monitoring, and mainte- nance services	Interpretation Evaluation	Machine learning, Language media processing, Image, Audio, and Media processing, Web intelligence, Human interface, Agent, Knowledge engineering, Use and Sharing of knowledge, AI and Society, Environment, Medical and Biology, Fundamentals and Theory, Educa- tion, Management, Logic / Reasoning, Industrial appli- cation	Inference, Knowledge, Language, Learning, Recognition, Prediction	Image, Audio, and Media processing Language media processing Use and Sharing of knowledge Web intelligence
Design	<ul> <li>Propose adjusted combinations that conform to the conditions</li> </ul>	Utilized in upstream processes, the service industry, design and manufacturing	Interpretation Evaluation Media	Machine learning, Metaheuristics, Agent, Knowledge engineering, Use and Sharing of knowledge, Logic / Reasoning, Medical and Biology, Management, Al and Society, Fundamentals and Theory, Education, Indus- trial application	Discovery, Search, Creation, Learning, Recognition, Prediction	Fundamentals and Theory Web intelligence Agent Machine learning
Collaboration and trust formation	• Generation and adjustment of appropriate selection criteria and order.	Utilized in social activi- ties such as screenings, elections, tournaments, candidate selection, and consensus building	Al and Society	Agent, Knowledge engineering, Use and Sharing of knowledge, Social computing, Robots and the Real world, Human interface, Web intelligence, Use and sharing of knowledge, Knowledge engineering, AI and Society, Logic / Reasoning, Fundamentals and Theory, Management, Industrial application	Human, Dialogue, Emotion, Al frontier	Al and Society Al applications Fundamentals and Theory Language media processing Use and Sharing of knowledge

Remarks: Map B is organized in view of handled data and technology development, and hence correspondence with research subject classification is very complicated.

## Al technology map

The field of AI research consists of many diverse areas that are intricately linked and rapidly developing, so it is difficult for a single map to encompass the relevance of all research fields without introducing contradictions. Considering this type of situation, five maps have been created that capture AI research from five different perspectives.

These five maps comprise the revised versions of four maps published in 2019 as well as a new map created by the Editorial Committee. We encourage users to propose additional maps. We also hope that experts in specific fields will create partially detailed maps and tutorials and link them to this map, thereby expanding the into multiple layers.

As an introduction, the perspectives of the five maps and their usage are described. Details for reading each map are found in the respective map explanation.

In map A, attention is focused on the processes of intelligence. The concept of intelligence as an input/output process flow is shared by many AI researchers, with constant advancements in component technologies. The map can be used to develop complex processes for advanced component research or to decompose intellectual processes into their individual components. The map also incorporates the viewpoint of individual and group intelligence.

Map B shows the relationship between technologies and application targets. In many Al studies, component technology is developed with a focused aim, and the map indicates representative combinations of technologies and targets. Many successful studies have been conducted by shifting targets, suggesting that the next successful research field might be found among closely related keywords. This map can be used when shifting research targets or considering related technologies for applications.

In map C, attention is focused on the fundamentals and applications that extend from AI research. AI research covers highly academic fields and is rooted in the natural sciences, humanities, and social sciences. This map also shows the application areas that are undergoing rapid development. This map can serve as reference when reconsidering research subjects from a fundamental point of view or when exploring new applications.

Map D showcases various answers by AI researchers to the question, "What is intelligence?" Some answers can be found in rapidly developing technological fields, including " Learning, Cognition, and Prediction," "Reasoning, Knowl-edge, and Language," and "Discovery, Search, and Creation." Studies in these fields are investigating various aspects of intelligence and are influencing each other. The map reveals the wide range of AI research and the uncharted territory remaining to be explored.

Map E presents keywords for use in the JSAI research papers that were chosen by the Editorial Committee. Keywords that have attracted attention in recent years are collected here so that they may be used in papers reporting state-of-the-art research results.

## [Comments on the collected keywords]

- Each map has keywords representing Al-related research fields.
- •The keywords were first selected by the taskforce in consideration of whether the words were representative of the big picture of AI research, and in reference to keywords used in academic journals and research meetings.
- Because of the ever-expanding nature of AI applications, the taskforce selected application keywords that were deemed important at the time of publication. (ex: materials informatics)
- •The keywords include terms from broader research fields that encompass AI research. In such cases, the keywords should be interpreted from the point of view of AI research in those fields. (ex: information retrieval)
- •The keywords also include term from other research and application fields that are closely related to Al research. (ex: behavioral economics)
- •The keywords were selected as journal keywords by the Editorial Committee after careful examination and new keywords were added to the list by the taskforce.
- In principle, the keywords on each map are based on the journal keywords mentioned above. However, each map contains keywords not found among the journal keywords and reflect the perspective taken for that map.
- Some keywords may not be visible on a particular map depending on its viewpoint. Accordingly, groups of keywords within a given map may not be the same as those on other maps.
- It's possible that other important keywords have been overlooked. Therefore, we strongly encourage users to suggest new keywords.



