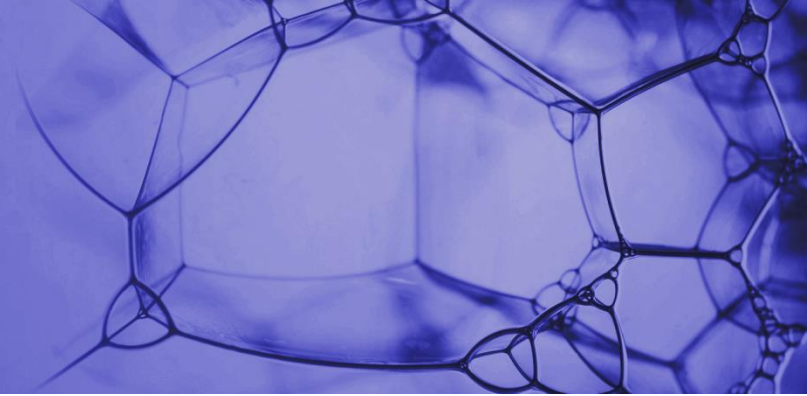


**LOSCHMIDT
LABORATORIES**



Microfluidics – „Lab on a Chip“

- ❑ introduction to microfluidics
- ❑ physics of micro-scale
- ❑ lab on a chip applications
 - life and medical science
 - **protein and metabolic engineering**
- ❑ design and fabrication
- ❑ sensing and detection

Lab on a Chip Concept

incubation



pre-treatment



analysis



preparation

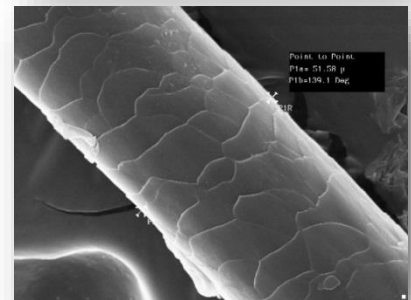
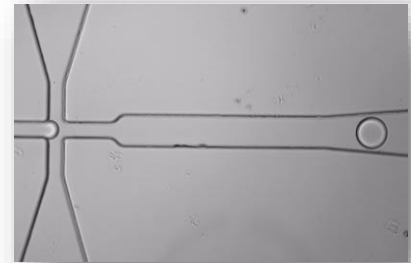
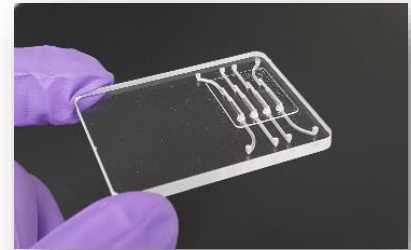


collection



□ „behavior, control and manipulation of fluids geometrically constrained to a small dimensions“

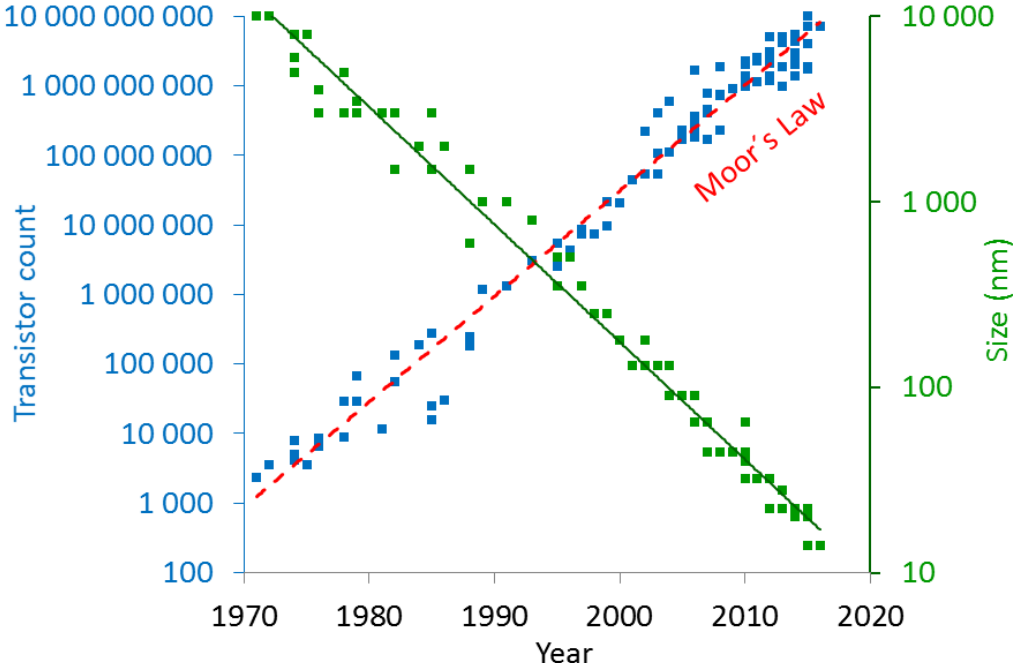
- dimensions (1'-100' μm)
- volumes (nL, pL, fL)
- unrivalled precision of control
- (ultra)high analytical throughput
- reduced sample and power consumption
- facile process integration and automation



Revolution in Electronics

	Size (nm)	Price (USD)
--	-----------	-------------

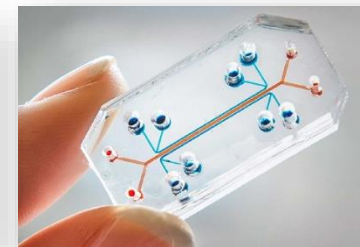
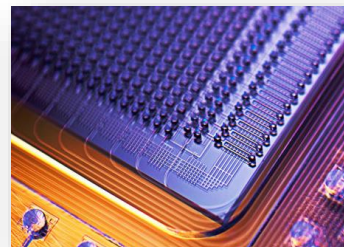
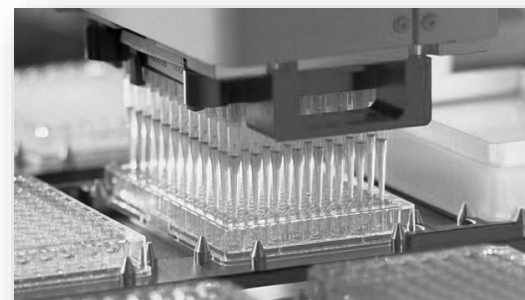
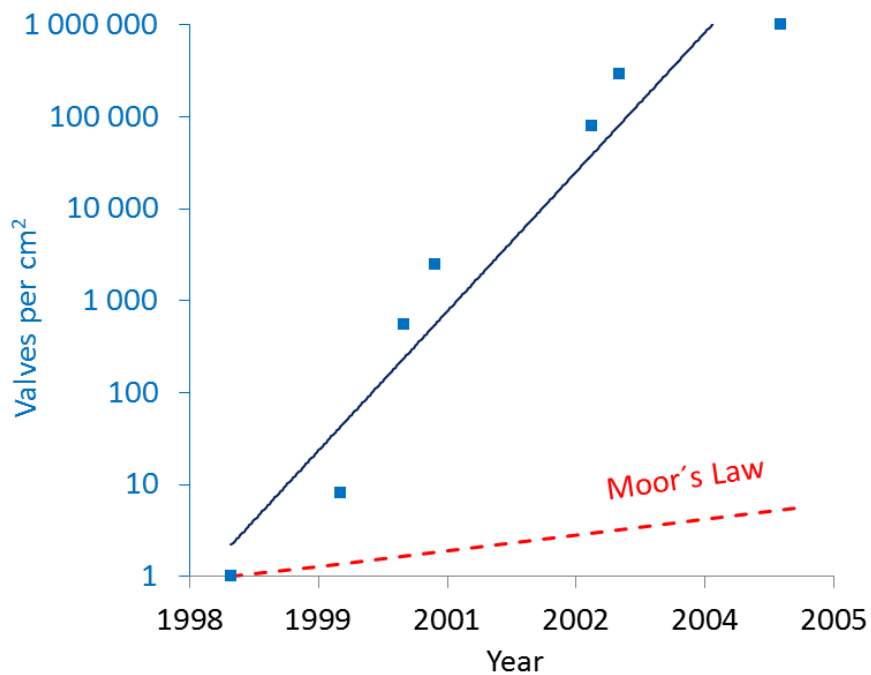
Vacuum tube	100	10
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Revolution in Science?

