



The University of  
**Nottingham**

# Automated probe microscopy via evolutionary optimization at the atomic scale



9<sup>th</sup> Annual HUMIES Awards

**Richard Woolley**

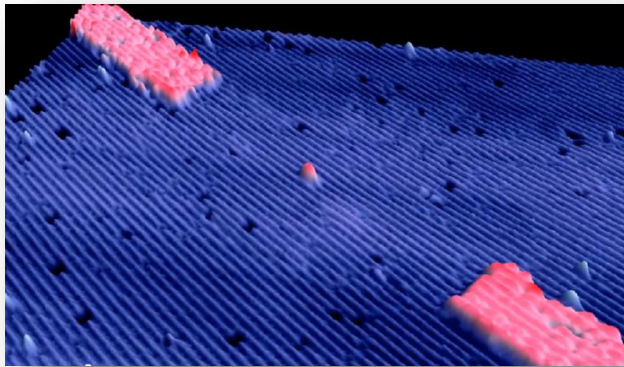
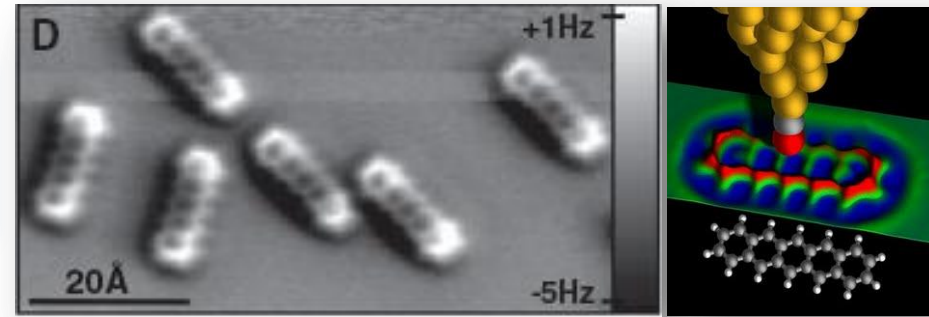
[richard.woolley@nottingham.ac.uk](mailto:richard.woolley@nottingham.ac.uk)

Julian Stirling, Adrian Radocea, Prof. Philip Moriarty, Prof. Natalio Krasnogor

# The Power of Scanning Probe Microscopy

Imaging individual molecules and resolving sub molecular structure

Gross *et al.* Science 325, 1110 (2009)

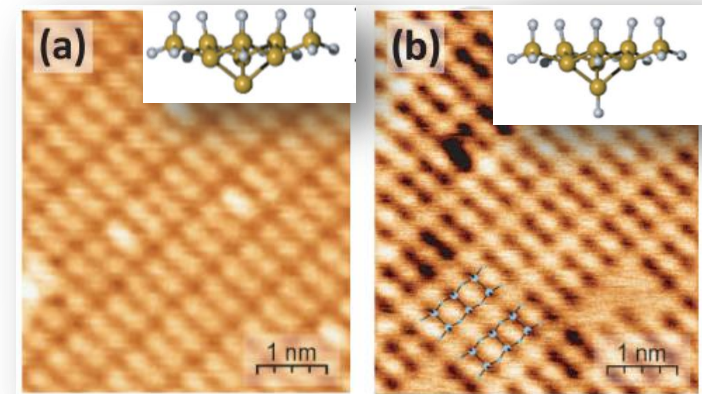


The ability to fabricate electronic devices (a single atom transistor) with atomic precision.