Al research sees human activity as a flow consisting of a combination of many intellectual activities. There are research fields that correspond to each step in this flow. Humans perceive and interpret the visual image, pay attention to the required information, evaluate the information based on the selected information, form an intention, and decide a series of operation sequences. For example, let' s consider a fellow researcher who approaches while holding out his right hand. I recognize the right hand approaching and identify the person as non-Japanese. In addition, his expression is friendly. I remember that there is a custom of shaking hands in foreign countries. I combine the recognition, and construct a series of actions, such as putting out my right hand, smiling while making eye contact, and shaking his hand.

Al also needs to work with humans by communicating with the people around it, and this involves many areas of research. For example, one area of research studies the interaction and dialogue between humans and robots with physical bodies.

In addition, many new research fields are emerging that examine how humans view Al. Research is also required on the appropriate use of Al, and includes evaluating Al' s reliability and operability.

Novices can learn about applications and activities related to their academic fields. For those who are already researching a certain field, the map can show related AI research themes and highlight possible partners for collaboration.





## Matching technology and applications with the next target

Al research has produced a large number of technologies that are general-purpose with no specific target. However, during development, targets have been defined within a certain range, and realization methods and fundamental technologies have been developed for them. For example, image targets have evolved from simple signal recognition to complex image recognition, and then to generative adversarial network (GAN).

In addition, technological development in a specific field has stimulated related technical fields, and has created new technology-target pairs. Therefore, the area around coordinates that is currently producing a large number of new technologies could be developed by changing the target or changing the technical goal.

For example, as a hypothesis, in recent years the practicality of multi-agent systems has been rapidly improved by increases in computing power and the preparation of large amounts of data. Looking at surrounding areas on the map, scheduling is likely to be closer to problem solving, and as the target moves closer to knowledge and reasoning, new technological advances may emerge in multi-agent systems (e.g., the Semantic Web).



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## **Connectivity of fundamentals** with methods and applications

Map C shows how the roots and branches of Al research spread widely.

Al is built on many fundamental disciplines, including mathematics, statistics, logic, cognitive science, and neuroscience. Of course, it is impossible to master all these subjects before you start Al research. However, it may be useful to return to the basics before aiming to go beyond the horizon of current research. Along with reading the latest papers and comparing and evaluating the latest libraries on GitHub, it is also worthwhile spending time studying the fundamentals.

Map C shows the scope of Al applications, which is rapidly expanding. Applications will probably extend to every aspect of human society as practicability improves. As a starting point, the map shows the application areas that are now booming. For example, Al is used in various fields such as financial technology, medicine, real estate, music, and agriculture. In addition, as the applications expand, new technical issues and social issues are emerging, including ethics, credibility, and explainability. These are fed back as learning into the foundations of Al, and the large tree of Al research spreads further.



**Major classification** 

Middle classification





prediction technology advances social infrastructure AI, and contributes to infrastructure maintenance, environmental conservation, and economic activity development

## Al research is diverse The vast frontier of Al

In Al research, there are various approaches for realizing mechanical intelligence. The ultimate goal of the "Al frontier" is the realization of intelligence comparable to or beyond that of humans and other living things, and its integration into society. In the surrounding area of the map, there are multiple viewpoints with different ways of thinking about intelligence that continue to be studied in depth, and each has made steady scientific and technological progress. Furthermore, Al research is related to many other research fields, and through close coordination with these other fields it can split from or fuse with other fields, opening up new horizons.

For example, in this map, the area of "reasoning, knowledge, and language" (also called "adult intelligence") is shown in the upper right of "learning, recognition, and prediction". Humans can use words, build and share knowledge, and make various inferences. Some of these processes are formalized in AI research and have theoretical explanations and practical applications. In this area, new technologies and research directions are being developed with data-driven approaches. In addition, research is beginning to show that language and reasoning influence recognition itself.

To keep the map in a single plane, two main adjacent areas were used. However, in practice, fusion with the opposite region across the Al frontier is also popular. For example, the relationship between "reasoning, knowledge, and language" and "human, interaction, and emotion" is deep, and "onomatopoeia" is a research field located between these two opposite fields. In addition, image generation using GAN which is an application of deep learning, is a fusion of "learning, recognition, and prediction" and "discovery, search, and creation". Future Al research may have great potential for merging areas that do not have deep links.





Al research is developing in conjunction with a number of academic disciplines around it. The closer to the center, the more Al-specific or unresolved / undefined problems.



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## Current state of AI research

Map E was created by the Editorial Committee of the Transactions of the JSAI. The committee revised and added keywords that should be assigned to academic papers by the JSAI, based on keyword groups selected by the AI Map Task Force. The keyword groups are available for download in the "Guide to Writing Manuscripts" document on the JSAI website (URL below).

https://www.ai-gakkai.or.jp/en/published\_books/ transactions\_of\_jsai/toukou/

Furthermore, these keywords were divided into several groups and each group was given a classification name. As shown in the figure on the right, these classifications include "Fundamentals and Theory" and "Image, Audio, and Media Processing." Because academic papers are at the cutting edge of current Al research, we selected keywords that were frequently used in papers published within the last 5 years, and the classification names were based on the current most active research fields.

