ARTIFICIAL INTELLIGENCE

THE INSIGHTS YOU NEED FROM HARVARD BUSINESS REVIEW

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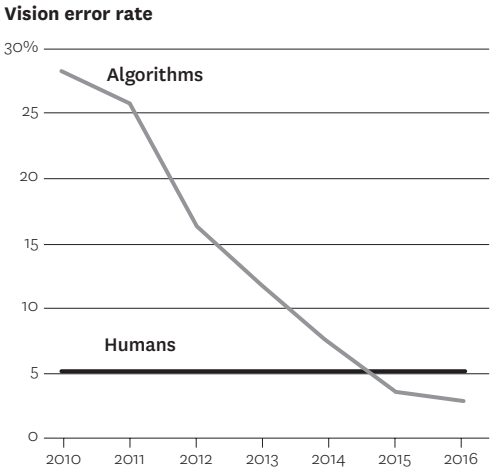
FIGURE 1-1

Machines have made real strides in distinguishing among similar-looking categories of images



Source: Electronic Frontier Foundation

TABLE 1-1

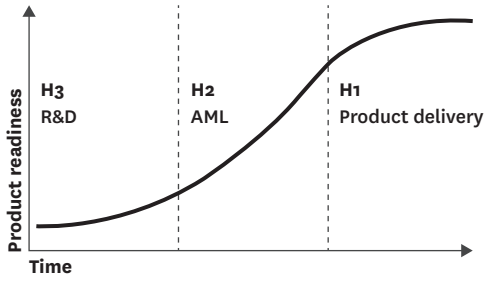
Supervised learning systems

As two pioneers in the field, Tom Mitchell and Michael I. Jordan, have noted, most of the recent progress in machine learning involves mapping from a set of inputs to a set of outputs. Some examples:

Input X	Output Y	Application
Voice recording	Transcript	Speech recognition
Historical market data	Future market data	Trading bots
Photograph	Caption	Image tagging
Drug chemical properties	Treatment efficacy	Pharma R&D
Store transaction details	Is the transaction fraudulent?	Fraud detection
Recipe ingredients	Customer reviews	Food recommendations
Purchase histories	Future purchase behavior	Customer retention
Car locations and speed	Traffic flow	Traffic lights
Faces	Names	Face recognition

