



### **TCT/TTA Joint Seminar 2018**

Disruptive Technology and 5G supporting Thailand 4.0: Challenge and Opportunity

# NTT's Four AI Directions and Communication Science

February 01, 2018

# corevo<sup>™</sup>: AI Technologies of NTT Group



Press release on 30<sup>th</sup> May, 2016

- AI technologies accelerating collaborations with variety of players in different fields and creating infinite values
- Human and machine collaboration for revolution







http://www.ntt.co.jp/index e.html

# **COREVO**<sup>™</sup>: Four AI directions set by NTT



TOI



Monitors human-generated information and understands human intentions and emotions

Daily activity assistance

Agent-Al

Senior Citizen
Support and Care

<mark>H</mark>uman

Sports Heart – Touching – Al

Analyzes people's minds and bodies to understand their deep psyche, their intellect and their instincts

**Well-being** 

Interpersonal Relationship Healthcare

Driving support

Analyzes people, things and the environment so that it can instantly make predictions and provide control

Ambient-Al

ipport

Avoid congestions in events

Disaster preventions and recovery

Failure Predictoin

Network-Al

Connects multiple Als to optimize the entire social system

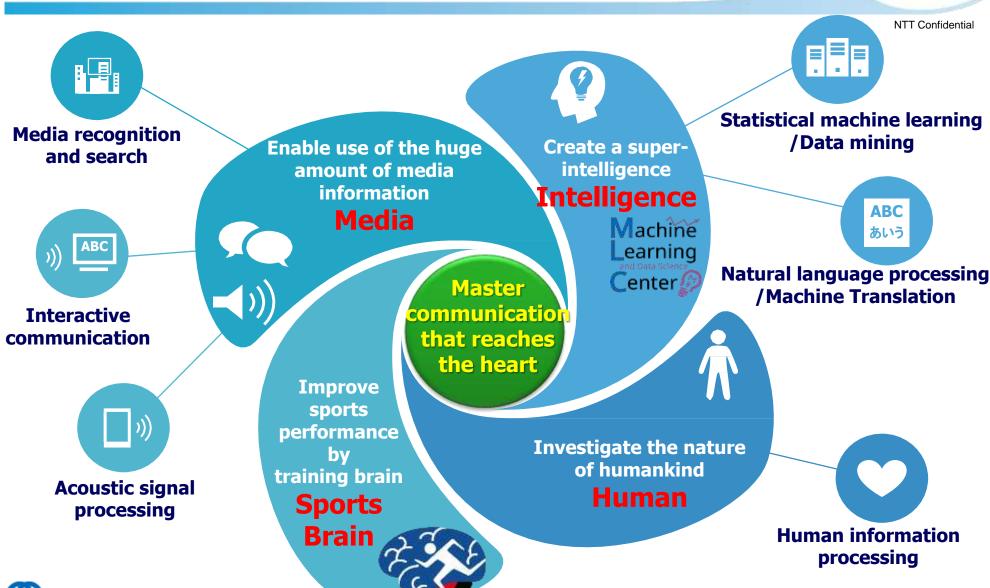
Failure free Network

Networ

Global-scale Total Optimization

### **NTT CS Labs - Mission and Research domains**





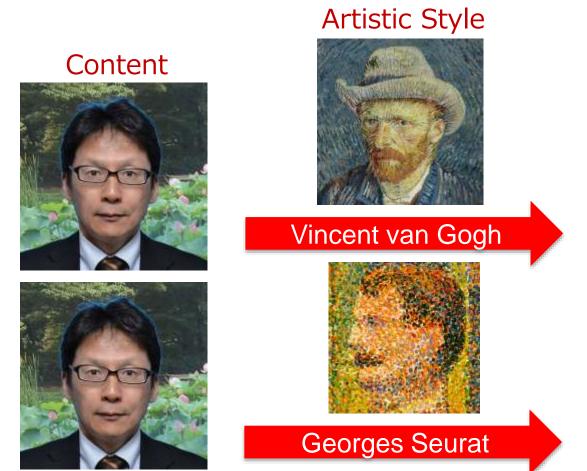


## Media generation by Deep Learning



NTT Confidential

## Can AI Make a Masterpiece of Painting?



### combination



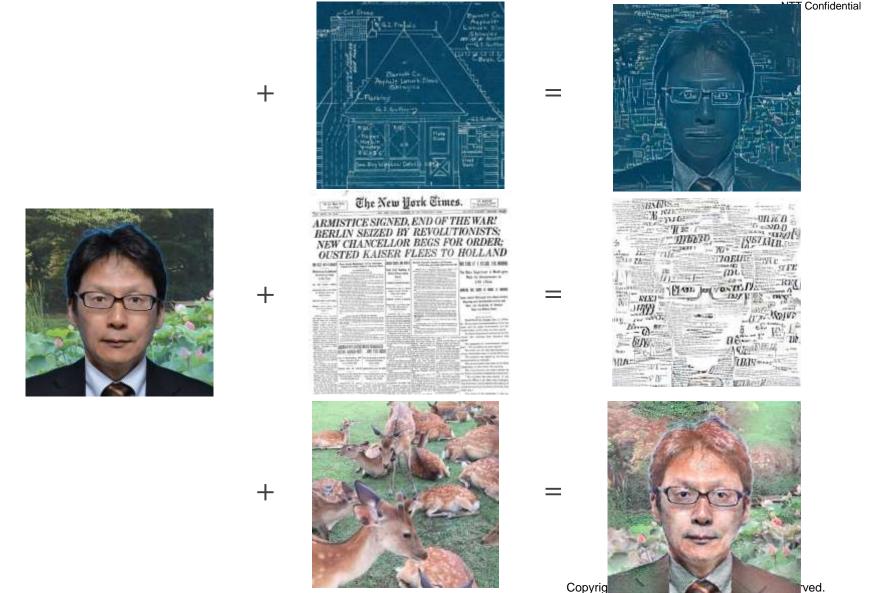


L. A. Gatys et al., "A Neural Algorithm of Artistic Style," arXiv 2015 Code: https://github.com/mattya/chainer-gogh



# Not Necessarily a Master Piece...









## In Search of "Ideal Smile"



NTT Confidential

## **Deep Attribute Controller**

T. Kaneko et al., "Generative Attribute Controller with Conditional Filtered Generative Adversarial Networks," CVPR 2017

- Multiple attributes can be freely given by interactive operation of image editing sense.
- Smiling faces can be automatically annotated with their styles.
- We can search for a face with a particular smile style in a DB