Volume (μL) Throughput (assays/day)

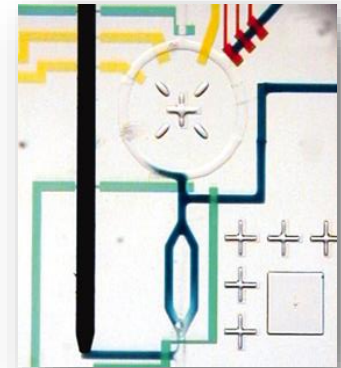
Test tube 1 000 10



Concepts in microfluidics

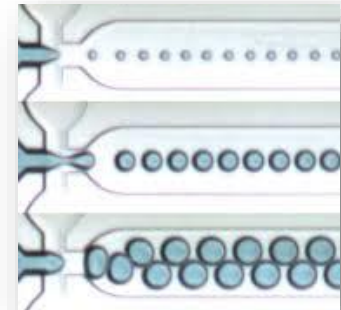
- ❑ **continuous-flow microfluidics**

manipulation of continuous liquid flow
through micro-fabricated channels



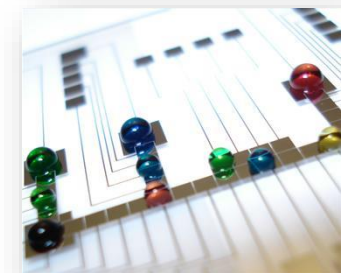
- ❑ **droplet-based microfluidics**

manipulating discrete volumes of fluids
in immiscible phases



- ❑ **digital microfluidics**

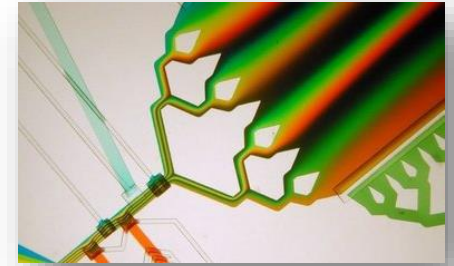
droplets manipulated on a substrate
using electro-wetting



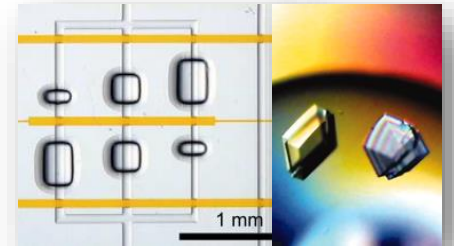
Novel Physics of Micro-Scale

□ viscosity, surface tension and capillary forces dominate

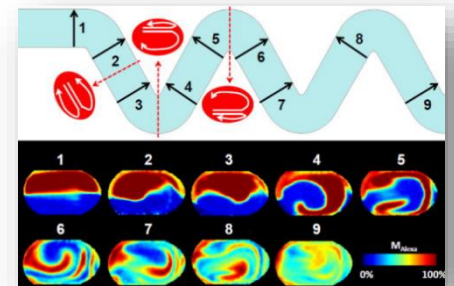
▪ lack of turbulent phenomena



▪ absence of density-driven convection

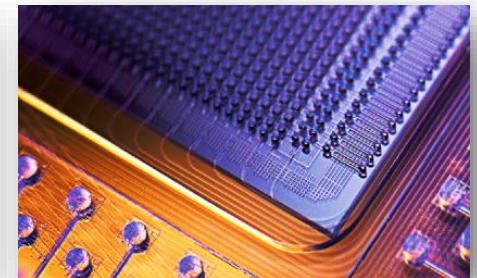
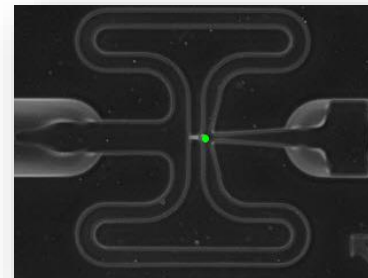
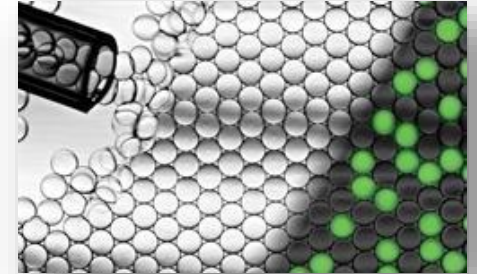
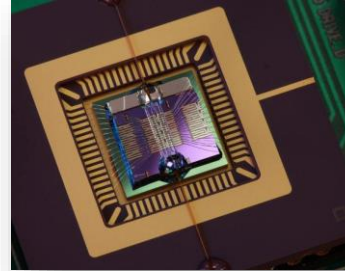


▪ strong shearing forces



Lab on a Chip applications

- ❑ analytics and chemistry
- ❑ PCR and sequencing
- ❑ point of care diagnostics
- ❑ pharmacology
- ❑ clinical studies
- ❑ single cell biology
- ❑ protein science



Polymerase chain reaction

❑ classical PCR

- slow heating/cooling cycles
- PCR tubes (strips), 96-well MTP
- volume 50 to 500 μL



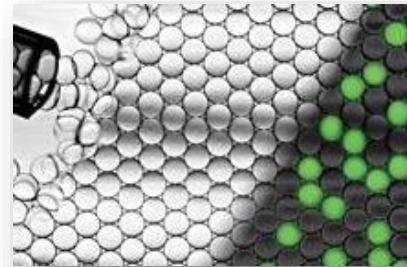
Kary Mullis

Nobel Prize in 1993

Digital polymerase chain reaction

□ digital PCR

- 1 nanoliter droplets
- 20 000 droplets per run



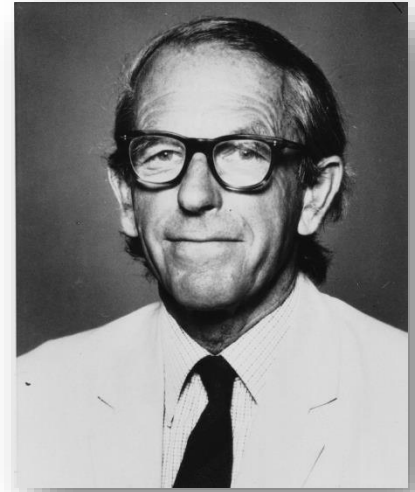
Next-generation sequencing

- parallelization of single molecule pyrosequencing

- 454 Pyrosequencing (Roche)

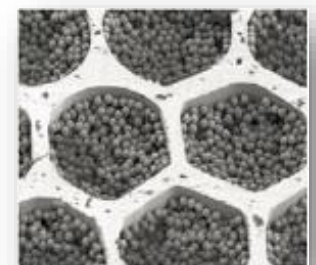
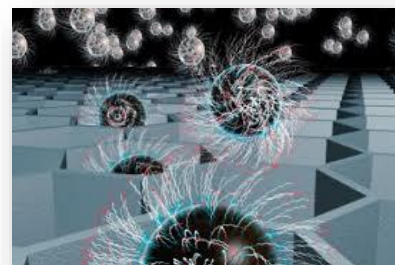
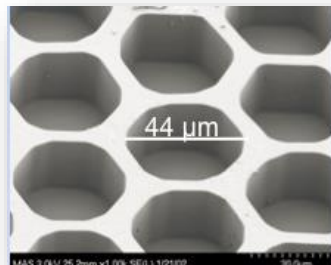
water in oil droplets 1 picoliter (10^{-12} liters)

1 mil. reads/run

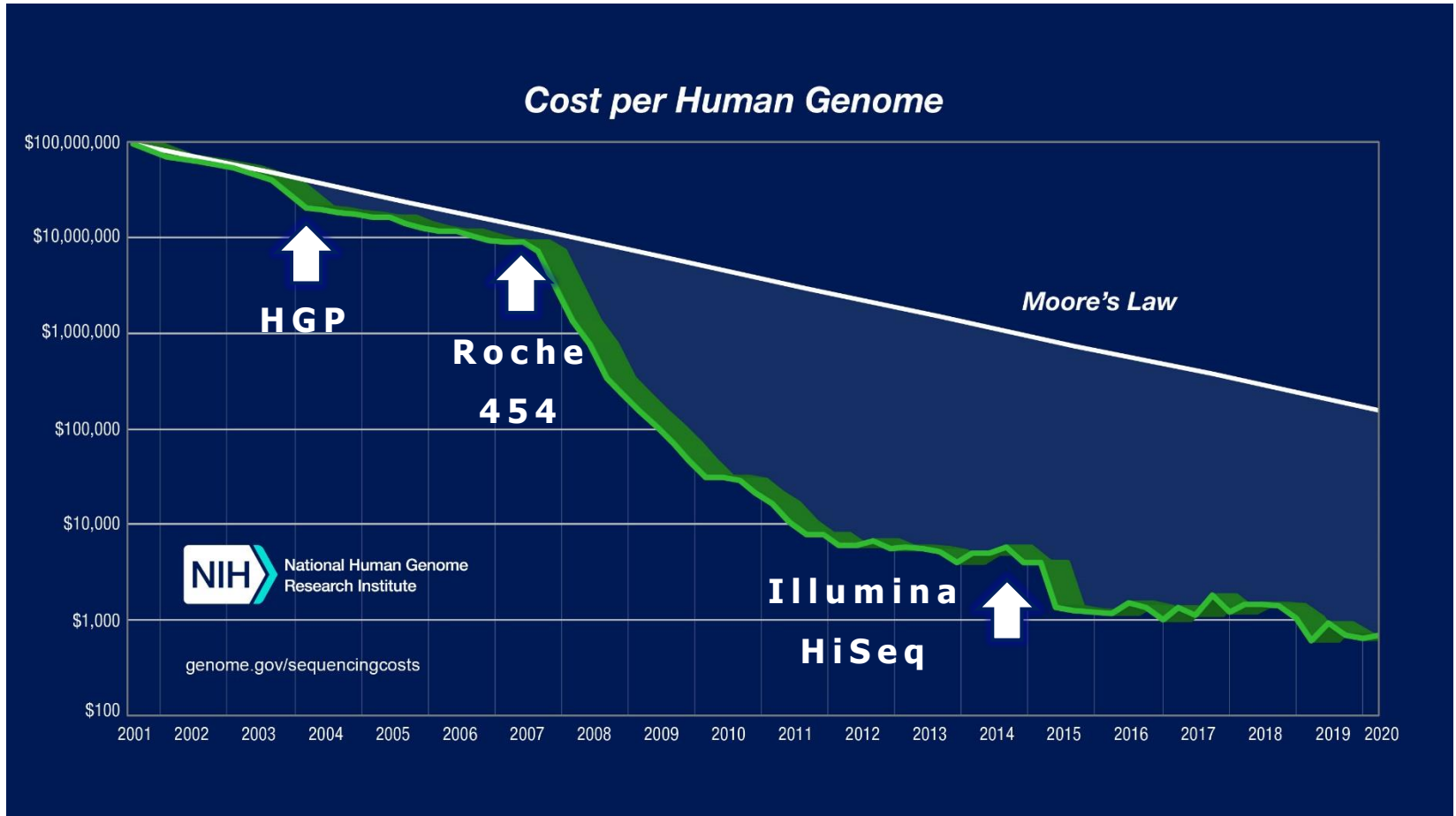


Frederick Sanger

Nobel Prize in 1980



Revolution in Science?