Next, we placed the keywords according to two axes. The horizontal axis ranges from fundamentals on the left to applications on the right, whereas the vertical axis, ranges from cyberspace research at the bottom to real-world research at the top. Given that research fields do not necessarily define their research targets narrowly, the arrangement may not align with our intentions.

Consequently, this map is a prospective figure that more or less represents the current state of AI research.

In particular, the top and bottom five research fields centered on "Machine Learning" in the third circle from the left are highly active and a large number of papers have been published in these fields. Research on the impact of such research on society is on the right side, and the supporting research fields are on the left side. It is useful to have this type of overview of the current state of Al research.





# Map of special interest groups

There are 24 special interest groups (SIGs) in the Japanese Society for Artificial Intelligence (JSAI). The following website provides information on SIGs. https://www.ai-gakkai.or.jp/sig/sig-list/

For beginners and interdisciplinary researchers who are interested in Al research, active participation in SIGs is desirable for obtaining up-to-date research information and making contact with front-line researchers.

However, it is difficult to link the names of groups, titles of papers, and users' interests. Therefore, we have created maps of the groups that overlap with Al Map, beta version to encourage participation.





### Placement difficult

However, it is difficult to link the names of groups, titles of papers, and users' interests. Therefore, we have created maps of the groups that overlap with Al Map, beta version to encourage participation.

The four SIG maps shown here were created based on the results of a questionnaire answered by the leaders of each group. The maps are arranged to ensure maximum visibility.

There were several groups that were difficult to place on a specific map because of their diverse scope, so we have placed them outside of the maps. In addition, some groups are combining or simultaneously handling distant areas on the map. We have shown the spread of the target area by connecting areas with a line or vertically and horizontally. These maps show the areas where research groups are concentrated, and the similarities between groups.

The JSAI holds joint research meetings of the SIGs once a year. Joining neighboring groups on the map will allow researchers to grasp the latest research trends in related areas quickly.

In addition, the areas in which the groups are concentrated on the map are likely to be hot topics in Al research and will highlight current research trends.



Placement difficult Interactive Information Access and Visual Mining

Basic science Philosophy Probability / Statistics Mathematical science Data Science Computer science Psychology Biology



## List of SIGs

AGI :	Artificial General Intelligence
AIMED :	Artificial Intelligence in Medicine
ALST :	Advanced Learning Science
	and Engineering
AM :	Interactive Information Access
	and Visual Mining
BI :	Business Informatics
CCI :	Crowd Co-creative Intelligence
Challenge :	Al Challenges
CKE :	Commonsense Knowledge
	and Emotion
DOCMAS :	Data Oriented Constructive
	Mining and Simulation
FIN :	Financial Informatics
FPAI :	Fundamental Problems in
	Artificial Intelligence
KBS :	Knowledge-Based System
KSN :	Knowledge Sharing Network
KST :	Knowledge and Skills Transfer
LSE :	Language Sense
	processing Engneering
MBI :	Molecular Bioinformatics
MEI :	Measurement Informatics
NAC :	Natural Computing
SAI :	Society and Artificial Intelligence
SKL :	Skill Science
SLUD :	Spoken Language Understanding
	and Dialogue Processing
SWO :	Semantic Web and Ontology
TBC :	Triggers for Behavior Change
WebSci :	Web Science

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## Miraikan -The National Museum of Emerging Science and Innovation

## "AI Map : From Everyone, for Everyone"

> https://www.miraikan.jst.go.jp/en/resources/provision/aimap/

#### What Citizens Truly Feel Toward AI

Once AI technology makes serious inroads into society, people are more likely to interact and contact with that technology on daily basis. Therefore, AI development along with acknowledging users' attitudes and true feelings, will be needed even more seriously. Responding to this growing demand, Miraikan designed a map, "AI Map: From Everyone, for Everyone" based on a survey that was delivered to 900 people. Here, the goal was to present and visualize citizens' responses toward AI as a society. The survey showed interesting results, such as the fact that their attitudes can be interpreted in four categories of emotions. In addition, we discovered how diverse and complex citizens felt toward AI.

Through making this AI Map, Miraikan designed survey questions to make citizens imagine possible lifestyle where AI was already a part of their everyday life. We then asked respondents their intentions and reasons for using AI technology at specific scenes, described in the survey. The survey results were visualized as a map shown on the next page. A total of four types of emotions are arranged on the map; on the left, two types of emotions are shown — "Trust" and "Rejection" over resolving the latest social challenges. On the right, other two types are shown — "Expectation" and "Anxiety" over a future society in which AI is familiar to citizens. This method was to illustrate the relationships between the obtained opinions. Here, four scenes in everyday life were selected: "Medical Care" and "Disaster Prevention," that had a large number of consenting opinions, were equally seen.