chuckle laughter grin convert to different smiling faces

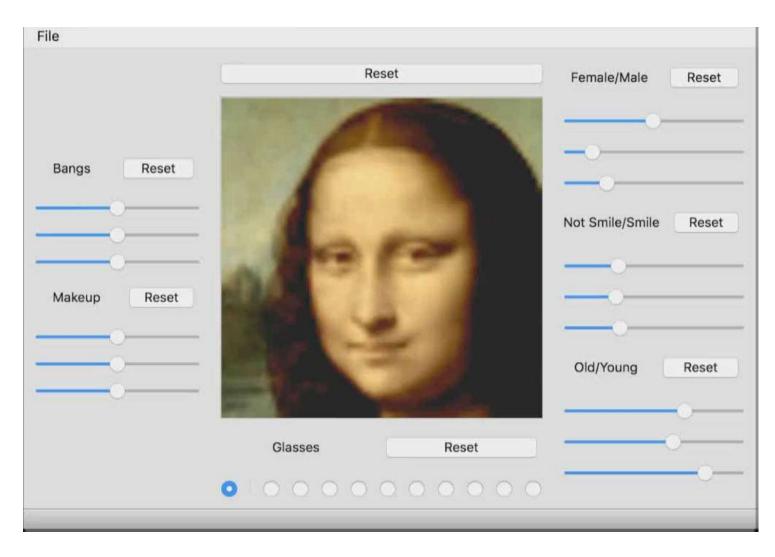


**Deep Attribute Controller** 

# **Demonstration of Deep Attribute Controller**



NTT Confidential



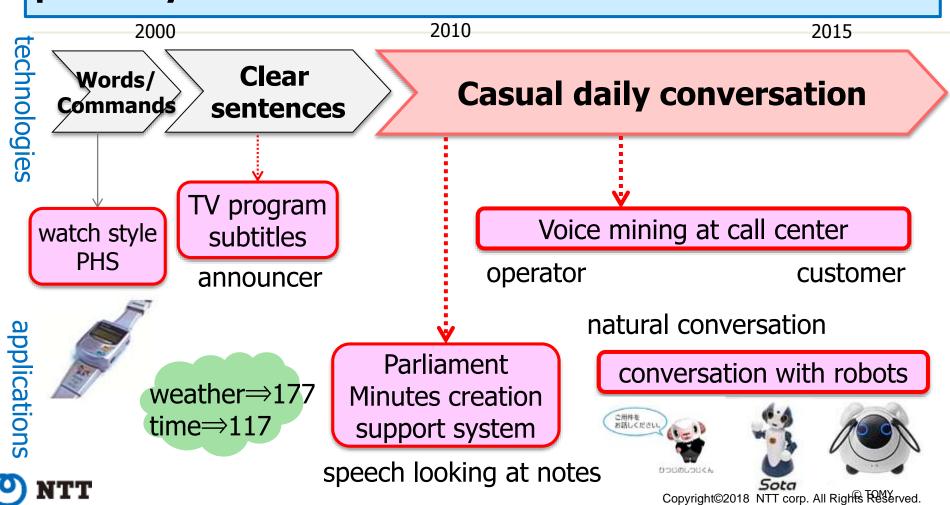




# Ears of AI: Speech Recognition for Agent-AI

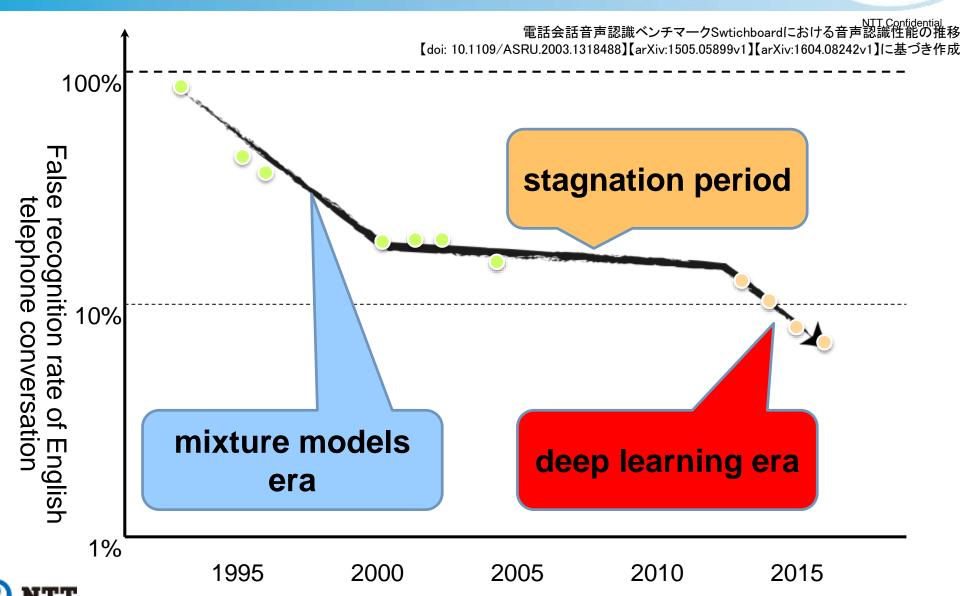


# Speech recognition has evolved significantly over the past 20 years



# **Evolution of Automatic Speech Recognition**





### **Voice Interface in the Near Future**

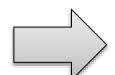


NTT Confidential

# The scope of speech recognition is being expanded

Current









One person speaks after a cue. Ex. voice search with a smart phone and an AI speaker.

Multiple people speak freely. Ex. conversation with robots, group meeting archiving,...



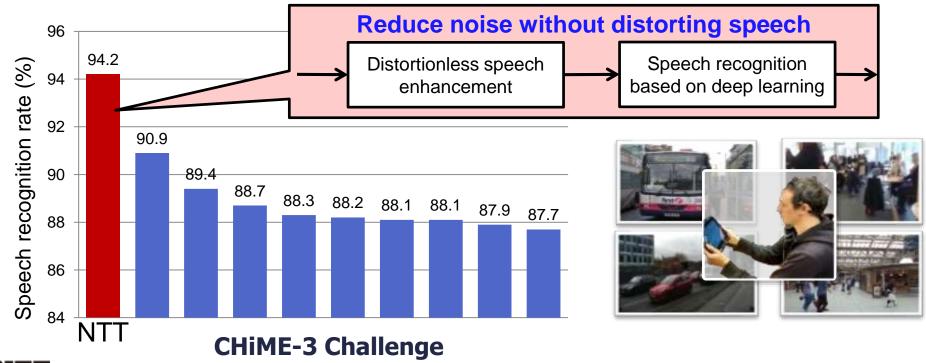


# **Speech Recognition in Noisy Environments**



NTT Confidential

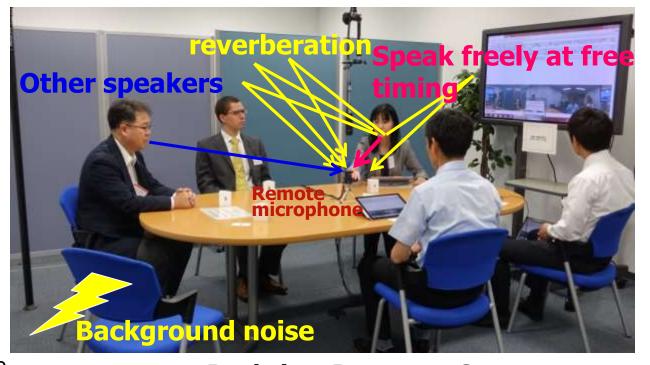
 NTT achieved top performance among 25 participating organizations in CHiME-3, an international technical evaluation of speech recognition in various noisy environments: bus, cafe, street, and pedestrian areas)