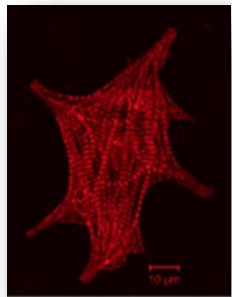


- ❑ 2003: 13 years, 3 billion USD
- ❑ 2018: days, < 1,000 USD

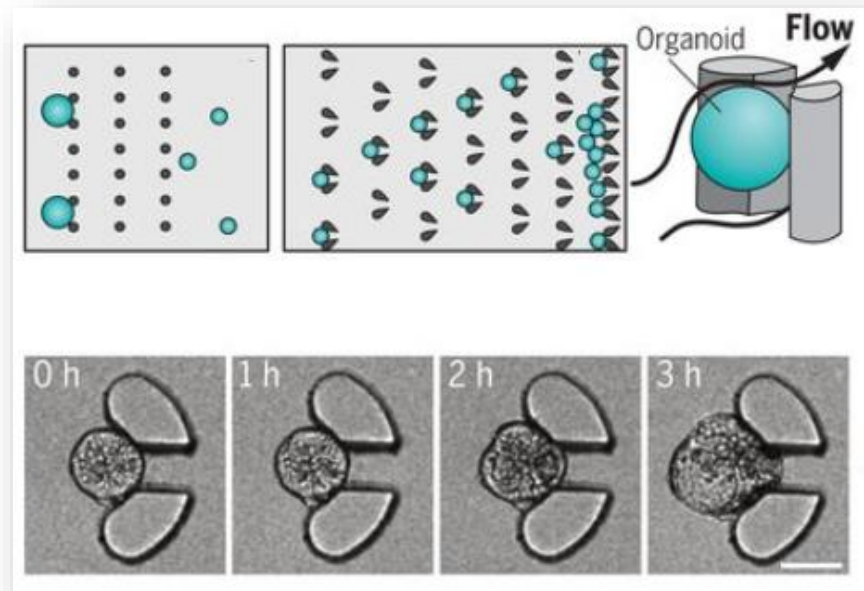
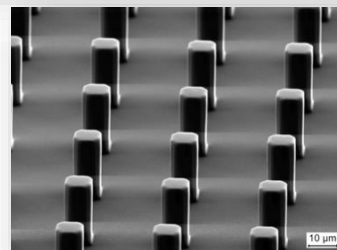
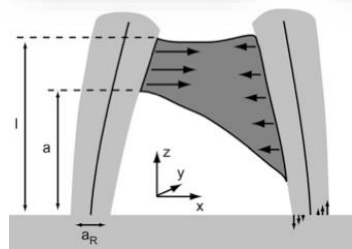
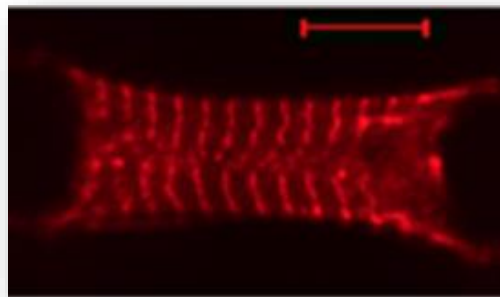
Organ(oid)s on chip

- ❑ 3D chips **mimicking human's physiological responses** (e.g., pathological, pharmacokinetic, toxicological)
- ❑ realistic *in vitro* model **closer to *in vivo* cell environment** (e.g., mechanical strain, patterning, fluid shear stresses)
- ❑ **replacing** expensive and controversial **animal testing**

flat surface



micropillar

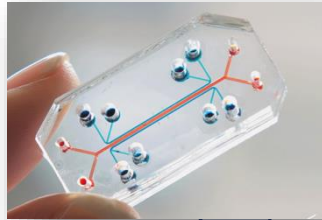


Organs on chip

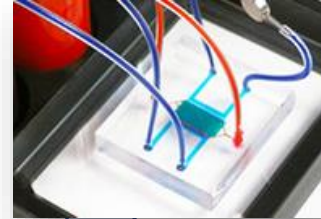


Organs on chip

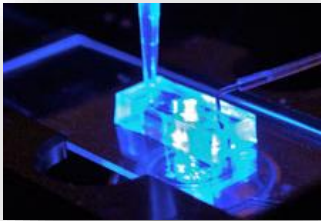
Lung



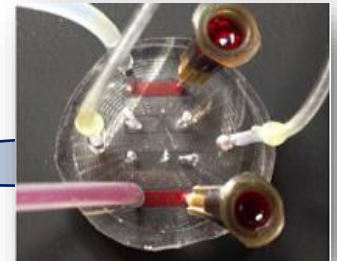
Neurovascular



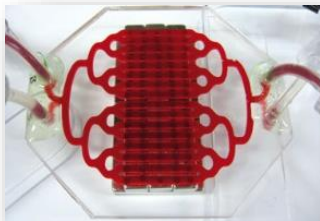
Heart



Artery



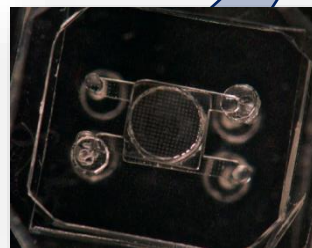
Spleen



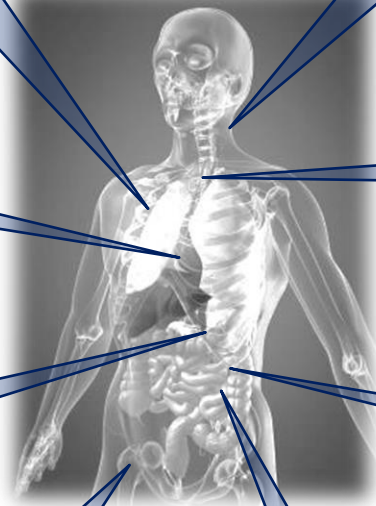
Kidney



Bone



Intestine



RATIONAL DESIGN

1. Computer aided design



2. Site-directed mutagenesis



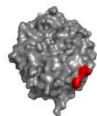
Individual mutated gene

3. Transformation

4. Protein expression

5. Protein purification

6. *not applied*



Constructed mutant enzyme

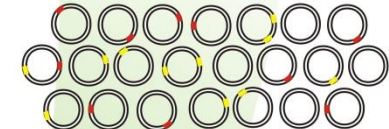
7. Biochemical testing

IMPROVED ENZYME

DIRECTED EVOLUTION

1. *not applied*

2. Random mutagenesis



Library of mutated genes
(>10,000 clones)

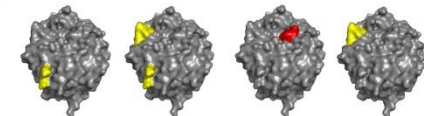
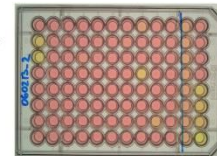
3. Transformation

4. Protein expression

5. *not applied*

6. Screening and selection

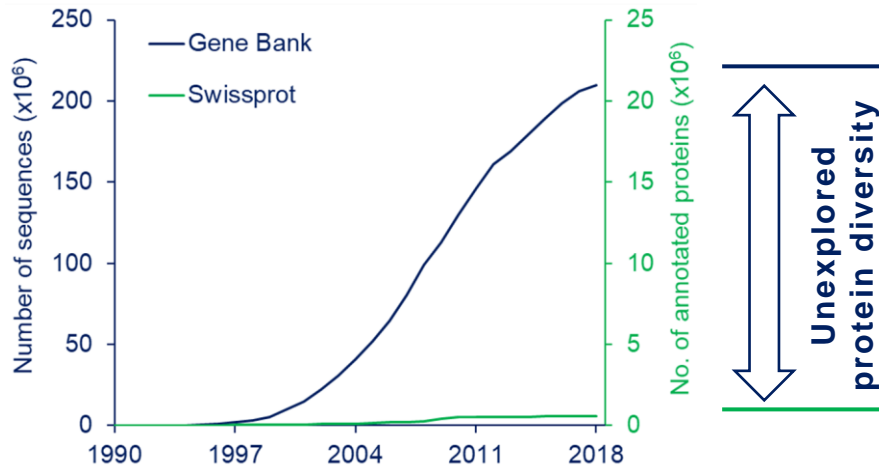
- stability
- selectivity
- affinity
- activity