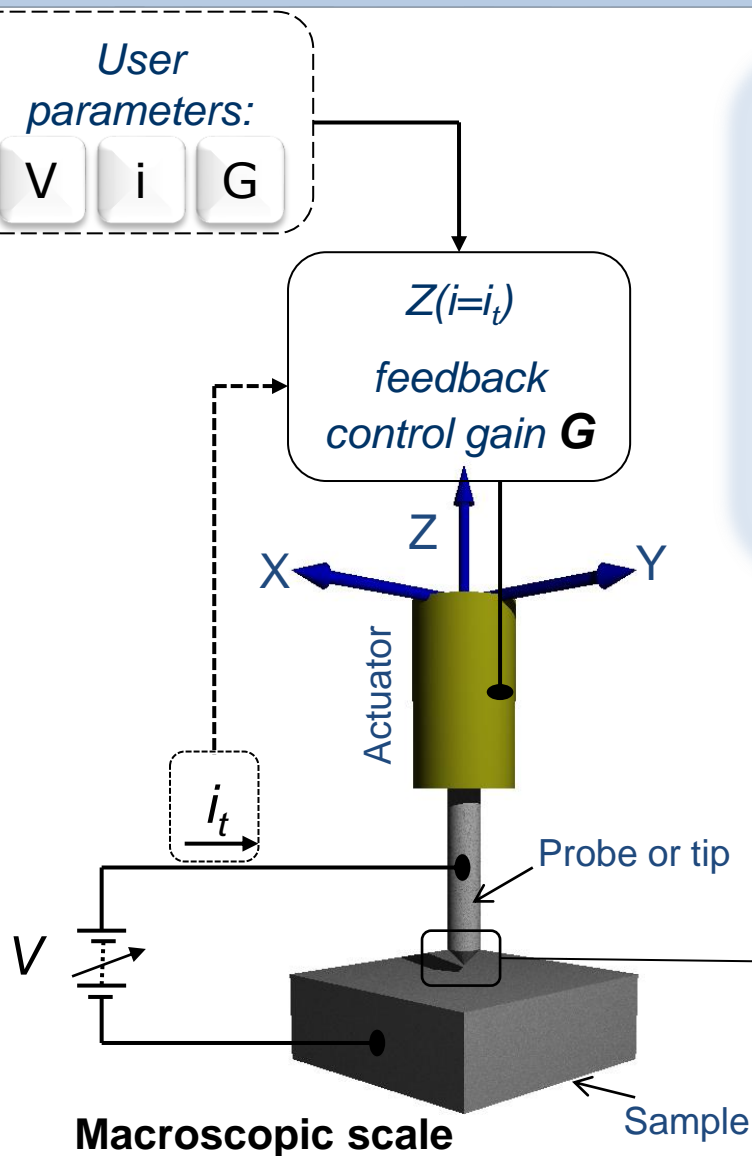
Fuechsle *et al.* Nature Nanotechnology 7, 242–246 (2012)

The importance of the probe structure; a single H atom at the probe apex inverts the image contrast.

Sharp *et al.* Appl. Phys. Lett. 100, 233120 (2012)



# Scanning Tunneling Microscopy



Imaging parameters:

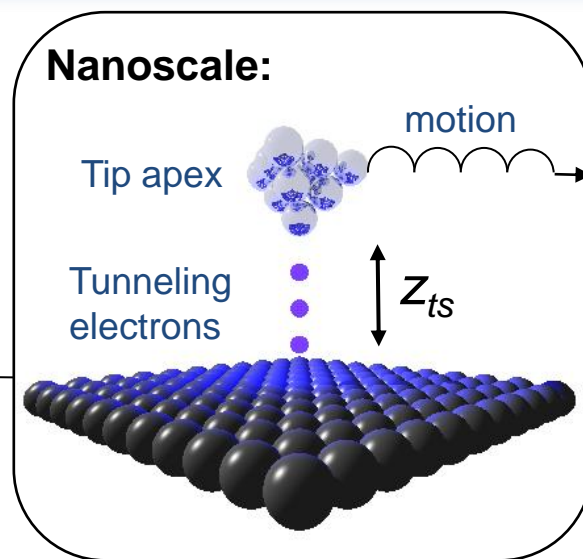
Tunnel current,  $i_t$

Voltage,  $V$

Gain,  $G$

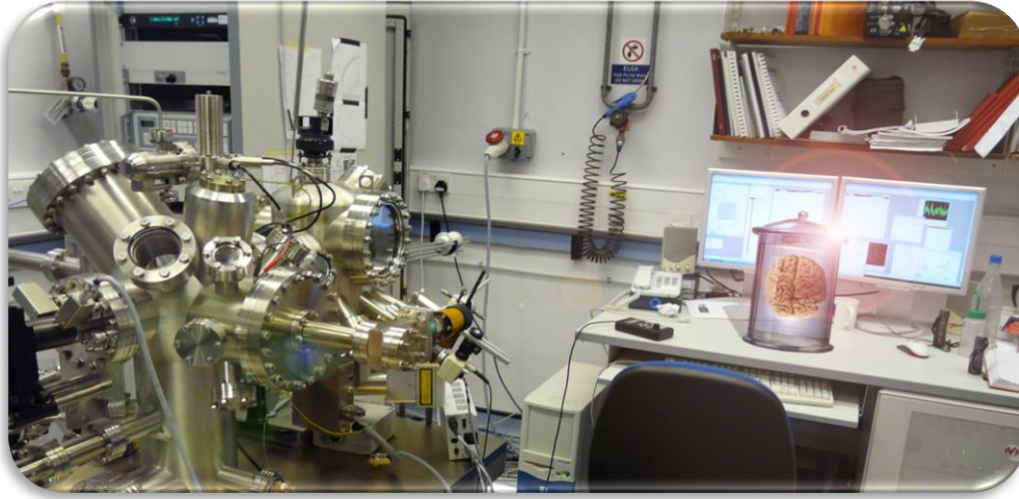
$$i_t \propto V \exp(-2kz_{ts})$$

Where the tip-sample separation,  $z_{ts}$ , is maintained by a feedback loop of gain,  $G$ .

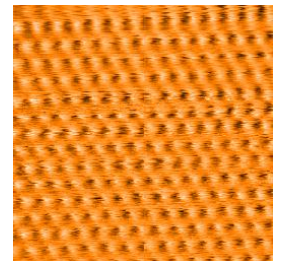
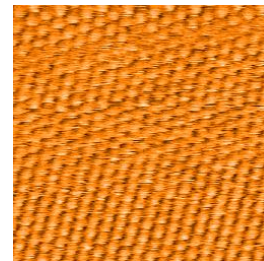
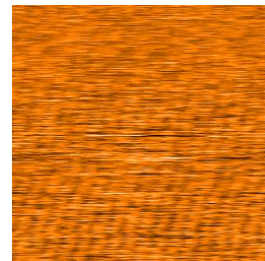
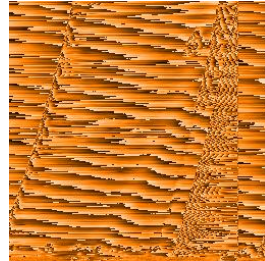
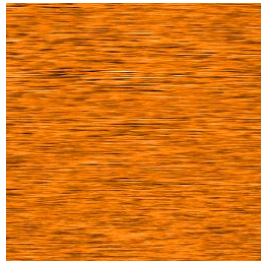
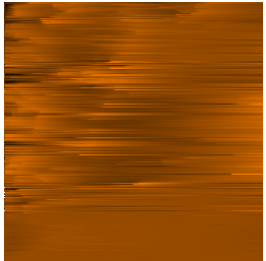


# 30 years without a solution, until now

(Criteria E & G)



- Thousands of users world wide
- Expensive machine and operator costs
- Many hours spent manually optimising images

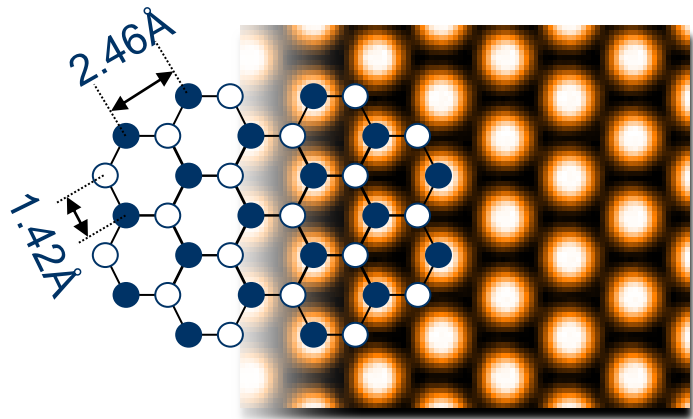


## The problems:

- Changing tip state and,
- Obtaining the optimum imaging parameters **V**, **i** and **G**