As an overall trend, a large number of citizens were interested in and approved of Al that contributes to resolving social challenges. At the same time, opinions were split toward Al when it closely relates to individuals' preferences, perceptions and moral values. Pay close attention to adversarial relationships of opinions, represented by the dotted lines. People accept Al, through their reflections on comparisons with one's physical abilities and their challenges. This deeply connects to disparities in how people view others, leading conflicts in opinions. In order to foster social implementation of Al technology, and to enhance technological understanding, communication plays an important role to closely reflect on people's true feelings.



\* The following page shows a scaled-down version of the actual map.

The actual map is 25cm x 35.3cm and is printed on the final page of this pamphlet.



# We have a favor to ask of you.

### To create a more refined map

In the process of creating this AI map, we had to abandon many of the things we wanted to include due to resource limitations. We also omitted important information on research and application as follows because we prioritized presenting the overall view of these issues. However, all of these fields are hoped for further development in future.

First, in the application of AI technology, it is very important to strike a balance between cost and benefit. For example, even if a highly accurate prediction engine can be created, it cannot be applied if the cost of collecting data, training, and maintenance is too high. Although the balance between cost and benefit is changing, information for determining an appropriate balance would be very valuable. When we enter the application stage, we may encounter many technical problems such as overfitting, parameter tuning, data cleansing, unstable output, and slow convergence. Well organized information on such issues should prove very useful.

Next, we should point out that the AI problems map itself is incomplete. There is little precedent for mapping out issues in AI research field with various abstract terms. Accordingly, the problem cards have room for improvement in terms of granularity and coverage. In the future, we expect that hackathons will be held in which the AI problems map will be used and that shortcomings and problems will be revealed and addressed, leading to further refinement of the map.

We expect that the AI Map $\beta$  2.0 will be of great benefit, from AI research to practical application. Accordingly, we hope that it will be used as not only for this pamphlet but also as data for practical solutions. To that end, we have prepared the problem card in tabular format data and AI technology map in CSV data format, and are planning to release them for public use.

We are also considering to continue our activity to realize the interactive map that we proposed in 2019. The map is web content where the user can interactively search for target issues within the map for R&D purposes. We are looking forward to your continued support.

## Join JSAI (Japanese society for Artificial Intelligence)

This AI Map $\beta$  2.0 was created as part of the activities of the JSAI. If you are interested in this map, please consider joining JSAI. Members have access to useful information, including journals featuring articles on the latest AI research and applications. In addition, members can contribute to the Annual Conference, workshops, and the academic journal. Discounts for seminars and other events are also available. The membership application can be found online (URL below). https://www.ai-gakkai.or.jp/about/membership/

# We are recruiting people to make maps.

In addition to the proposed additional maps shown earlier, each Al researcher may have ideas for maps based on his or her own perspective as well as maps related to his or her research field. Also, for each research group, it may be possible to create a map showing the research trends in their respective fields as well as tutorials for novice researchers.

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A gift is given to myself and future ns through data provided d collected from people 50s/M]

will be

higher

Positive

information

to use

economical

purposes

(40s/F)



"AI Map: From Everyone, for Everyone" was created based on the Japanese opinions from online surveys and surveys on the exhibition floor (Valid data: 887) on February 2020 at Miraikan. The above pie charts are pros/cons of Al in four scenes in one's life. The left charts illustrate the reasons.



🚱 Miraikan

m not happy

vith the idea of being controlled

[30s/F]

raikan - the National Museum of Emerging Science and Innovation / Miraikan Focus Project Team (Fumiya Urushibata, Yoshiyasu Watanabe, Ryu Miyata, Ayuko Sakurai, Atsushi Ozawa and Mizuki Kawano) Cooperation: The Japanese Society for Artificial Intelligence Desian: Takashi Tokuma (bowlgraphics Inc.)

## How to make problem cards

## **\STEP1**/

## Make a double-sided print on a A4 sheet in landscape.



## \STEP2/ Cut along dotted lines.





\Prediction and control/

## Numerical prediction

predict numerical values in the near future

#### [application example keywords]

energy consumption, prices, train delays, hospital waiting times, traffic jam forecasts, electricity demand forecasts, weather forecasts



> predicted value

#### [Kevword]

statistical learning deep learning neural network sparse modeling knowledge acquisition / discovery

#### [related methods / technologies]

regression analysis, RNN, LSTM, Kalman filter, state space model, statistical time series model (ARIMA / SARIMA), data assimilation

\Prediction and control/

## Predicted candidate presentation

#### [application example keywords]

typhoon outbreak location, new services / markets, regional economy, location of failure

### numerical value text

candidates scenario

#### [Keyword]

**Bayesian** estimation semi-supervised learning neural network knowledge acquisition / discovery auction market design Web intelligence behavior estimation 