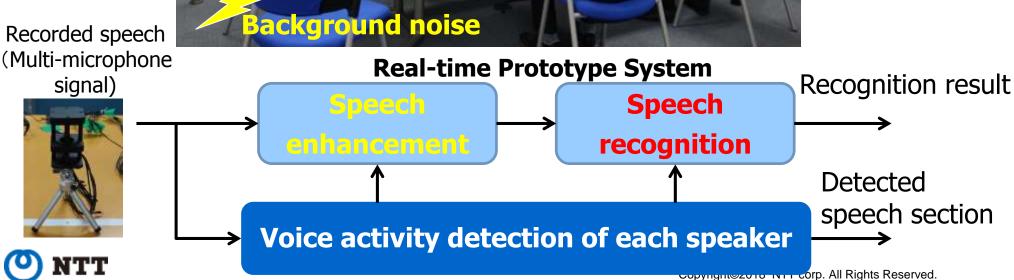


# **Speech Recognition When Multiple People Speak Freely**



NTT Confidential







# **Demonstration of Meeting Archiving**



#### NTT Confidential









# **Demonstration of Meeting Archiving**



#### NTT Confidential

1: はい[え一]皆さん本日はお集まりいただきましてありがとうございます[えーっと]こちらでは、[えーっと][あの]音声認識システムの援助さしていただいております、で、[えっと]今は、[あの一]ちょうど[ま]ミーティングのようなシチュエーションでの音声認識ということで、やらさしていただいておりまして、で[あの]外から、[あの]か なり、[あの一]、ノイズが聞こえてきて、と思うんですけれども、[ま]こういったをような状況でも[あの一]音声認 識ができるようなデモンストレーションになっております、で[えーっと][ま]私が一番の席に座っておりまして、 [え一]、2番3番4番5番ちょっと今だけてますけど6番っていう形、、[え一]席仲間なってますので、[ま]、[あ の]是非ちょっと皆さん一言ずつでもしゃべっていただければなと思うんですけれども。

6: [えー]。

2: 2番です入ってますか。

3:3番ですちょっと質問はあるんですけども、でこれは、話者の数話者の獣で喋ってる人の数っていうのは、 事前に分かっていて、その下でやってるんですか。

1: [えっと]これは荒木さんじゃあ説明して下さい。

6: [あ]はい分かりました[えーと]これは[あの]最大の人数は今システムはしってるんですけども[えっと一]実 際はですにここににたデモシステム実は知りません、[えーっと一]それぞれ、高校使ってるんですけども最初 の方向から声が来たらそれをきれいに[えーと]音声強調するということをしています、ちなみにここは6番席で した。

5:4番席ですけれども。

4: これは。

5: これは今マイク[ま]何使ってるんですか。

6: うん- [えっと]マイクは今こちらの[えっと]8つ8個を使っています。

1: はい「えー」皆さん本日はお集まりいただきましてありかとうございまずえーっととちらでは、「えーっとまあの」音声認識システムの<mark>提集さ</mark>していただいております。で、「えっと」今は、「あの一ちょうどはま・・・ァィングのようなシラューションでの音声認識ということで、中らさしていただいておりまして、であの)掛から、「あの」かなり、「あの 」、ノイズが観しえてきて、と思うんですけれども、ほしついった。 うな状況でも「あの一」音声認識ができるようなデモンストレーションになっておりま す、で「スーっと』ま」私が一番の席に座っておりまして、「スー」、2番3番4番5番 ちょっと今たけてますけど6番っていう形、、「スー」席件問なってますので、「ま」、「あ の1是非ちょっと皆さん一言ずつでもしゃべっていただければなと思うんですけれど 6: [2-]. 2:2番です入ってますか。

3: 3番ですちょっと質問はあるんですけども、でこれは、話者の救話者の…で呼 てる人の数っていうのは、事前に分かっていて、その下でやってるんですか。

1:【えっと】これは常木さんじゃあ出事して下さい。

6: [あたけい分かりました[えーとにれは[あの]最大の人数は今システムはしっし てるんですけどもしえっと一致胸はですにここににたデモシステム実は知りません。 【ス〜っと〜】それぞれ、高校使ってるんですけども最初の方向から声が来たらそれ をきれいに【え〜と】音声強調するということをしています、『4』の日ここは 6番席でし

5: 4番席ですけれるも。



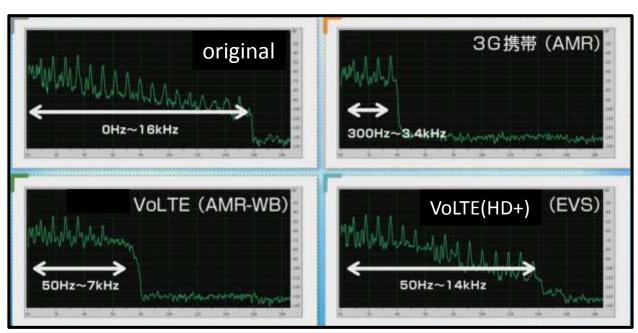




### **EVS: Enhanced Voice Services Codec for LTE**



- Next Gen 3GPP Speech Coding for Improved User Experience in Telephony
- More natural sounding speech and improved music quality
- Result of global 12 party collaboration including NTT and NTT docomo
- NTT docomo launched VolTE(HD+) in May 2016











# Analyzing and Converting Speech Prosody



In voice communication, non-verbal information such as intonation and accent is as important as textual information.

- Intonation: pitch changes in a sentence

```
「そうですか」Is that so? (納得⇔疑い♪)
agree doubt
「これじゃない」(断定調⇔同意を求める♪)
This is not, isn't it? definitive requesting agreement
```