# Fitness and the cGA



Target Image, T

$$Fitness = RMI(T, I)$$



Acquired Image, I

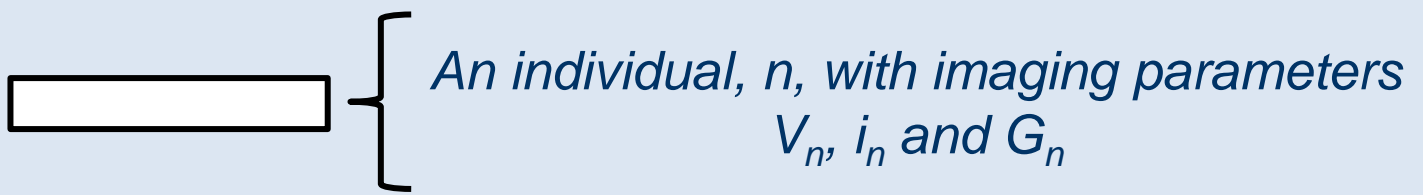
Imaging parameters

V

i

G

The cGA:



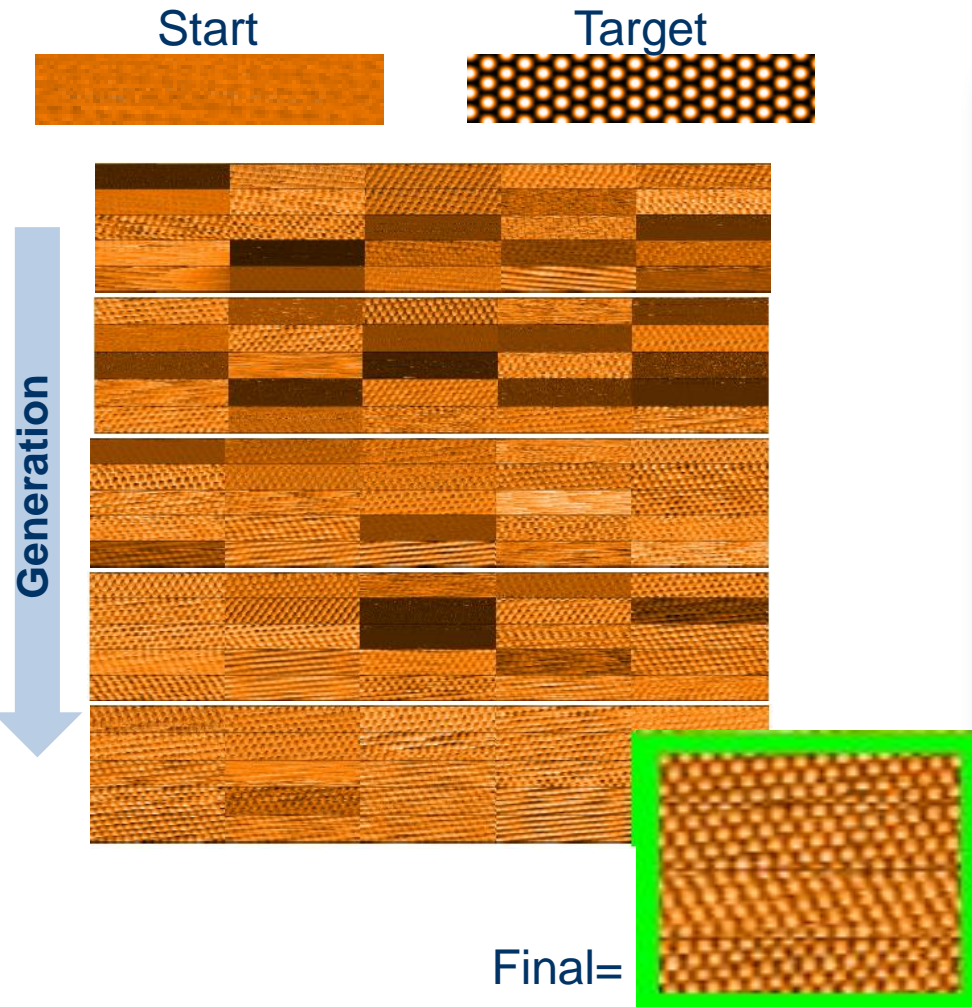
				$V_{N-1}, i_{N-1}, G_{N-1}$
				$V_N, i_N, G_N$