Selected mutant enzymes

Sequence diversity

Genomic databases

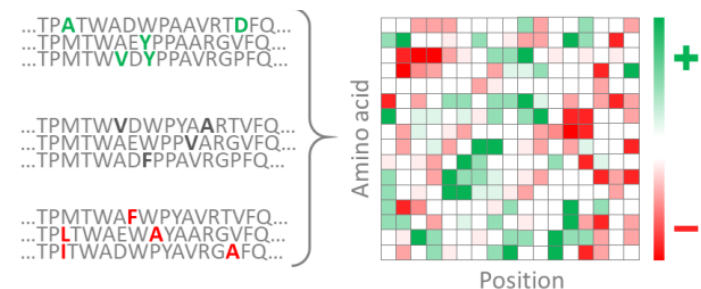


1-MDQSSRYVNLALKEEDLIAGGEHVLCAYIMKPKAGYGYVATAAHFAAESS-50
 51-TGTNVEVCTTDDFTRGV^VDALVYEVDEAR^ELTKIAYPVALFDRN^ITDGK^AM-100
 101-IAS^FLTLTMGNNQGMGDVEYAK^MHDFYVPEAYRALFDG^SVNISALWKVL-150
 151-GRPEVDGGLVVG^TI^IKPKLGLRPKPF^AEACH^HAFWLGGDFIKNDEPQGNQP-200
 201-FAPLRD^TI^AL^VADAMRRAQDETGEAKLFSANITADDPFEI^IARGEYVLET-250
 251-FGENASHVALLVDGYVAGA^AA^ITTARRRFPDNFLHYHRAGHGAVT^SPQSK-300
 301-RGYTAFVHCK^MAR^LQ^GASGIHTGTMGFGKMEGES^SDRAIAYMLTQ^DE^AQG-350
 351-PFYRQSWGGMK^ACTPIISGGMNAL^RM^PG^GFFENLGNANVILTAGGGAFGHI-400
 401-DGPVAGARSLRQAWQAWRDGVP^VL^DYAREHKELARAFESFPGDAD^QI^IYPG-450
 451-WRKALGV^EDT^RSALPA-466

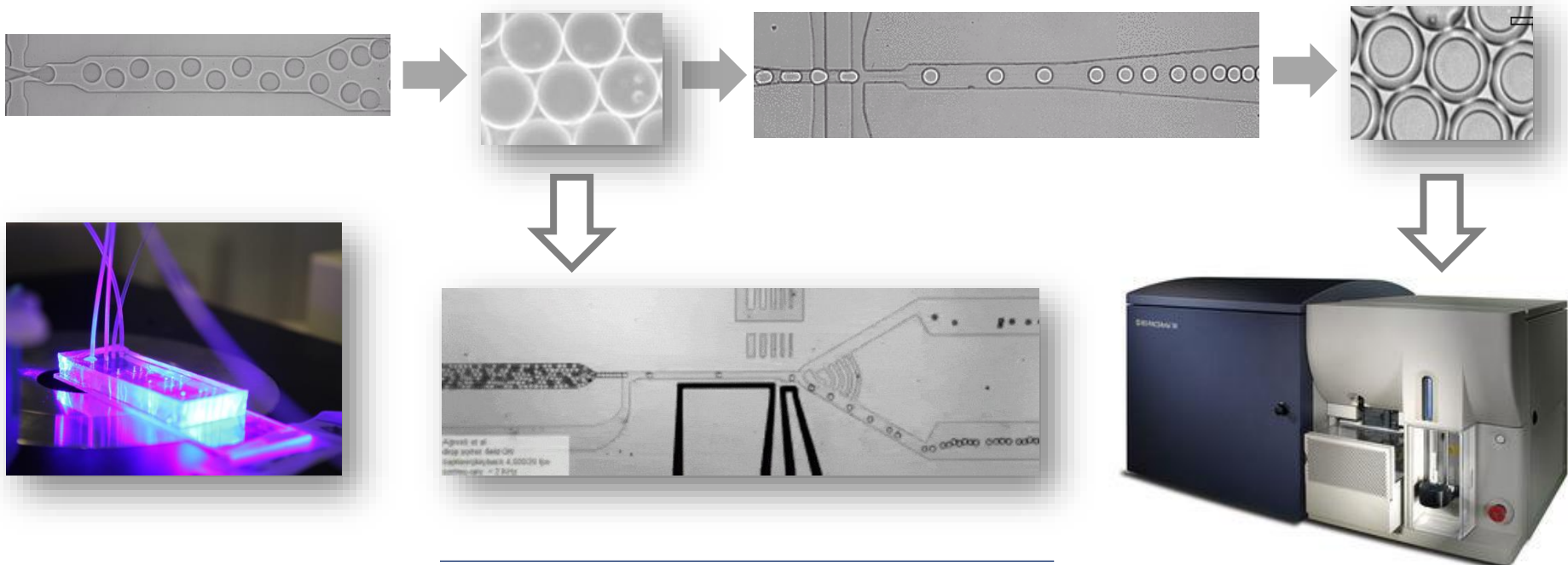
Directed evolution

No.	Coverage (95%)
1	94
2	3 066
3	98 163
4	3 141 251
5	100 520 093

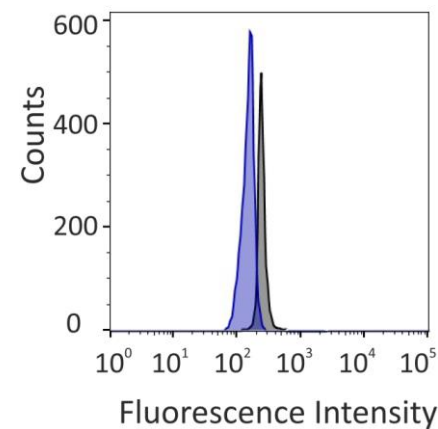
Sequence-function relationship



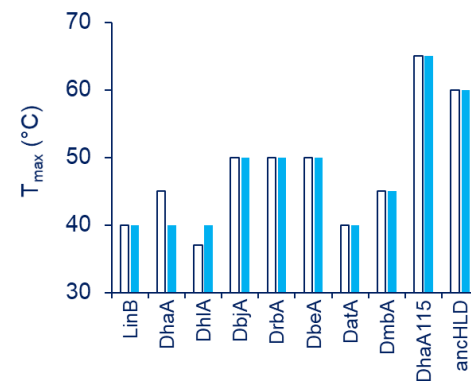
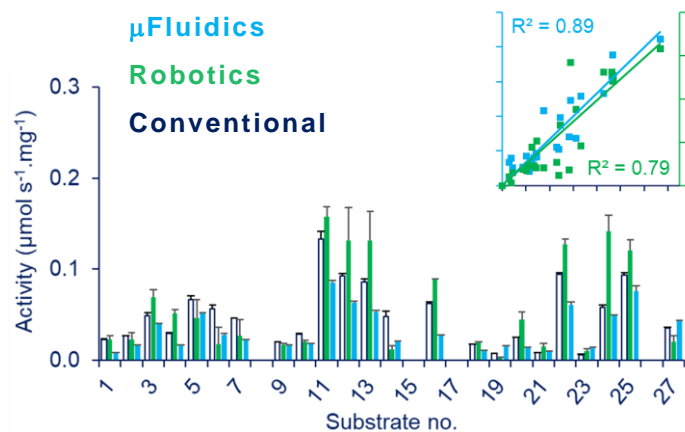
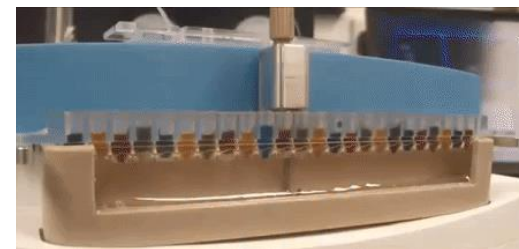
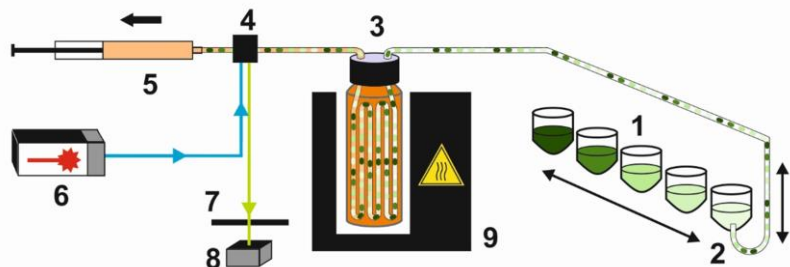
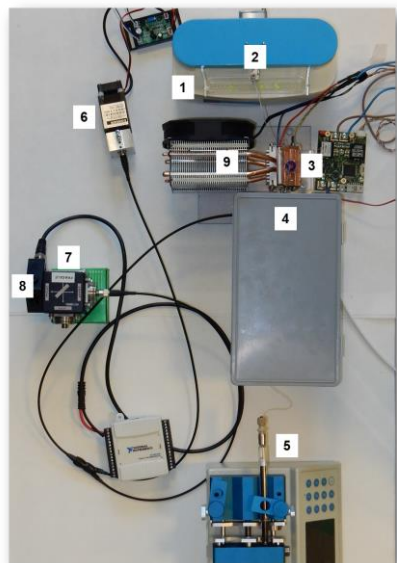
(Ultra)High-throughput screening



	Robotic	μ Fluidic
Reaction volume	100 μ L	5 pL
Reactions / day	50 000	$1 \cdot 10^8$
Total time	5 years	3 days
Total volume	5 000 L	150 mL
No. of plates / devices	250 000	2.0
No. of tips	28 000 000	10