[related methods / technologies] simulation, scenario planning

\Prediction and control/

## Probability prediction

predict the probability of the near future event

#### [application example keywords]

market size, delivery probability, congestion rate, behavior model, weather forecast



#### [Keyword]

statistical learning state space model graphical model deep learning neural network



sparse modeling knowledge acquisition / discovery simulation 

[related methods / technologies] Bavesian network, data assimilation

#### \Prediction and control/

## **Operation and control**

move devices automatically according to the purpose

#### [application example keywords]

automobile, heavy machinery, airplane, machinetool, agricultural machinery, ship, traffic light, plant, forklift



#### [Keyword]

simulation multi-agent reinforcement learning deep learning semi-supervised learning neural network «continued to the back»



[related methods / technologies] cloud robotics, probabilistic robotics

present diverse possibilities in the future





market design multi-agent (continued to the back)

# simulation

\Prediction and control/

## **Probability prediction**

predict the probability of the near future event

[Keyword] (continued from the front)

market design multi-agent Bayesian estimation decision making / consensus building fuzzy logic

#### [related fields]

earth science, meteorology, control engineering

\Prediction and control/

## **Operation and control**

move devices automatically according to the purpose

embodiment

planning

ontology

fuzzy logic

subsumption architecture

constraints satisfaction

problem / satisfiability testing (CSP/SAT)

#### [Keyword] (continued from the front)

HRI behavior estimation swarm intelligence distributed coordination symbol emergence in robotics intelligent mechatronics intelligent robots intelligent robotics cognitive robotics

[related fields]

control engineering robotics

\Prediction and control/

## Numerical prediction

predict numerical values in the near future

[Keyword] (continued from the front)

Bayesian estimation decision making / consensus building fuzzy logic

[related fields]

earth science, meteorology, control engineering

\Prediction and control/

# Predicted candidate presentation

present diverse possibilities in the future

[Keyword] (continued from the front)

multi-agent decision making / consensus building graphical model

[related fields]

earth science, meteorology

#### \Recognition and estimation/

## Authentication

identify a person based on biological information or historical data

#### [application example keywords]

fingerprint authentication, face authentication, vocal cord authentication, gait authentication, history authentication



### authentication results

#### [Keyword]

pattern recognition Image recognition voice recognition statistical learning Bayesian estimation

### [related methods / technologies]

\Analysis and summarization/

life science, face authentication, DNA authentication

#### \Recognition and estimation/

## State change detection

estimate state changes in device such as degradation or clogging.

#### [application example keywords]

noise/sound, image, plant, wear, cutting machine, valve, motor, gear, roller, filter



#### [Keyword]

Bayesian estimation semi-supervised learning representation learning (embedding) transfer learning adversarial learning deep learning «continued to the back»

#### [related methods / technologies] hidden Markov model, state space model. density ratio estimation

\Analysis and summarization/

## Language data analysis

clearly show analysis results by inspecting big and various text data

#### [application example keywords]

statistical data, operation data, management data, stocks, financial report, sales amount, shipping record, output, amount of power generation, numerical inspection record, number of users

numerical value		trends
	$\rightarrow$	group
attribute		relation
<b>Keyword]</b> data mining		topics
data science clustering semi-supervised nformation visua representation le (continued to the	lization arning (	Eline A

#### [related methods / technologies]

privacy preserving data mining,

#### [application example keywords]

Web data, SNS, e-mail, guestionnaire, speech transcription data, call center, news article, dictionary, popular words, Q&A data, new market analysis, news topic extraction



#### [Keyword]

text mining web minina data mining Web intelligence computational social sciences

knowledge graph «continued to the back»

#### [related methods / technologies]

pre-training, statistical analysis of text, corpus, privacy preserving data mining, secure computing, word2vec

\Recognition and estimation/

## Anomaly detection

find anomalies that exceed normal or acceptable ranges.

#### [application example keywords]

machine, manufacturing site, historical data, natural phenomena, human body, collective action, transaction data, defective product, incident detection, satellite, power generator vibration, railroad vehicle vibration, falling, sudden illness



#### [Keyword]

anomaly detection data mining deep learning representation learning (embedding) semi-supervised learning «continued to the back»

#### [related methods / technologies]

exception detection, anomaly detection, one-class SVM (continued to the back)

\Prediction and control/

## **Operation plan**

make a operation plan that maximizes the objective under given condition

#### [application example keywords]

device operation plan, workforce plan, material usage plan, beer factory, personnel shift, delivery plan

schedule

efficiency



#### [Keyword]

planning genetic algorithm evolution calculation simulation multi-agent reinforcement learning «continued to the back»

[related methods / technologies] meta-heuristic, search

\Recognition and estimation/

## Sensor data recognition

recognize objects based on sensor data (ex. whether it's a man or an object / whether it's a craw or a crane.)