FIGURE 2-1

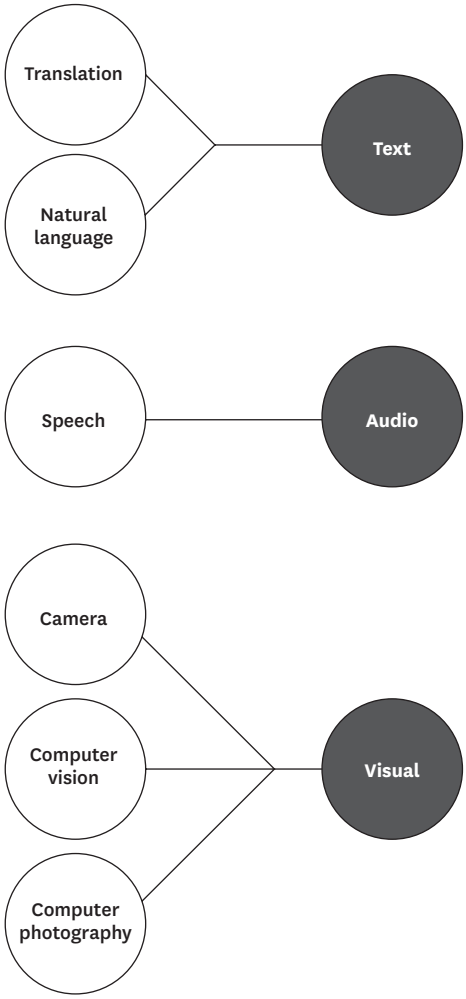
Where AI fits in at Facebook



Source: Facebook

FIGURE 2-2

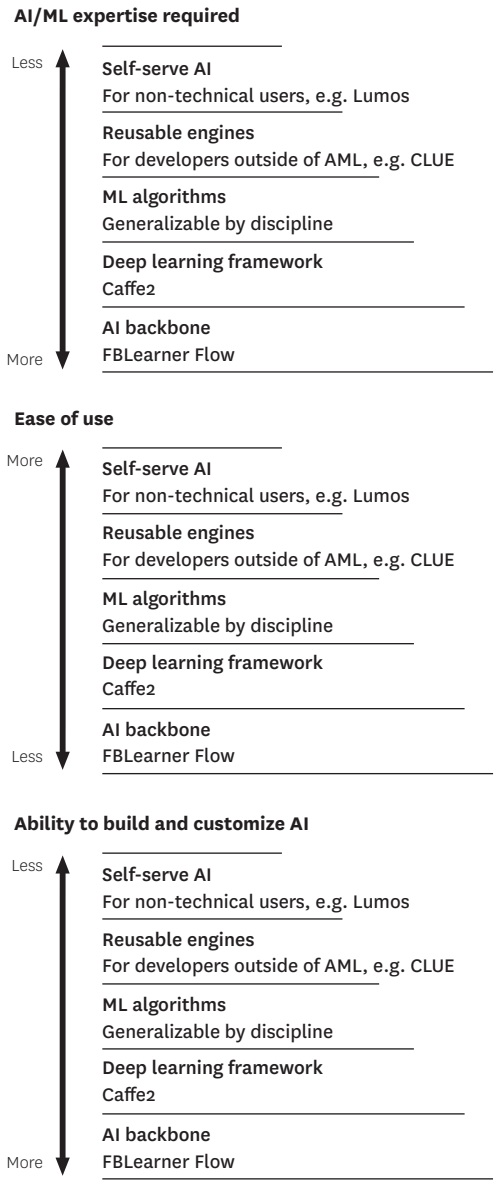
Applied machine learning



Source: Facebook

FIGURE 2-3

Layer cake of AI



Source: Facebook

The Value of Collaboration

Companies benefit from optimizing collaboration between humans and artificial intelligence. Five principles can help them do so: Reimagine business processes; embrace experimentation/employee involvement; actively direct AI strategy; responsibly collect data; and redesign work to incorporate AI and cultivate related employee skills. A survey of 1,075 companies in 12 industries found that the more of these principles companies adopted, the better their AI initiatives performed in terms of speed, cost savings, revenues, or other operational measures (see the figure).

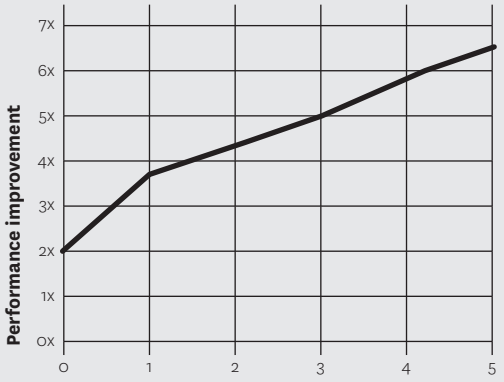

Performance improvement
7X
6X
5X
4X
3X
2X
1X
0X
0
1
2
3
4
5
Number of human-machine collaboration principles adopted
(0 indicates the adoption of only basic, noncollaborative AI)

TABLE 9-1

Enhancing performance

At organizations in all kinds of industries, humans and AI are collaborating to improve five elements of business processes.

Element	Business process	Company or organization	Type of collaboration
Flexibility	Auto manufacturing	Mercedes-Benz	Assembly robots work safely alongside humans to customize cars in real time.
	Product design	Autodesk	Software suggests new product design concepts as a designer changes parameters such as materials, cost, and performance requirements.
	Software development	Gigster	AI helps analyze any type of software project, no matter the size or complexity, enabling humans to quickly estimate the work required, organize experts, and adapt workflows in real time.
Speed	Fraud detection	HSBC	AI screens credit- and debit-card transactions to instantly approve legitimate ones while flagging questionable ones for humans to evaluate.
	Cancer treatment	Roche	AI aggregates patient data from disparate IT systems, speeding collaboration among specialists.
	Public safety	Singapore government	Video analytics during public events predicts crowd behavior, helping responders address security incidents rapidly.
Scale	Recruiting	Unilever	Automated applicant screening dramatically expands the pool of qualified candidates for hiring managers to evaluate.

Element	Business process	Company or organization	Type of collaboration
Scale (continued)	Customer service	Virgin Trains	Bot responds to basic customer requests, doubling the volume handled and freeing humans to address more-complex issues.
	Casino management	GGH Morowitz	Computer-vision system helps humans continuously monitor every gaming table in a casino.
Decision making	Equipment maintenance	General Electric	"Digital twins" and Predix diagnostic application provide techs with tailored recommendations for machine maintenance.
	Financial services	Morgan Stanley	Robo-advisers offer clients a range of investment options based on real-time market information.
	Disease prediction	Icahn School of Medicine at Mount Sinai	Deep Patient system helps doctors predict patients' risk of specific disease, allowing preventive intervention.
Personalization	Guest experience	Carnival Corporation	Wearable AI device streamlines the logistics of cruise-ship activities and anticipates guest preferences, facilitating tailored staff support.
	Health care	Pfizer	Wearable sensors for Parkinson's patients track symptoms 24/7, allowing customized treatment.
	Retail fashion	Stitch Fix	AI analyzes customer data to advise human stylists, who give customers individualized clothing and styling recommendations.