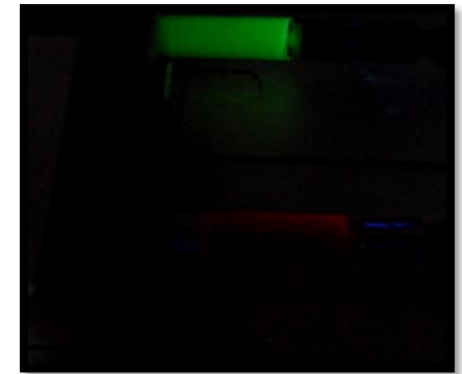
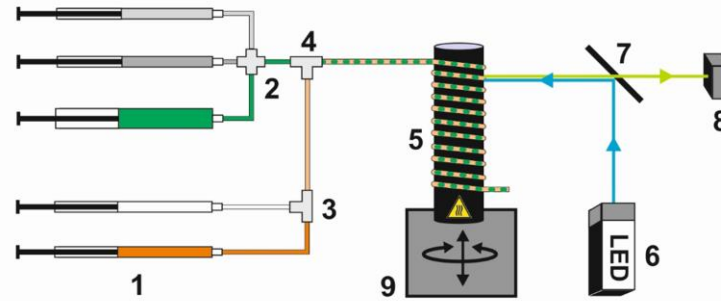
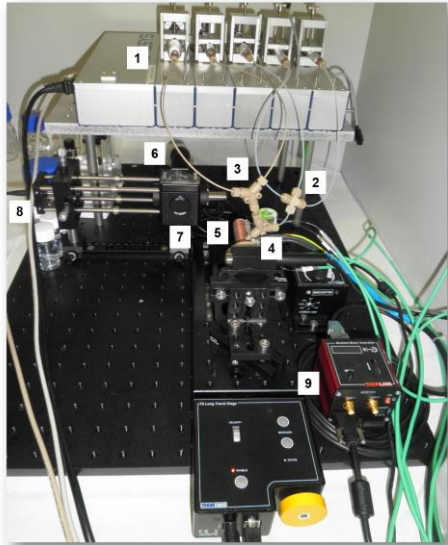


Enzyme specificity profiling

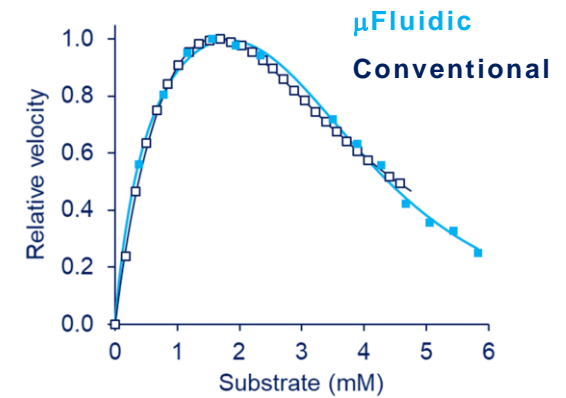
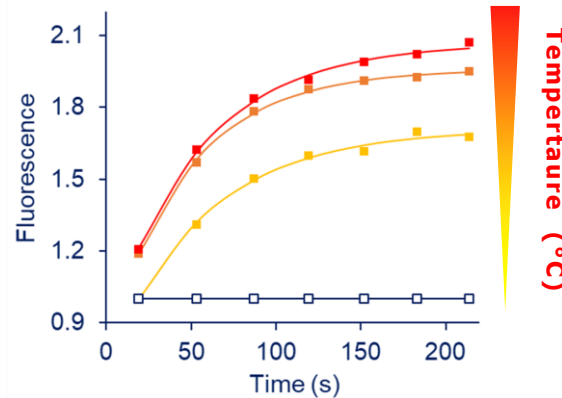
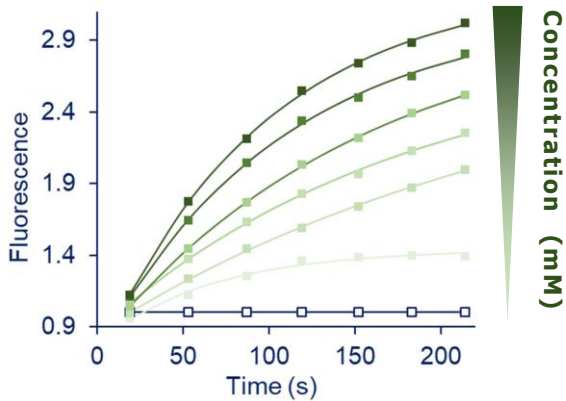


	Conventional	Robotic	μFluidic
Reaction volume (mL)	10	1	0.00015
Total enzyme (mg)	540	54	0.5
Total time (days)	100	30	5

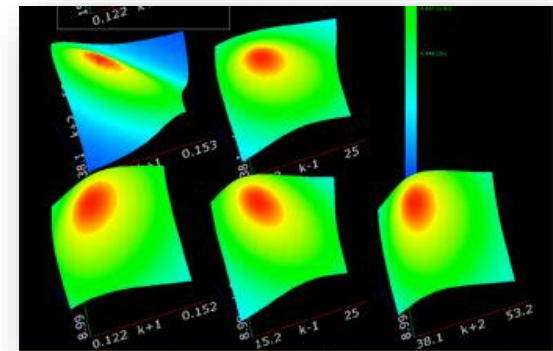
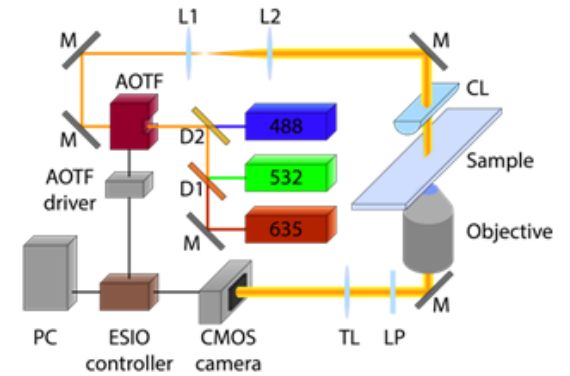
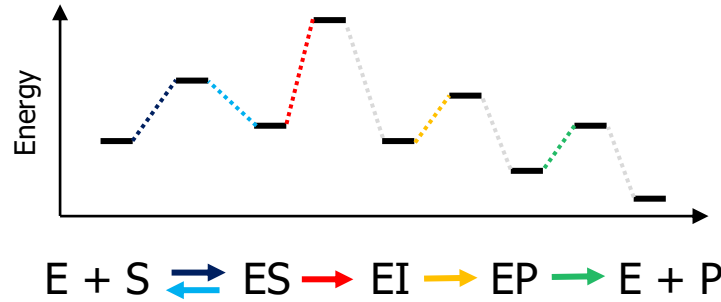
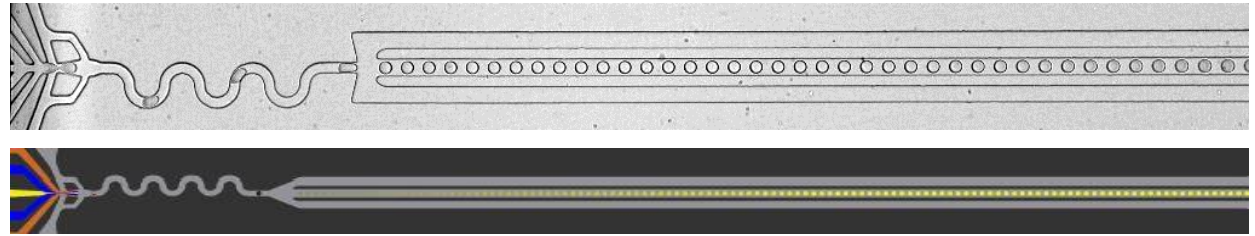
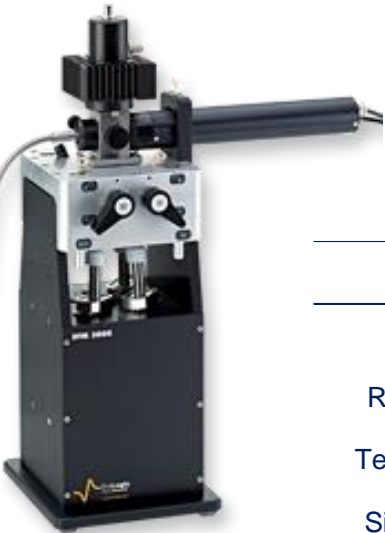
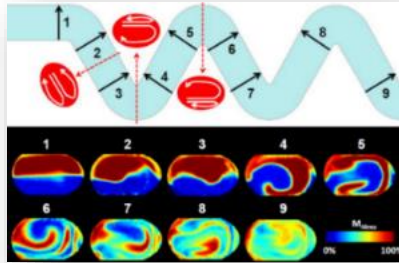
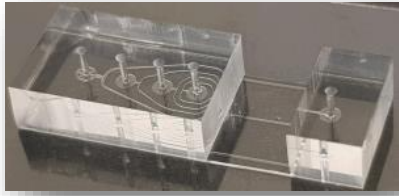
Steady-state kinetics



	Conventional	μ Fluidic
Reaction volume (mL)	2	0.00010
Total enzyme (mg)	1	0.01
Throughput per hour	5	10 000