#### [application example keywords]

ultrasonic sensor, temperature sensor, vibration sensor, line sensor, distance sensor, LIDAR, gas sensor, electromagnetic radar, biosensor, behavior history



#### pattern recognition deep learning Bayesian estimation representation learning (embedding) transfer learning «continued to the back»



#### [related methods / technologies]

SHOT feature descriptor, PPF descriptor, 3D-DNN, Point Net, dead reckoning, DP matching

\Recognition and estimation/

## State estimation

estimate invisible internal states such as quality and health

#### [application example keywords]

machine, patient, food and farm product. operation mode, quality, congestion, infrastructure monitoring



#### [Keyword]

Bayesian estimation clustering pattern recognition deep learning transfer learning semi-supervised learning adversarial learning neural network data mining (continued to the back)



### [related methods / technologies]

filter bank, blind signal separation, state space model, Kalman filter, hyper spectrum analysis



secure computing, Bayesian networks



\Recognition and estimation/

## Sensor data recognition

recognize objects based on sensor data (ex. whether it's a man or an object / whether it's a craw or a crane.)

#### [Keyword] (continued from the front)

adversarial learning artificial neural network clustering sparse modeling statistical learning computational learning theory

[related fields]

sensor fusion, life sciences, time series signal processing, ubiquitous computing

m the front) data mining knowledge base knowledge acquisition / discovery behavior estimation data science \Recognition and estimation/

## Anomaly detection

find anomalies that exceed normal or acceptable ranges.

[Keyword] (continued from the front)

computer vision<br/>clusteringknowledge acquisition/<br/>discoverysparse modeling<br/>artificial neural<br/>network<br/>knowledge sharing /<br/>managementskill science

[related methods / technologies] MT method, kernel density estimation, subspace method, invariant method, auto encoder

#### [related fields]

mechatronics, cyber security

#### \Recognition and estimation/

## State change detection

estimate state changes in device such as degradation or clogging.

[Keyword] (continued from the front)

clustering artificial neural network sparse modeling data mining knowledge acquisition / discovery simulation

#### [related fields]

mechatronics

#### \Recognition and estimation/

## Authentication

identify a person based on biological information or historical data

#### [related fields]

cyber security, theory of cryptography

#### \Recognition and estimation/

## **State estimation**

estimate invisible internal states such as quality and health

[Keyword] (continued from the front)

knowledge acquisition / discovery knowledge base application for medical / healthcare

#### [related fields]

signal processing, statistical mechanics, earth science, meteorology

\Prediction and control/

## **Operation plan**

make a operation plan that maximizes the objective under given condition

#### [Keyword] (continued from the front)

heuristics knowledge base behavior estimation distributed cooperation constraints satisfaction problem / satisfiability testing (CSP/SAT) graph theory

[related fields] mathematical programming \Analysis and summarization/

## Language data analysis

clearly show analysis results by inspecting big and various text data

#### [Keyword] (continued from the front)

social media information visualization kansei onomatopoeia ontology information retrieval conversation understanding / discourse understanding / intention understanding data science

#### knowledge base semi-supervised learning clustering dialogue processing / dialogue system data science auction market design / multimodal processing

#### [related fields]

database, natural language processing

#### \Analysis and summarization/

## Numerical analysis

clearly show analysis results by inspecting big and various numeric data

#### [Keyword] (continued from the front)

sparse modeling graphical models pattern recognition knowledge base simulation Bayesian estimation

#### [related fields]

mathematical statistics, database, preprocessing, data cleansing, noise reduction \Recognition and estimation/

## Indicator creation

give an index to the nature of an object under complex and ambiguous criteria

#### [application example keywords]

negotiation skill, design, health, development capability, movement capability, resume, economic indicators, sports



#### [Keyword]

deep learning representation learning (embedding) clusterina knowledgebase

knowledge acquisition / discovery

knowledge sharing / management 

#### [related methods / technologies]

regression analysis. PCA (principal component analysis), A/B test, hierarchical clustering

\Analysis and summarization/

Summarization

clearly show the gist of large

amount of information

[application example keywords]

text, numerical data, video, web data, report,

academic material. SNS, news article and video.

Q&A summary, questionnaire result, document, article

\Recognition and estimation/

## State change detection

recognize objects or what's heard from image, video, or sound information

#### [application example keywords]

speech recognition, Image recognition, visual inspection, waste, products, people. trees, automobiles, animals, heavy machinery



computer vision image recognition speech recognition generic object recognition pattern recognition semi-supervised learning «continued to the back»



#### [related methods / technologies]

phonetics, acoustic scene analysis, pre-learning

\Analysis and summarization/

## Causal inference

find causal relationship based on data: predict what changes what

#### [application example keywords]

epidemiology, economics, chemistry, sleep disorders, sales changes. root cause of failure estimation

#### numerical value causal relation text

inference algorithm clusterina

knowledge graph

#### [related methods / technologies]

independent component analysis, LiNGAM

\Design/

## Personalization

customize the displayed contents to match the users' (hidden) preferences

#### [application example keywords]

news articles, video distribution, dialogue, services, advertisement distribution