The population of  $N$  individuals, each with imaging parameters  $V, i, G$

E.Alba and B. Dorronsoro, Cellular Genetic Algorithms (Springer 2008) ; Q.H. Quang et al., Evol. Comp. 17 231 (2009)

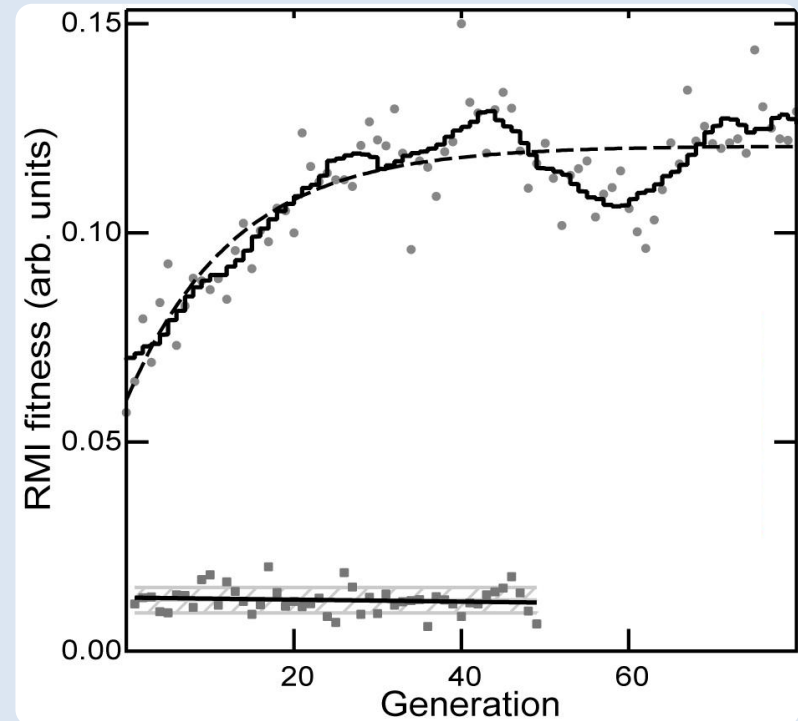
# The cGA in operation

(Criteria F)



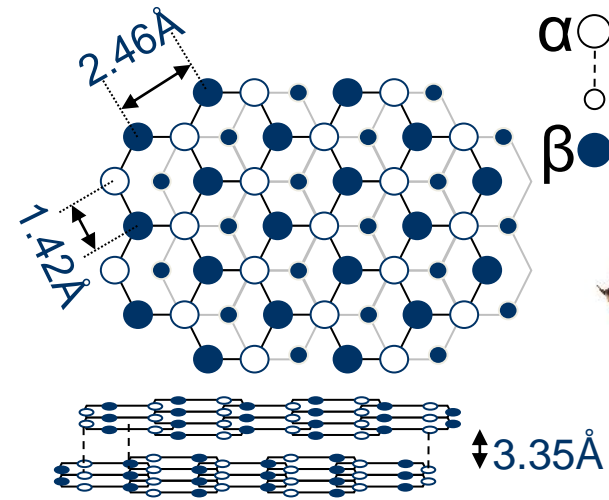
- Images taken by microscope for the individual's parameters  $V, i, G$
- Migrate good  $V, i, G$