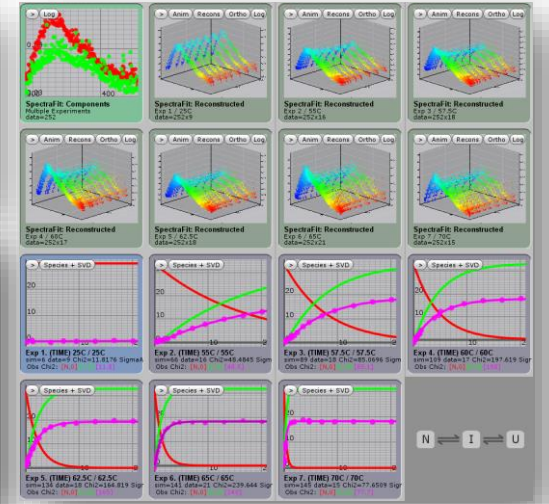
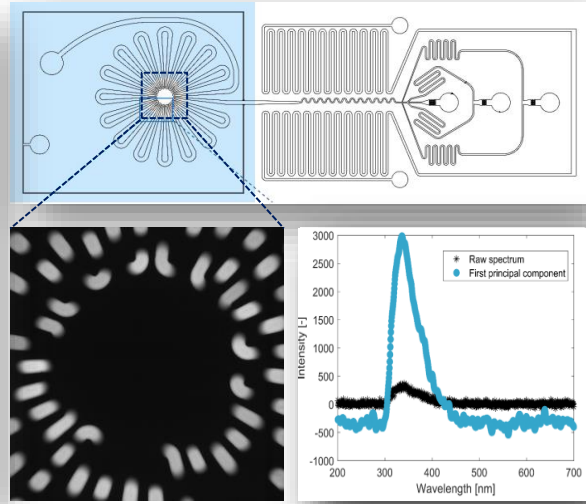


Mechanism of enzyme catalysis

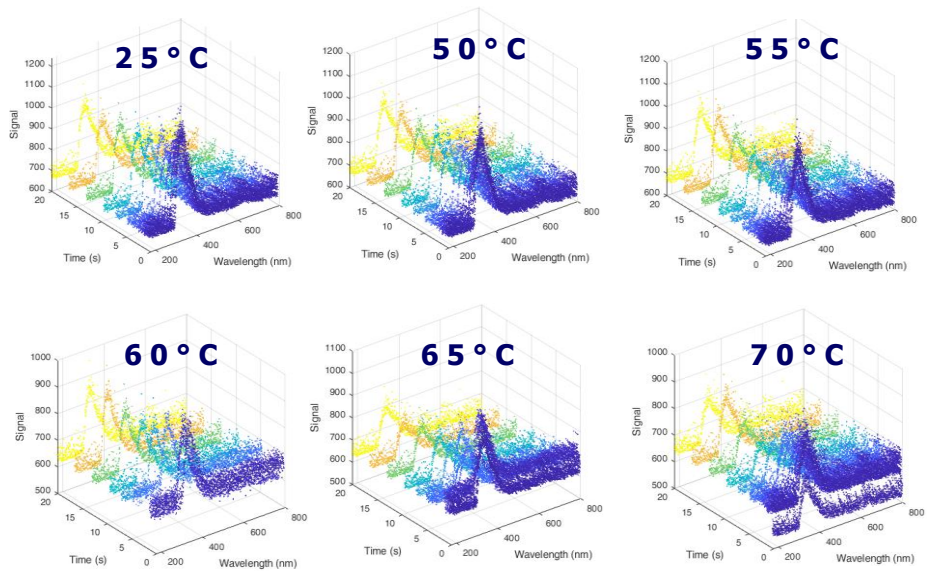


	Stopped-flow	μ Fluidic
Dead time	0.3 ms	0.7 ms
Reaction volume	100 μ L	10 pL
Temp. equilibration	10 min	50 ms
Signal integration	0.5 ms	no limit

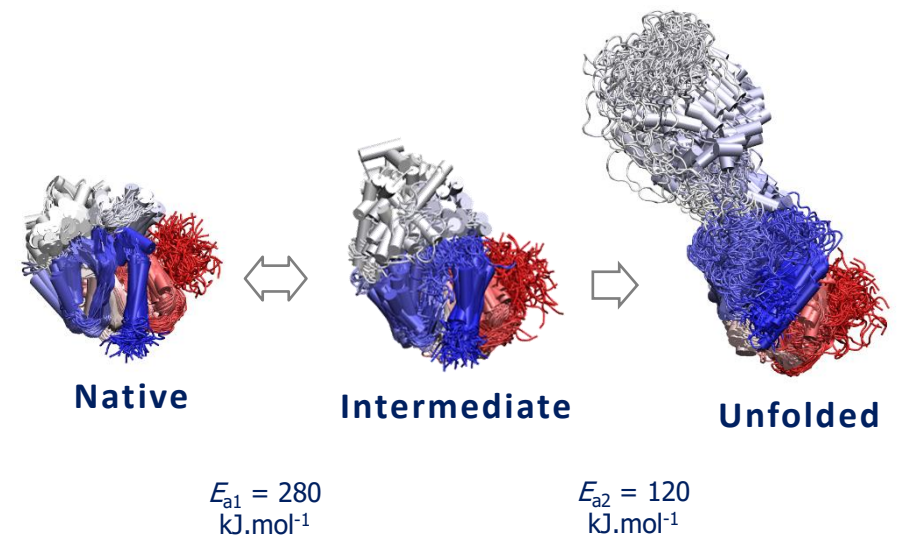
Mechanism of protein unfolding



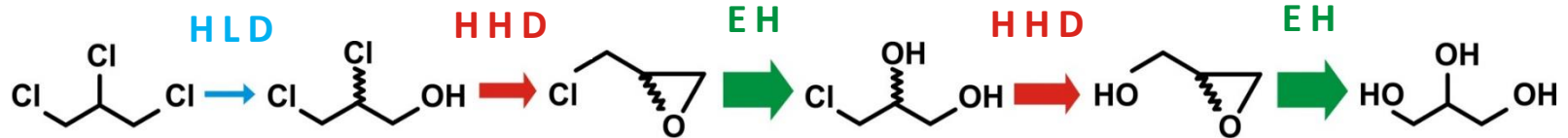
3M raw data points, 30 000 after PCA



Thermodynamic understanding

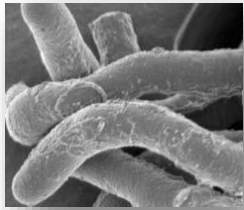


Metabolic engineering



Rhodococcus

Agrobacterium



$$\frac{dc_{\text{TCP}}}{dt} = -\frac{k_{\text{cat,TCP,(R)-DCP}} \times c_{\text{DhaA}} \times c_{\text{TCP}}}{(c_{\text{TCP}} + K_{\text{m,TCP}})} - \frac{k_{\text{cat,TCP,(S)-DCP}} \times c_{\text{DhaA}} \times c_{\text{TCP}}}{(c_{\text{TCP}} + K_{\text{m,TCP}})}$$

$$\frac{dc_{\text{(R)-DCP}}}{dt} = \frac{k_{\text{cat,TCP,(R)-DCP}} \times c_{\text{DhaA}} \times c_{\text{TCP}}}{c_{\text{TCP}} + K_{\text{m,TCP}}} - \frac{k_{\text{cat,(R)-DCP}} \times c_{\text{HheC}} \times c_{\text{(R)-DCP}}}{c_{\text{(R)-DCP}} + K_{\text{m,(R)-DCP}}}$$

$$\frac{dc_{\text{(S)-DCP}}}{dt} = \frac{k_{\text{cat,TCP,(S)-DCP}} \times c_{\text{DhaA}} \times c_{\text{TCP}}}{c_{\text{TCP}} + K_{\text{m,TCP}}} - \frac{k_{\text{cat,(S)-DCP}} \times c_{\text{HheC}} \times c_{\text{(S)-DCP}}}{c_{\text{(S)-DCP}} + K_{\text{m,(S)-DCP}}}$$

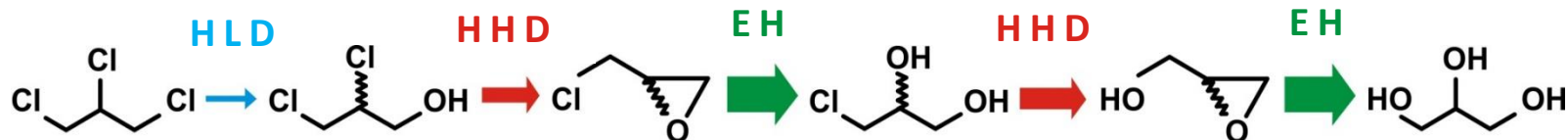
$$\frac{dc_{\text{ECH}}}{dt} = \frac{k_{\text{cat,(R)-DCP}} \times c_{\text{HheC}} \times c_{\text{(R)-DCP}}}{c_{\text{(R)-DCP}} + K_{\text{m,(R)-DCP}}} + \frac{k_{\text{cat,(S)-DCP}} \times c_{\text{HheC}} \times c_{\text{(S)-DCP}}}{c_{\text{(S)-DCP}} + K_{\text{m,(S)-DCP}}} - \frac{k_{\text{cat,ECH}} \times c_{\text{EchA}} \times c_{\text{ECH}}}{c_{\text{ECH}} + K_{\text{m,ECH}}}$$

$$\frac{dc_{\text{CPD}}}{dt} = \frac{k_{\text{cat,ECH}} \times c_{\text{EchA}} \times c_{\text{ECH}}}{c_{\text{ECH}} + K_{\text{m,ECH}}} - \frac{k_{\text{cat,CPD}} \times c_{\text{HheC}} \times c_{\text{CPD}}}{c_{\text{CPD}} + K_{\text{m,CPD}}}$$

$$\frac{dc_{\text{GDL}}}{dt} = \frac{k_{\text{cat,CPD}} \times c_{\text{HheC}} \times c_{\text{CPD}}}{c_{\text{CPD}} + K_{\text{m,CPD}}} - \frac{k_{\text{cat,GDL}} \times c_{\text{EchA}} \times c_{\text{GDL}}}{c_{\text{GDL}} + K_{\text{m,GDL}} \times \left(1 + \frac{c_{\text{GLY}}}{K_i} + \frac{c_{\text{TCP}}}{K_c}\right)}$$