#### evaluation metrics





#### [Keyword]

information recommendation dialogue processing / dialogue system text mining knowledge acquisition / discovery kansei 《continued to the back》

#### [related methods / technologies]

privacy preserving calculation, privacy preserving data mining

\Analysis and summarization/

## Media data analysis

big and various image / video data

#### [application example keywords]

image, sound, vibration, surveillance image, fixed-point camera, microscope image, manufacturing line image, sports image



#### [Keyword]

computer vision image recognition generic object recognition data mining data science information visualization 

#### [related methods / technologies]

privacy preserving data mining, secure computing

## \Design/

Scheduling

determine what to be done in what order

#### [application example keywords]

advertisement, meeting, delivery, personnel shift



## [Keyword]

scheduling planning genetic algorithms multi-agent constraints satisfaction problem / satisfiability testing (CSP/SAT) reinforcement learning heuristics simulation distributed cooperation (continued to the back)



## Mediation and planning

support fair consensus building and give advice on ethical issues

### [application example keywords]

voting, consensus building, compliance



### [Keyword]

multi-agent information recommendation social media collective intelligence knowledge sharing / management Web intelligence management applications intelligent UI text mining summarization ontology «continued to the back»





summarization text minina reinforcement learning Web intelligence segmentation «continued to the back»

text

media

[Keyword]



summarized sentence

#### [related methods / technologies]

extractive summarization, abstract summarization, lead method, GAN, pointer networks, pre-training, LexRank



statistical causal analysis, structural equation modeling, causal graph.

[Keyword]



clearly show analysis results by inspecting

\Design/

## Scheduling

determine what to be done in what order

[Keyword] (continued from the front)

evolutionary computation swarm Intelligence behavioral economics graph theory knowledge acquisition / discovery

#### \Design/

## Personalization

customize the displayed contents to match the users' (hidden) preferences

#### [Keyword] (continued from the front)

ontology knowledge base knowledge graph game theory reinforcement learning social media affordance art / entertainment application non-task oriented dialogue information retrieval semi-supervised learning

\Recognition and estimation/

## State change detection

recognize objects or what's heard from image, video, or sound information

#### [Keyword] (continued from the front)

transfer learning deep learning adversarial learning artificial neural network gesture recognition clustering sparse modeling knowledgebase knowledge acquisition / discovery

medical / healthcare application kansei engineering action estimation affordance cloud sourcing / human computation video processing

#### \Recognition and estimation/

## **Authentication**

give an index to the nature of an object under complex and ambiguous criteria

#### [Keyword] (continued from the front)

auction kansei engineering onomatopoeia knowledge graph ontology dialogue processing / dialogue systems multi-agents cloud sourcing / human computation

#### [related fields]

marketing research, management studies, product design, natural language processing

\Collaboration and trust formation/

## Mediation and planning

support fair consensus building and give advice on ethical issues

#### [Keyword] (continued from the front)

knowledge acquisition / discovery, knowledge graph Al ethics, privacy computational social sciences behavioral economics Behavior modification (nudge) shikakeology application of social issues auction

\Analysis and summarization/

## Media data analysis

clearly show analysis results by inspecting big and various image / video data

#### **[Keyword]** (continued from the front)

representation learning (embedding) semi-supervised learning clustering sparse modeling multi modal analysis

#### speech recognition video image processing art / entertainment applications affordance

[related fields] optics, acoustics, mechanical vibration engineering, preprocessing, data cleansing, noise reduction

#### \Analysis and summarization/

## **Causal inference**

find causal relationship based on data; predict what changes what

#### [related fields]

statistical causal analysis, design of experiments randomized controlled trials, stratified analysis econometrics

#### \Analysis and summarization/

## **Summarization**

clearly show the gist of large amount of information

#### **[Keyword]** (continued from the front)

information retrieval deep Learning sparse modeling representation learning (embedding) information visualization conversation understanding / discourse understanding / intention understanding

pattern recognition image generation knowledge sharing / management ontology knowledge graph knowledge base

#### [related fields]

information retrieval

game theory kansei decision making and consensus building swarm intelligence human-agent interaction fuzzy logic constraints satisfaction problem / satisfiability testing (CSP/SAT)

#### \Design/

## **Placement and design**

decide complicated arrangements and combinations to meet the required conditions

#### [application example keywords]

production planning, procurement planning, personnel shift, investment planning, layout planning, layout optimization, shelving allocation

condition	~	combination example
numerical value	_/	design plan
category		layout plan
objective index		

#### [Keyword]

planning constraints satisfaction problem / satisfiability testing (CSP/SAT) genetic algorithm simulation evolutionary computation graph theory multi-agent heuristics 

onomatopoeia constraints satisfaction problem satisfiability testing (CSP/SAT) 0000 evolutionary computation art / entertainment application knowledge base