- Accent: pitch changes in a word





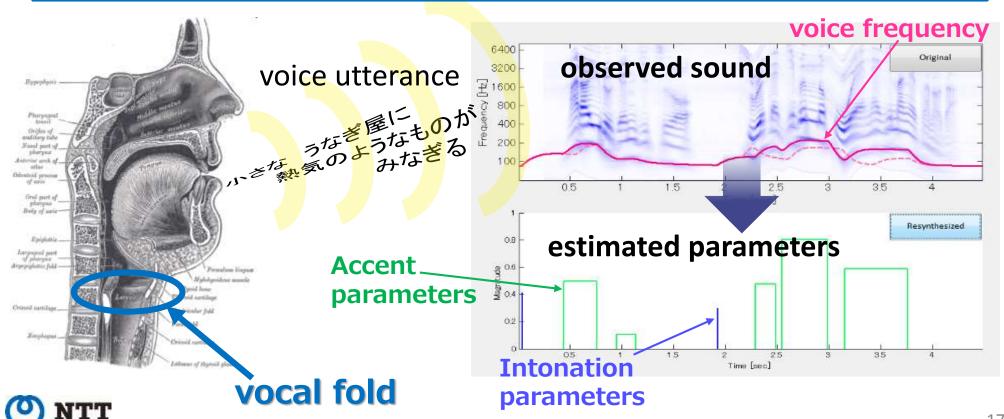
bridge



## **Modeling Voice Frequency Contours**

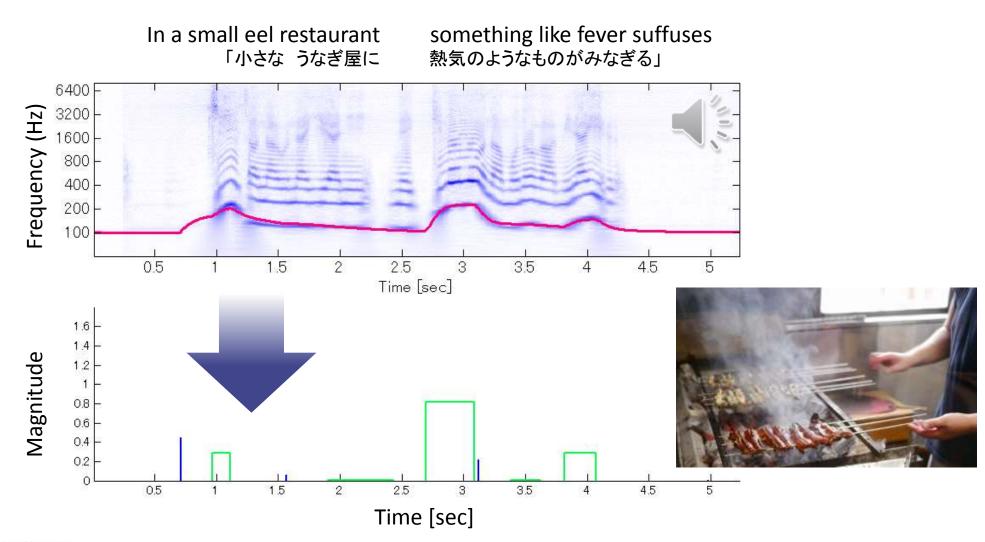


- Voice pitch is controlled by forces pulling the vocal fold.
- · The model was known but parameter estimation was hard.
- NTT succeeded in estimating the parameters from the uttered sounds.



# Example (1): Original input sequence

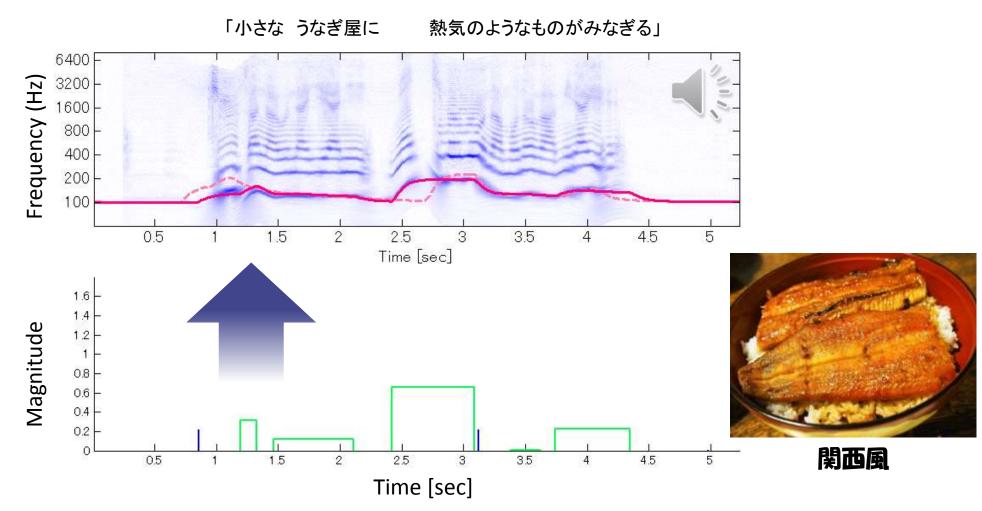






# Example (2): Change accent timings

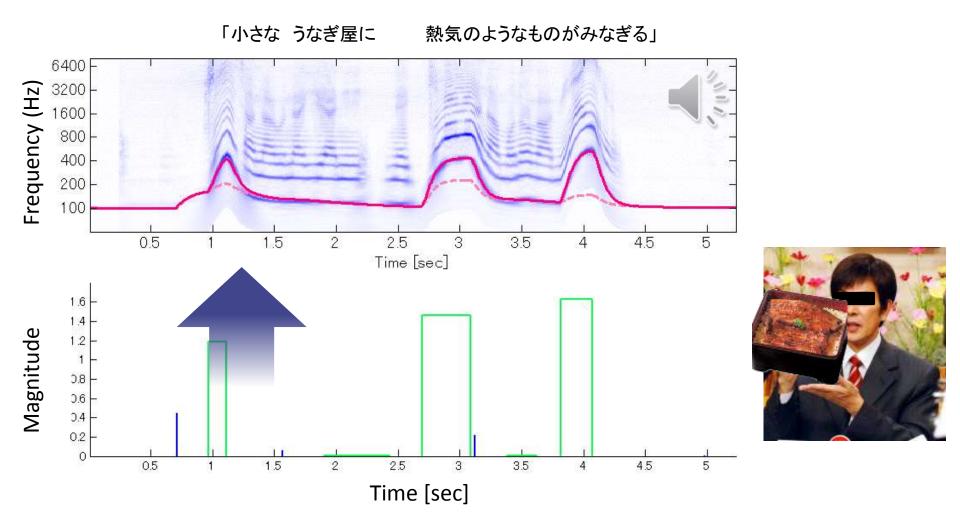






# Example (3): Change accent strengths







# Can a Robot Pass a University Entrance Exam?



 NTT joined AI grand challenge project: Can a robot pass a university entrance exam? as English Exam team (The project is hosted by National Institute of Informatics).

問2 Parker: I hear your father is in hospital.

Brown: Yes, and he has to have an operation next week.

Parker: 19 Let me know if I can do anything.

Brown: Thanks a lot.

- 1) Exactly, yes.
- 2 No problem.
- 3 That's a relief.
- (4) That's too bad.

All are grammatically correct.