Generation vs. Fitness

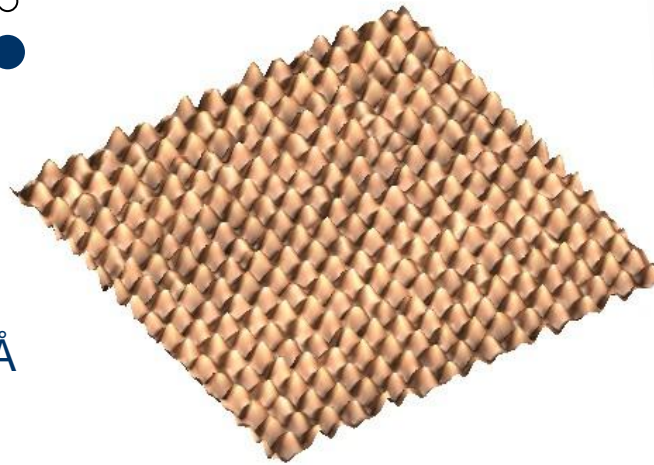


# Can we choose different tip states?

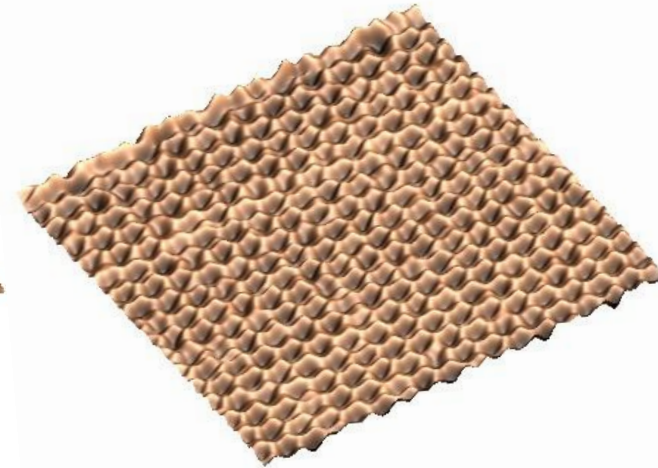
(Criteria E & D)



Triangular



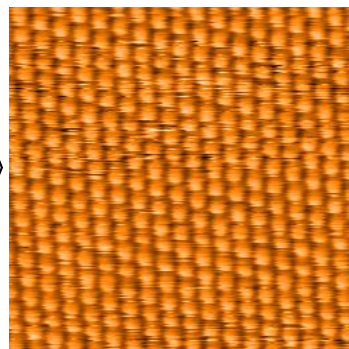
Honeycomb



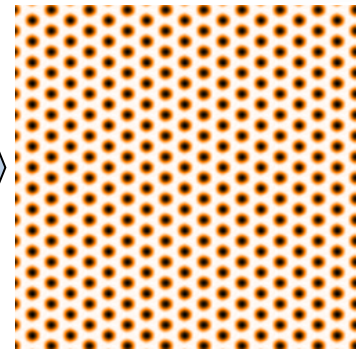
Triangular target



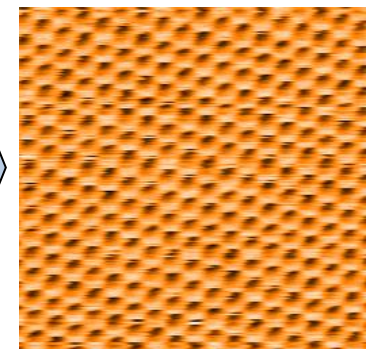
Triangular image



Honeycomb target



Honeycomb image



R.A.J. Woolley, J. Stirling, A. Radocea, N. Krasnogor, and P.J. Moriarty, Appl. Phys. Lett. 98, 253104 (2011)



# Is it comparable to the human operator?

(Criteria H)

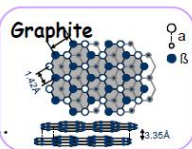
\*Open to all, inexperienced scanning probe microscopists welcome!

## Beat the 'nano' machine



The scanning tunnelling microscope (STM) has the ability to visualise the nano-world

100100101011010101  
0010101010111111  
1111000101010010  
0101001010010100



Event times:  
Friday 23rd & Monday  
26th April 2010

What the machine can do...



Carbon Atoms!

What can you do...?