\Design/

## Coordination

show proposals from many combinations

#### [application example keywords]

fashion, travel plans, class attendance plans. food menus

er preference input	>	combination of data that	
data about candidates		matches user preferences	

#### [Keyword]

us

information recommendation genetic algorithm kansei



knowledge acquisition / discovery (continued to the back)

\Generation and dialogue/

## **Knowledge organization**

understand and structuralize meaning from documents for extracting relevant knowledge

#### [application example keywords]

\Collaboration and trust formation/

Ordering and selection

show appropriate selection criteria or order,

and present candidates for selection

screening, tournaments, selection



#### [Keyword]

planning constraints satisfaction problem / satisfiability testing (CSP/SAT) genetic algorithms knowledge sharing / management knowledge acquisition / discovery Al fairness social problem application market design multi-agent decision-making and consensus building information visualization swarm intelligence sparse modeling



#### [application example keywords]

FAQ generation, Web search, risk assessment, investment decision, information retrieval, data sharing, knowledge sharing

text



#### [Keyword]

ontology summarization knowledge sharing / management crowdsourcing knowledge graph text minina web interaction expert system onomatopoeia intelligent UI



#### [related methods / technologies]

database, knowledge management, philosophy

\Generation and dialogue/

## Speech dialogue

respond appropriately by understanding people's intentions based on natural language, intonation, facial expressions, etc. (paralanguage)

#### [application example keywords]

handling at the counter, call center. web service, elderly people support



#### [Keyword]

dialogue processing / dialogue system speech recognition speech generation non-task-oriented dialogue conversation understanding / discourse understanding / intention understanding HAI (continued to the back)

[related methods / technologies] cognitive science

\Generation and dialogue/

Advice

display candidates that match the user based on expert knowledge and considering complex influences

#### [application example keywords]

finance, health care, legal consultation, fitness, daily matters consultation, energy conservation, safe driving

text user input Image

#### [Keyword]

information recommendation reinforcement learning expert system knowledge base dialogue processing / dialogue system knowledge acquisition / discovery Al ethics HAI «continued to the back»

[related methods / technologies] A/B test

\Generation and dialogue/

## Media transformation

generate target data by transformation or augmentation of input data

#### [application example keywords]

photo, line art, manga, 3D, speech quality, image compression



#### [Keyword]





(continued to the back)

[related methods / technologies] Style Transfer, VGG, GAN, Cycle GAN

#### \Generation and dialogue/

## Media generation

Automatically generate article conversation or CG from data

#### [application example keywords]

news article script, CG of sign language, novel, music



image generation video processing conversation understanding / discourse understanding / intention understanding summarization knowledge sharing / management ontology 《continued to the back》



[related methods / technologies] GAN, DeepFake, StyleGAN, speech synthesis, Text to Speech (TTS)

\Generation and dialogue/

## Media transformation

generate target data by transformation or augmentation of input data

[Keyword] (continued from the front)

knowledge graph knowledge base conversation understanding / discourse understanding intention understanding information visualization art / entertainment application VR \Generation and dialogue/

## Speech dialogue

respond appropriately by understanding people's intentions based on natural language, intonation, facial expressions, etc. (paralanguage)

[Keyword] (continued from the front)

multimodal interaction kansei gesture recognition HRI symbol emergence in robotics behavior estimation shikakeology business applications biomedical and health care applications speech generation

#### \Design/

## Coordination

show proposals from many combinations

[Keyword] (continued from the front)

game theory distributed collaboration

#### \Design/

## Placement and design

decide complicated arrangements and combinations to meet the required conditions

[Keyword] (continued from the front)

market design business application distributed coordination

\Generation and dialogue/

## Media generation

Automatically generate article, conversation or CG from data

[Keyword] (continued from the front)

knowledge graph adversarial learning deep learning pattern recognition HAI kansei intelligent UI bioinformatics materials informatics art / entertainment application

#### [related fields]

hidden Markov model (HMM), Deep Belief Network, spectral envelope

#### \Generation and dialogue/

## Advice

display candidates that match the user based on expert knowledge and considering complex influences

#### [Keyword] (continued from the front)

multimodal interaction statistical learning computational learning theory kansei intelligent user interface conversation understanding / discourse understanding discourse understanding HRI Web interaction behavior modification (Nudge) onomatopoeia text mining

[related fields] medical science economics Jurisprudence

ontology knowledge graph knowledge sharing / management fuzzy logic collective intelligence well-being computing educational applications behavioral economics information retrieval, auction decision making / consensus building skill science embodiment speech generation

#### \Generation and dialogue/

## **Knowledge organization**

understand and structuralize meaning from documents for extracting relevant knowledge

#### [Keyword] (continued from the front)

knowledge base knowledge acquisition / discovery decision making / consensus building social media information recommendation

#### \Collaboration and trust formation/

## Ordering and selection

show appropriate selection criteria or order, and present candidates for selection