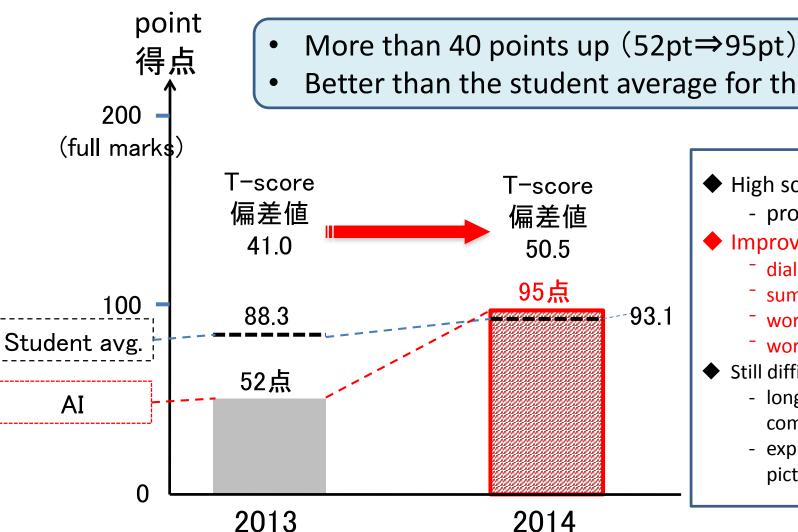
Commonsense knowledge can select the right answer as 4.





## The Result of English Mock Exam Test in 2014





- Better than the student average for the first time

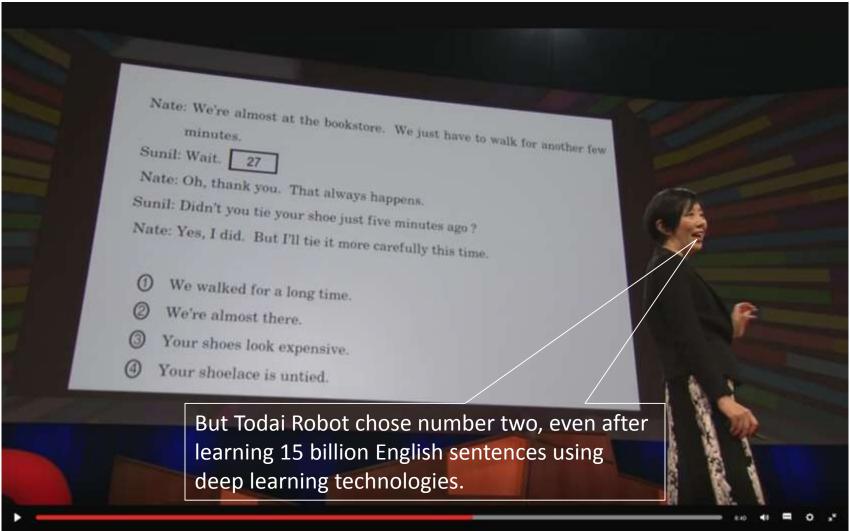
- ◆ High score in both years
  - pronunciations
- Improved over the last year
  - dialogue completion
  - summary understanding
  - word sense induction
  - word order correction
- Still difficult
  - long reading comprehension
  - explaining photos and pictures



# TED: Can a robot pass a university entrance exam? by Noriko Arai



### presented at an official TED conference





### **Voice of Students**





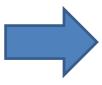
So surprising!



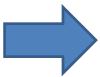
Feel frustrated, as I work so hard



**Great and I Feel envious** 



Many students do not even understand the problem statements.



We must train students.



**Reading Skill Test** 



### **Casual Conversation with Robot**









Joint research with Ishiguro Lab. @ Osaka University

SXSW2016





## From Casual Conversation to Serious Debate



robots

SXSW2017

Joint research with Ishiguro Lab. @ Osaka University





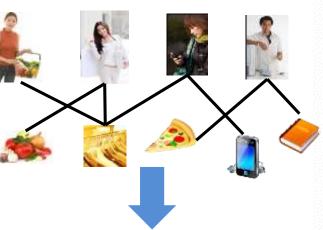
# **Finding Patterns from Human Behavior Data**





users

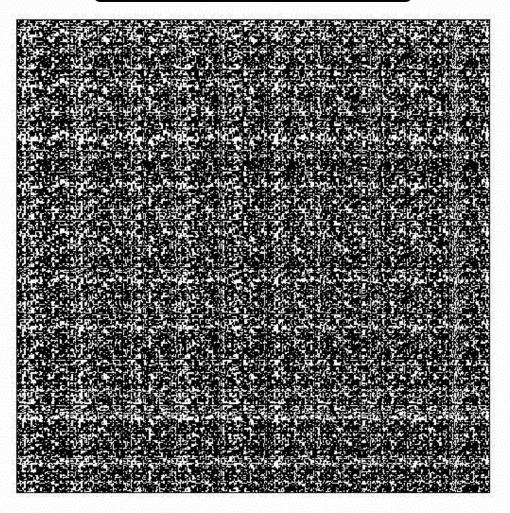
items



matrix representation

0	1		۵	o la	
	0	1	0	0	0
6	1	1	0	0	0
1/2	0	1	0	1	0
et.	0	0	1	0	1

### patterns







# **Discovering Patterns by Matrix Factorization**



- Human behavior data exhibit certain tendencies and patterns.
- NTT developed NMTF\* that can efficiently extract characteristic and (possibly) intersectional patterns from such complicated relational data.

### Input data

#### **User location data:**

time, latitude, longitude,...

### **Shop data:**

shop location and category,...

#### User attribute data:

sex, age, living area...

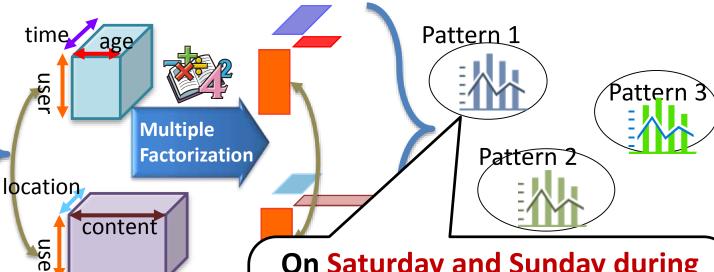
Content browsing history

#### Climate data:

weather, temperature, humidity, ...

### **Apply NMTF**

### **Discovered patterns**



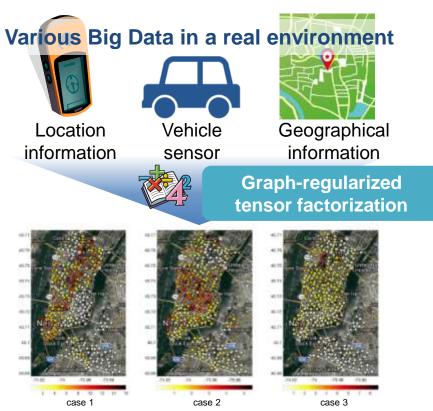
On Saturday and Sunday during the day, many women in their thirties living in the east district visit cafe in the west district