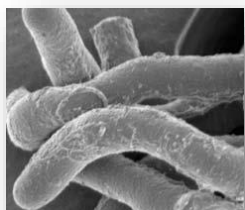
$$\frac{dc_{\text{GLY}}}{dt} = \frac{k_{\text{cat,GDL}} \times c_{\text{EchA}} \times c_{\text{GDL}}}{c_{\text{GDL}} + K_{\text{m,GDL}} \times \left(1 + \frac{c_{\text{GLY}}}{K_i} + \frac{c_{\text{TCP}}}{K_c}\right)}$$

Metabolic engineering

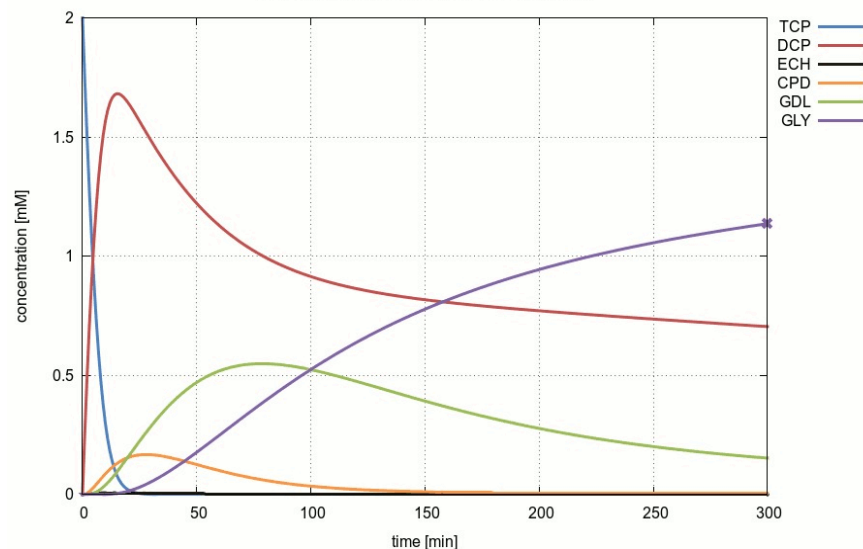


Rhodococcus

Agrobacterium



Conversion: 56.83%, ratio: 0.90 : 0.07 : 0.03



$$\frac{dc_{\text{TCP}}}{dt} = -\frac{k_{\text{cat,TCP,(R)-DCP}} \times c_{\text{DhaA}} \times c_{\text{TCP}}}{(c_{\text{TCP}} + K_{\text{m,TCP}})} - \frac{k_{\text{cat,TCP,(S)-DCP}} \times c_{\text{DhaA}} \times c_{\text{TCP}}}{(c_{\text{TCP}} + K_{\text{m,TCP}})}$$

$$\frac{dc_{\text{(R)-DCP}}}{dt} = \frac{k_{\text{cat,TCP,(R)-DCP}} \times c_{\text{DhaA}} \times c_{\text{TCP}}}{c_{\text{TCP}} + K_{\text{m,TCP}}} - \frac{k_{\text{cat,(R)-DCP}} \times c_{\text{HheC}} \times c_{\text{(R)-DCP}}}{c_{\text{(R)-DCP}} + K_{\text{m,(R)-DCP}}}$$

$$\frac{dc_{\text{(S)-DCP}}}{dt} = \frac{k_{\text{cat,TCP,(S)-DCP}} \times c_{\text{DhaA}} \times c_{\text{TCP}}}{c_{\text{TCP}} + K_{\text{m,TCP}}} - \frac{k_{\text{cat,(S)-DCP}} \times c_{\text{HheC}} \times c_{\text{(S)-DCP}}}{c_{\text{(S)-DCP}} + K_{\text{m,(S)-DCP}}}$$

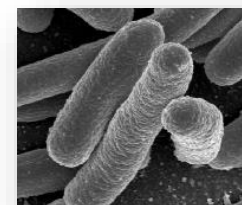
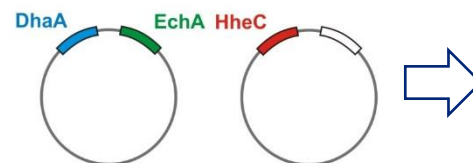
$$\frac{dc_{\text{ECH}}}{dt} = \frac{k_{\text{cat,(R)-DCP}} \times c_{\text{HheC}} \times c_{\text{(R)-DCP}}}{c_{\text{(R)-DCP}} + K_{\text{m,(R)-DCP}}} + \frac{k_{\text{cat,(S)-DCP}} \times c_{\text{HheC}} \times c_{\text{(S)-DCP}}}{c_{\text{(S)-DCP}} + K_{\text{m,(S)-DCP}}} - \frac{k_{\text{cat,ECH}} \times c_{\text{EchA}} \times c_{\text{ECH}}}{c_{\text{ECH}} + K_{\text{m,ECH}}}$$

$$\frac{dc_{\text{CPD}}}{dt} = \frac{k_{\text{cat,ECH}} \times c_{\text{EchA}} \times c_{\text{ECH}}}{c_{\text{ECH}} + K_{\text{m,ECH}}} - \frac{k_{\text{cat,CPD}} \times c_{\text{HheC}} \times c_{\text{CPD}}}{c_{\text{CPD}} + K_{\text{m,CPD}}}$$

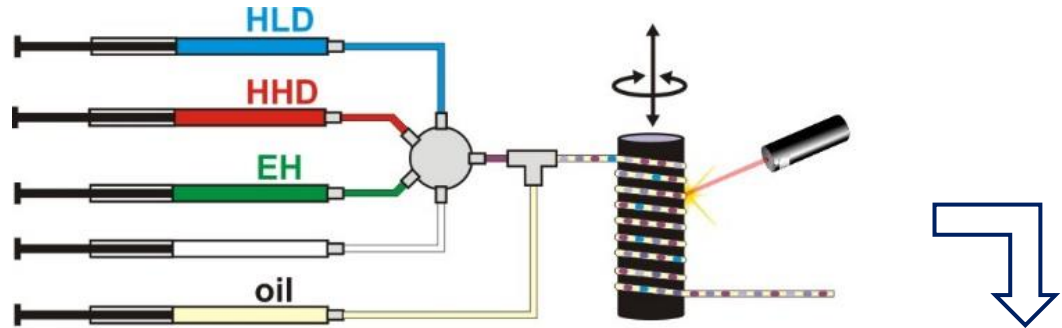
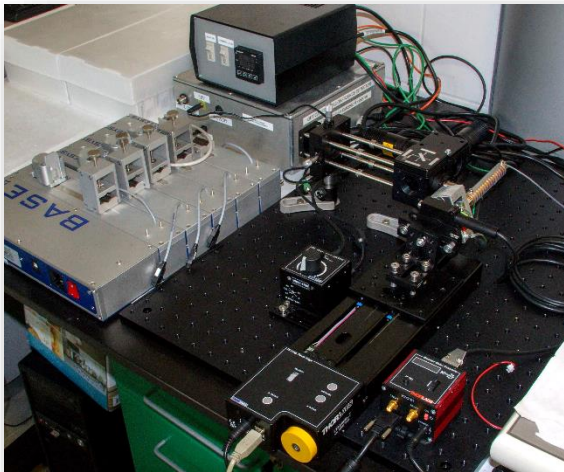
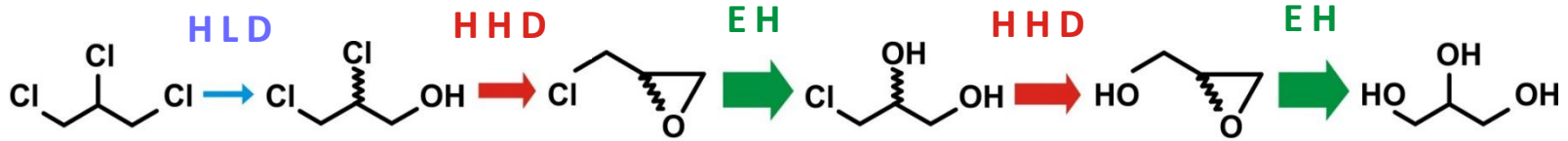
$$\frac{dc_{\text{GDL}}}{dt} = \frac{k_{\text{cat,CPD}} \times c_{\text{HheC}} \times c_{\text{CPD}}}{c_{\text{CPD}} + K_{\text{m,CPD}}} - \frac{k_{\text{cat,GDL}} \times c_{\text{EchA}} \times c_{\text{GDL}}}{c_{\text{GDL}} + K_{\text{m,GDL}} \times \left(1 + \frac{c_{\text{GLY}}}{K_i} + \frac{c_{\text{TCP}}}{K_c}\right)}$$

$$\frac{dc_{\text{GLY}}}{dt} = \frac{k_{\text{cat,GDL}} \times c_{\text{EchA}} \times c_{\text{GDL}}}{c_{\text{GDL}} + K_{\text{m,GDL}} \times \left(1 + \frac{c_{\text{GLY}}}{K_i} + \frac{c_{\text{TCP}}}{K_c}\right)}$$

