# Empowering Social Science Research with Industry Partnerships

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VIEWPOINT: THE FUTURE

## Through the Glass Lightly

A collection of scientists at the frontier were asked what they see in the future for science.\* Here are their views

If you can look into the seeds of time, And say which grain will grow and which will not, Speak then to me, who neither beg nor fear Your favors nor your hate.

Shakespeare, Macbeth, 1,3,58-61

THERE WILL BE ENORMOUS INFOADS INTO human biology and human disease via genomics, gene therapy, and mouse knockout models; a revolution in drug design by combinatorial chemistry; an understanding of the specificity of nerve connections and cognition; and the basic logic of development will be solved (if it is not solved already). New technologies will be developed for studying the structure, function, and dynamics of multiprotein ensembles-for example, the eukaryotic transcription complexes. New methodologies will be developed for studying the behavior of single. live cells in isolation or in the context of an embryo. This includes studying the activity of the cell itself as well as various subcellular structures

Hal Weintrauh Fred Hutchinson Cancer Research Center Seattle, Washington

individuals at risk for diabetes, schizophrenia, obesity, and many other diseases. In many cases, disease will be either avoidable by modification of behavior or ameliorated

by therapeutic intervention. For societies with socialized health care programs, the economic cost of screening will need to be balanced by the overall savings in disease reduction. If individuals refuse preventive treatment, screening is not cost-effective. For societies with private health care systems, the rich will become healthier and the poor sicker. In both systems, balancing the rights of individuals against the needs of society is going to be difficult.

> Peter N. Goodfellow Department of Genetics University of Cambridge

BY USING TECHNIQUES INVOLVING IN VITRO fertilization, it is already possible to remove one cell from the developing embryo and toxins, sunlight, and so forth. The output is will be a color movie in which the embryo develops into a fetus, is born, and then grows into an adult, explicitly depicting body size and shape and hair, skin, and eye color. Eventually the DNA sequence base will be expanded to cover genes important for traits such as speech and musical ability; the mother will be able

> speak or sing. Harvey F. Lodish Whitehead Institute for Biomedical Research

to hear the embryo-as an adult-

Cambridge, Massachusetts THE OLD PHRASE "YOU can't get blood from a turnip" may be proven

incorrect, at least partially, Transgenic plants hold promise as biomanufacturing systems for a wide variety of human proteins, including those found in blood plasma. Serum albumin, for instance, has been shown to be expressed and processed correctly when the gene encoding it was introduced into plants. The missing element in this scenario is process technology, which will make it possible to do large-scale protein purification from plant tissues. Advances in high-level protein expression in specialized plant tissues (such as seeds, fruits, or tubers) coupled to engineering improvements in protein isolation may make this technology feasible in the coming decade.

Charles J. Arntzen Institute of Biosciences and Technology

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  - Disagreements between central and local leaders

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