# **Extensions to Matrix Factorization Analysis**

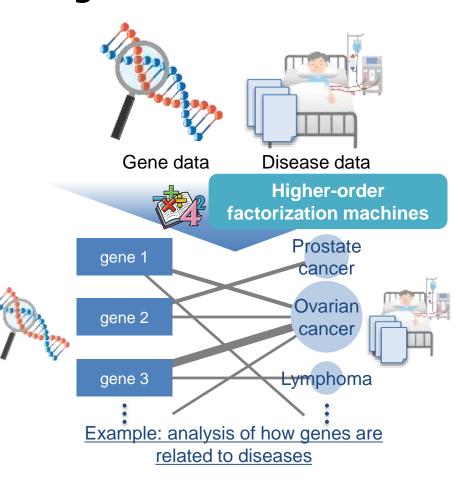


### **Spatio-temporal extension**



Example: prediction of rental bicycle use in New York

## higher-order extension





# From Agent-AI to Heart-Touching-AI



Agent-Al

understands your intentions and emotions and

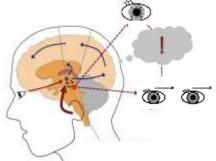
behave like a human



Heart-Touching-Al

understands your psychological, subconscious and instinctual states and appeals directly to your heart



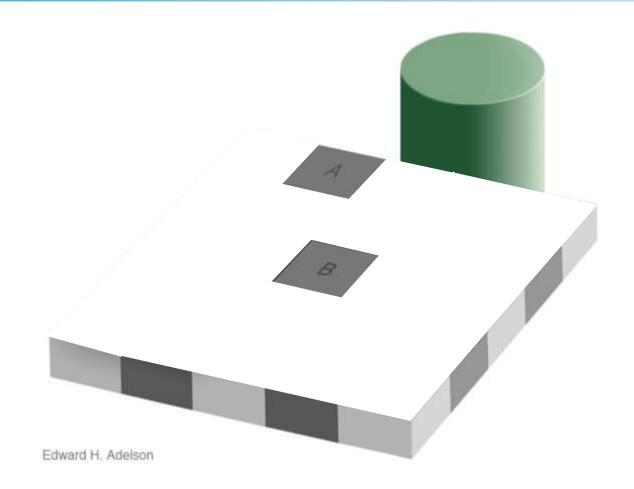






# What you perceive is not what it is



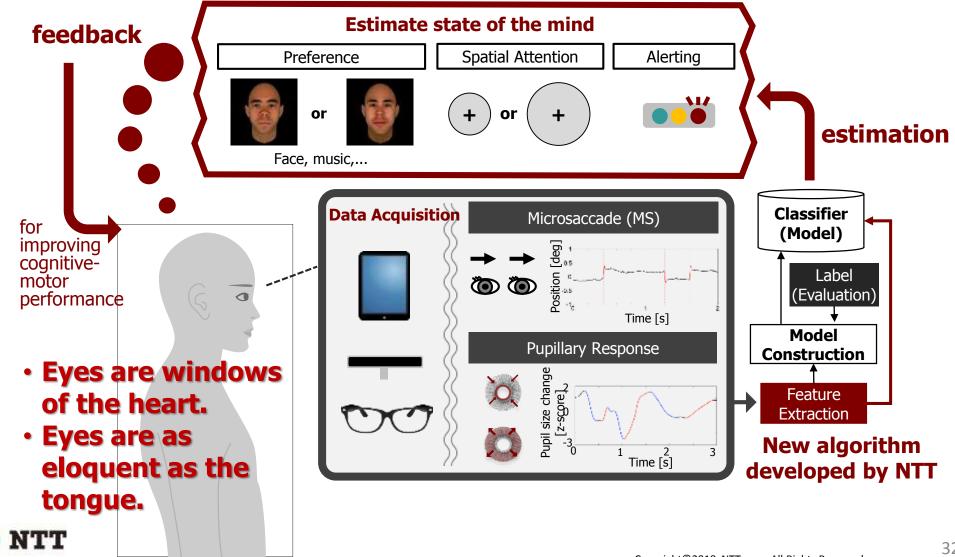


This effect demonstrates the success rather than the failure of the visual system.





# Reading Mind from Unconscious Eye Movements



# **Mind Reading Overview**





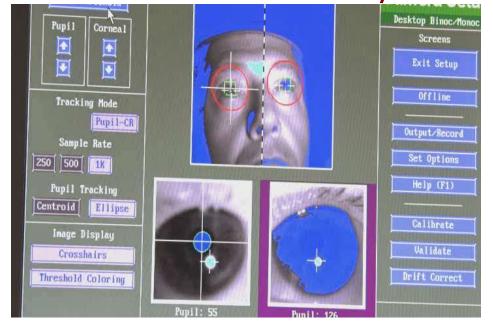








81 features are analyzed





# **Mechanism of Mind Reading**

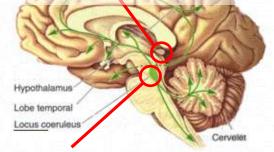


Aston-Jones, G., & Cohen, J. D. (2005). Annu Rev Neurosci.

### SC: Superior Colliculus (上丘)

眼球運動・瞳孔径の制御、視覚・聴覚・触覚入力

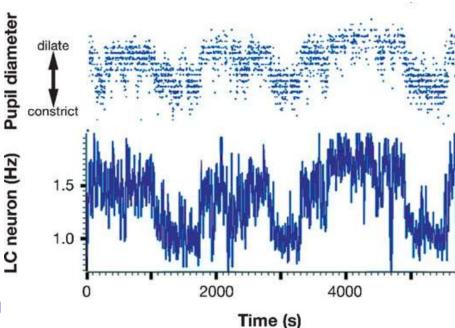
controls eye movement and pupil diameter



### LC: Locus Coeruleus (青斑核)

覚醒レベルの制御、選択的注意などに関与

controls arousal level and selective attention



Did you like today's dinner?





# Tactile/haptic Sense Opens New Information Channels

Palpable Intelligence (触知性):

tactile/haptic sense conveys deep information rooted in the body



# Intelligence of tactile sense that generates information

69<sup>th</sup> Mainichi Bunka Award (Natural Science Section)

November, 2015



Junji Watanabe



## Buru-Navi: Gives You a Feeling of Being Pulled

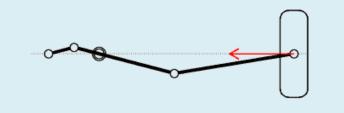


- The device held in fingers creates the sense of being pulled.
- It makes use of the nonlinear characteristics of human perception and asymmetrically oscillating stimuli.



### Sensory-motor mechanism in human:

- strong & short stimulus is easy to feel
- weak & long stimulus is hard to feel





# Sensory Illusion caused by Buru-Navi





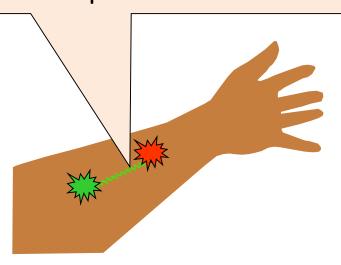


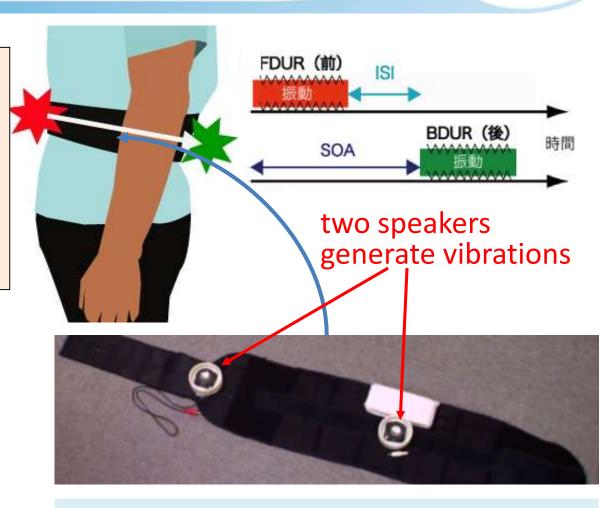


### "Through-and-Through" Sensation Interface



When two separate tactile stimuli with a certain time difference are presented, the impression of continuous movement between the two points is perceived.