Escherichia

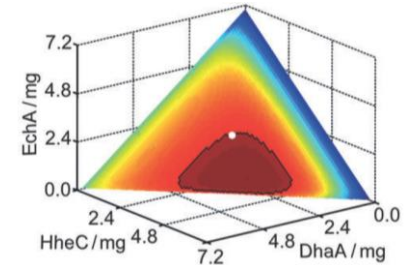
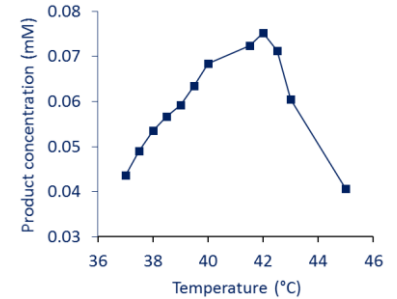


Metabolic engineering



Artificial Intelligence

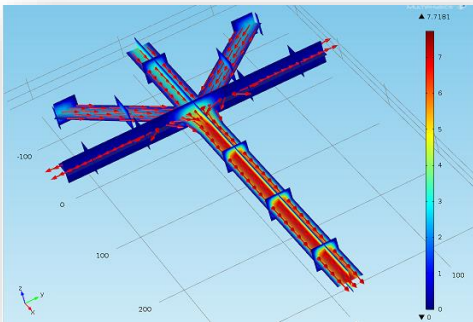
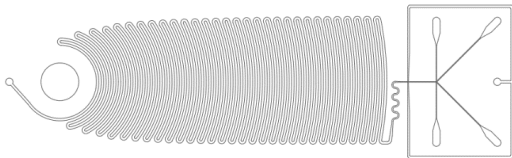
- ❑ 1 nL droplet volume
- ❑ 10 000 assays/hour



Design and fabrication

- **soft lithography** originates from semiconductor industry

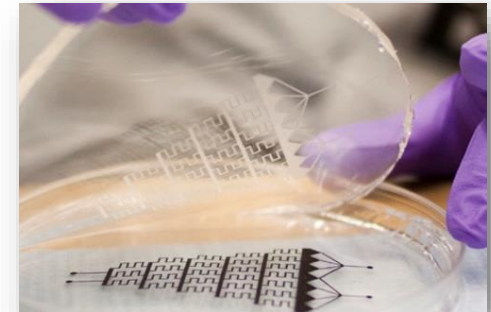
DESIGN / MODELING



MASK / MOLD

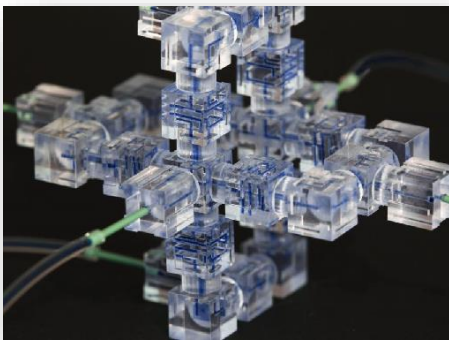
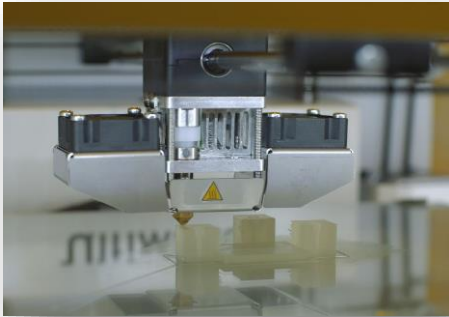


CASTING / BONDING

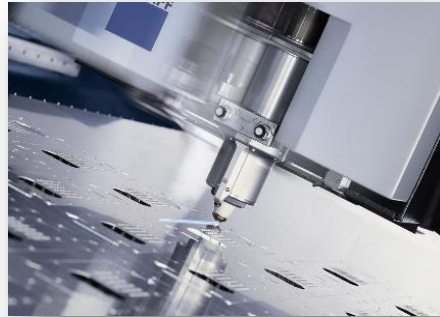


□ direct fabrication methods

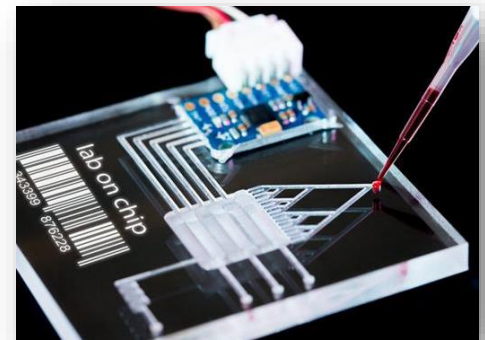
3D PRINTING



LASER CUTTING



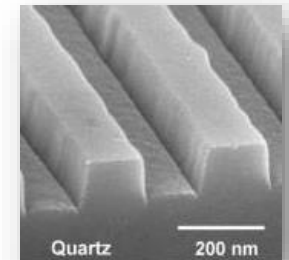
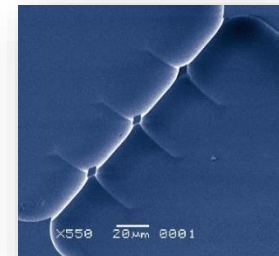
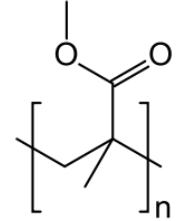
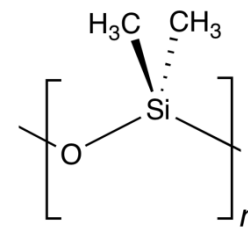
CNC μ -MILLING



Design and fabrication

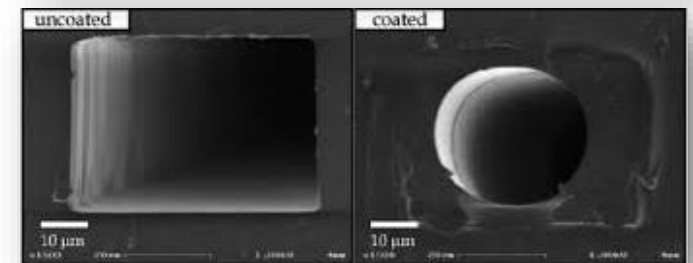
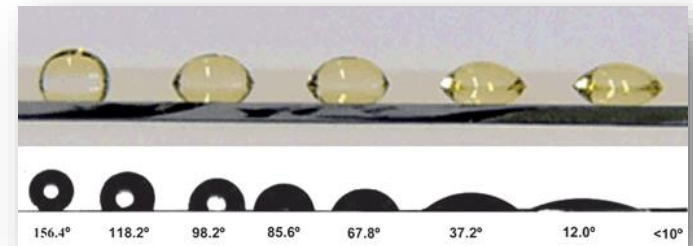
□ materials

- inert and transparent
- PDMS - poly(dimethyl siloxane)
- PMMA - poly(methyl methacrylate)
- fused silica, quartz and glass



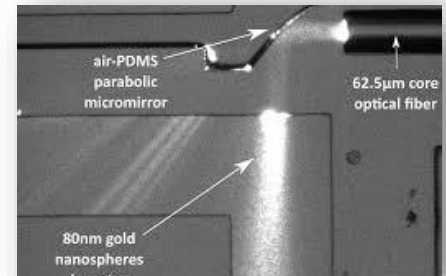
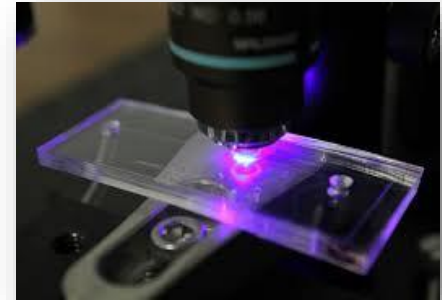
□ surface modification

- plasma treatment
- silanization
- sol-gel coating

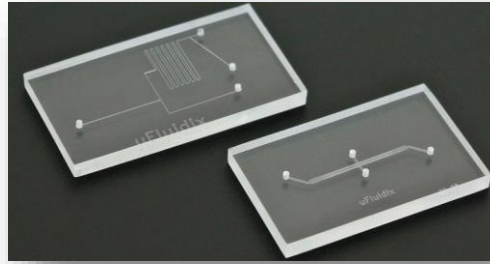
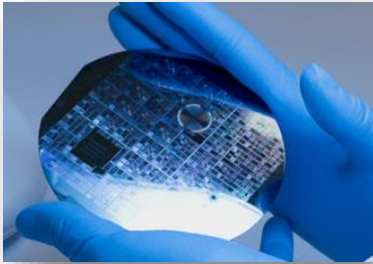


Sensing and detection

- ❑ processing of **small reagent volumes**
- ❑ **analytical timescale** and performance
- ❑ **on chip detection**
 - fluorescence (LSM, FCS, FLIM)
 - UV/VIS absorbance
 - IR spectroscopy
 - Raman scattering
 - (chemo/electro) luminescence
 - thermal conductivity
 - RI variation
- ❑ **off chip detection**
 - GC, HPLC, MS
 - NMR, X-ray



- ❑ customized design and fabrication



- ❑ entire technologies



Conclusions

- ❑ reduced sample/reagent/power consumption
- ❑ superior performance and novel physics
- ❑ applications in life and medical sciences
- ❑ in-house as well as commercial technologies

microfluidics revolutionize science

Questions



- ❑ Mazurenko, S., 2020: **Machine Learning in Enzyme Engineering**. *ACS Catalysis*, 10, 1210–1223
- ❑ 3. DATABASES RELEVANT TO ENZYME ENGINEERING
3.3. *Emerging Methods for High-Throughput Data Collection*
(page 1213 - 1216)



✓ Cite This: *ACS Catal.* 2020, 10, 1210–1223

Perspective

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Machine Learning in Enzyme Engineering

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