A through-and-through sensation is perceived between stomach and back.



### **Demonstration**

TBSがっちりマンデー!!Innovertive RED by NTT







## **Ultra-Future Experiential Public Phone**



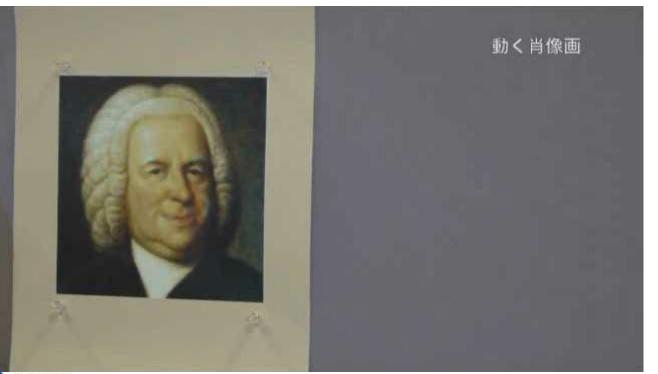




# **Hengento Projection**



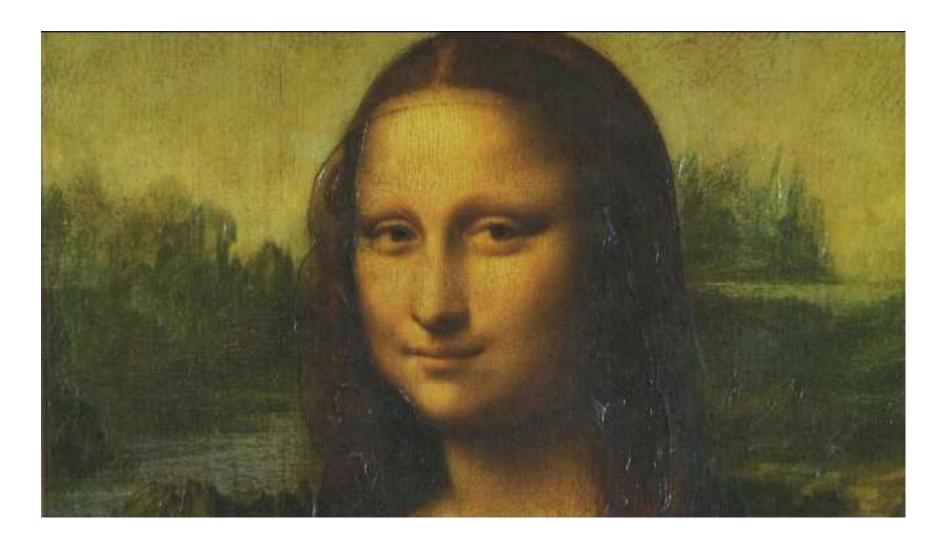
- A light projection technology that adds a variety of illusory, yet realistic motions to a static object
- It is applied to the Next-generation POP (point-of-purchase) signage expressing sizzling feelings (collaborated with DNP)





# 变幻灯: Mona Lisa







# 变幻灯: Moving Brick Wall

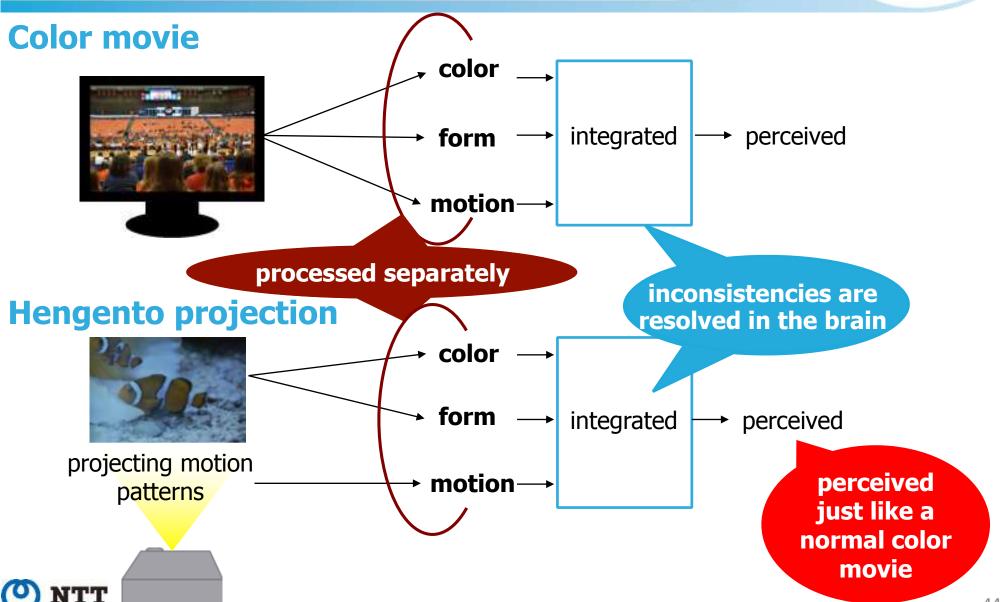






# **Hacking Human Visual System**





## Curve ball is Created by the Eyes and the Brain



Shapiro et al. 2010

5



## **Spors Brain Science Project**





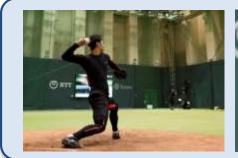
Mental drive
Tension/relaxation
Tactical maneuvering

Body etc. Skill

Muscle strength
Cardio-pulmonary
function
Injury prevention
etc.

Well coordinated motion
Accurate situation
assessment
Instantaneous decision
making

Measurement using wearable sensing and virtual reality



**Targets** 

으

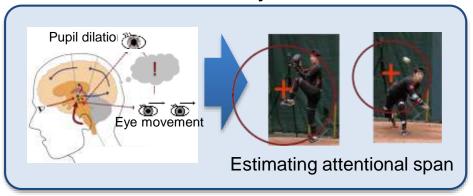
S

BS

**Project** 



Estimation of psychological state using measurement of eye movements



"Split seconds matter - the brain and sport" http://sports-brain.ilab.ntt.co.jp/document/20170907\_nature.pdf



argets

of conventiona

sports science

### Which is the Former Professional Player?





ball speed is the same (100 km/h)

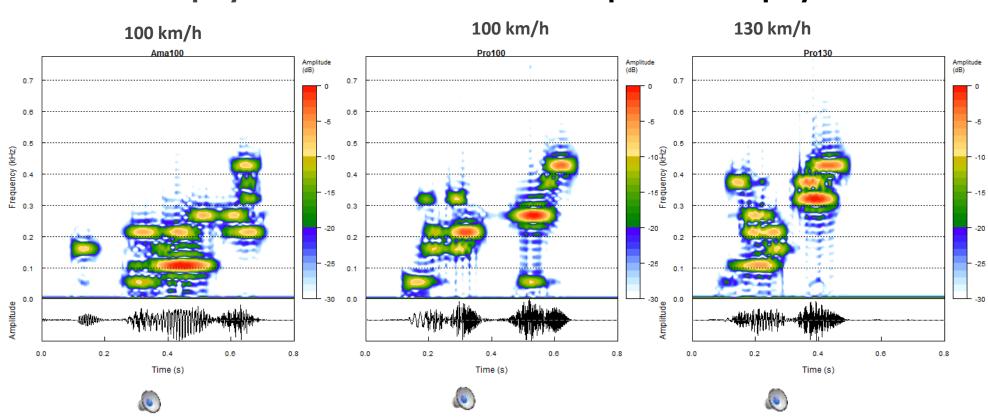


### "Sonification" of Muscle Activities



#### **Amateur player**

#### Former professional player





## The Split Seconds Matter





predict

予測する/させない **0.1 sec.** をめぐる攻防

battle for 0.1 sec.

0.5 sec.



predict

(conscious level) predict

予測(自覚的)

(subconscious level)

予測(無自覚的)

plan

運動計画

0 sec.

**Go or NoGo** 

do

運動実行

adjust online オンライン調整

Implicit「潜在的」



Yu Darvish Pitch Overlay https://www.youtube.com/watch?v=jUbAAurrnwU conscious

意識

### **Smart Bullpen**





### http://sports-brain.ilab.ntt.co.jp/

- Reveal implicit brain functions underlying the outstanding performance of top athletes.
- Develop effective training methods that help athletes to raise their game.

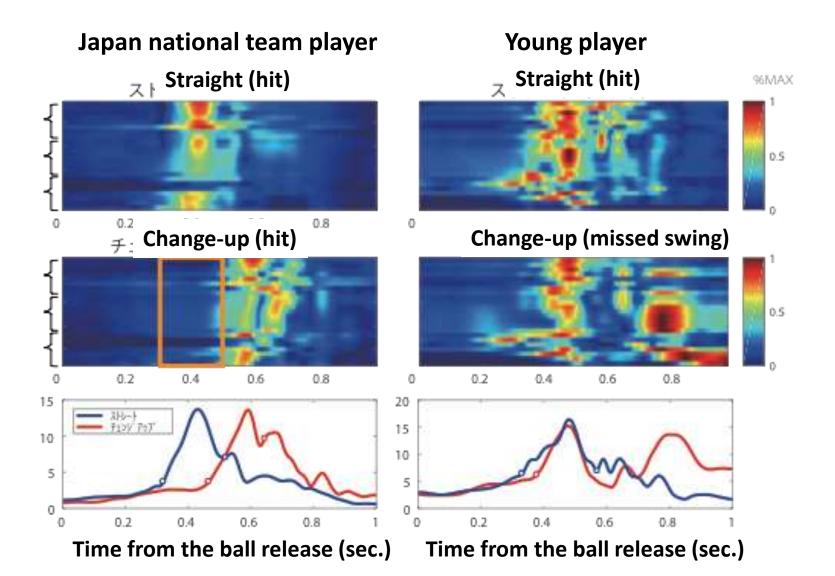




### A Good Batter can Hold and Make Time

打てる打者は「タメ」を作れる









### Thank you for your time and attention!



**Human and machine collaboration for revolution** 



### **Deep Learning is Everywhere**



Deep learning ≈ artificial intelligence

It is widely used in many practical applications such as: machine translation, image recognition, anomaly detection, games, robots, automatic driving cars.









### **Real-time Prototype System**







リアルタイム 複数人会話音声認識 Real-time multi-persons speech recognition



発話区間検出、音声強調、音声認識 Voice activity detection, speech enhancement and speech recognition



# Coordinated Dialogue Control with Multiple Robots

- Coordinated multiple robots can improve dialogue even under some speech recognition/generation errors.
- Impression is greatly improved by switching robots appropriately considering human cognitive characteristics.

**Robot B** 

Detect recognition error

Switch to robot-to-robot dialogue to avoid breakdown

What kind of foods do you like?

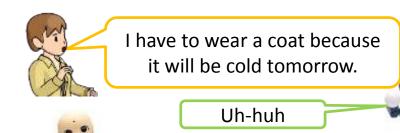
I like Rain Man. (Recognition error: Ramen/Rain Man)

OK. (Detect recognition error)

I like Curry Rice! (Shift to robot-to-robot dialogue)

Detect generation error

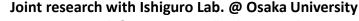
Switch from one robot to the other to reduce discomfort



Chesterfield coats are the latest fashion this year.

Robot B





# **Demonstration (in Japanese)**





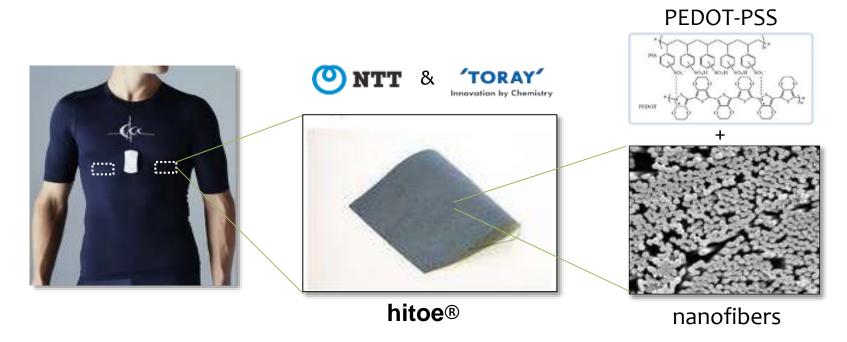


### **Functional materials: hitoe®**





- Just wearing "hitoe" medical wear enables to detect medicalquality ECG (electrocardiography) signals and heart rates.
- It is developed and commercialized jointly by Toray and NTT.

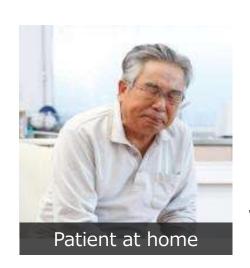




## Home monitoring of a heart disease patient



A simple Holter ECG monitoring system with hitoe will reduce patient burden and improve examination efficiency in health screening and home medical care.





Medical wear

The doctor checks the status and contact patient's home



with



Abnormal values are immediately reported to the hospital