1001010010010  
010010  
101010

Place:  
Physics and Astronomy, A30

Questions? Contact Richard Woolley  
richard.woolley@nottingham.ac.uk  
x68827

## The Competition (Human vs. Machine):

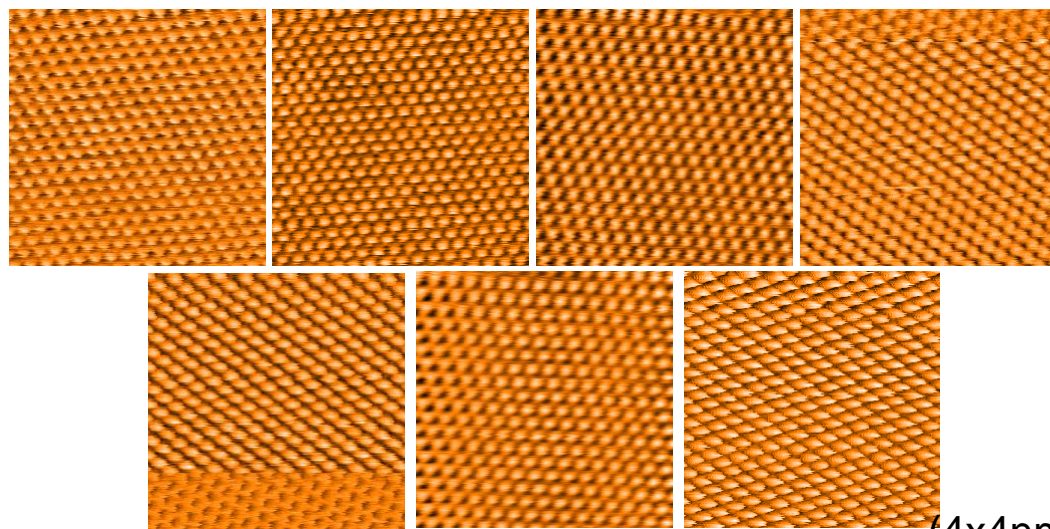
Obtain the best image possible within 1 hour

## Results of the challenge

Microscopist	Average image quality	Change in image quality per min
Machine	0.20*	7.1*
Human	0.09	2.6

\*winner

## A selection of the machine optimised images:



(4x4nm<sup>2</sup>)



# Criteria for human-competitiveness

(A) The result was patented as an invention in the past, is an improvement over a patented invention, or would qualify today as a patentable new invention

- New invention
- Working with the leading manufacturer

(D) The result is publishable in its own right as a new scientific result independent of the fact it was mechanically created.

- R.A.J. Woolley, J. Stirling, A. Radocea, N. Krasnogor, and P.J. Moriarty, *Appl. Phys. Lett.* 98, 253104 (2011)
- The same journal as the original Nobel prize winning invention

(E) result  $\geq$  the most recent human-created solution to a long-standing problem for which there has been a succession of increasingly better human-created solutions.

- The human operator was the solution

# Criteria for human-competitiveness

(F) result  $\geq$  a result that was considered an achievement in its field at the time it was first discovered.

- The system is state of the art

(G) The result solves a problem of indisputable difficulty in its field.

- “That’s impossible”
- “Can we have it, please?”

(H) The result holds its own or wins a regulated competition involving human contestants (in the form of either live human players or human-written computer programs)

- The ‘Nano-machine’ won!

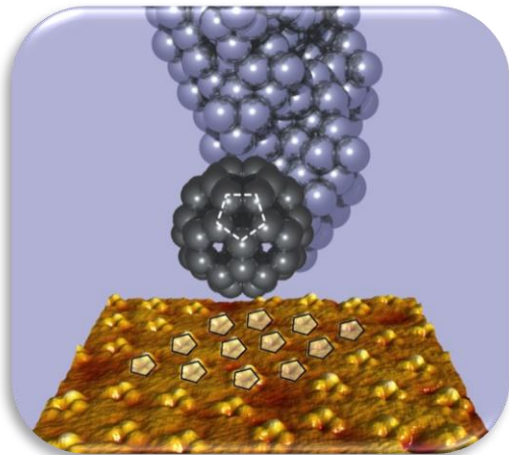
# Summarising why this entry is best!

- *A step-wise change in STM operation for over 30 years*
- *An underpinning technology for the wider scanning probe instrumentation sector*
- *Innovative*
- *Greatly improved productivity*
- *State of the art*
- *Meets 6 out of the 8 criterion*
  
- *It's just the tip of the iceberg....*

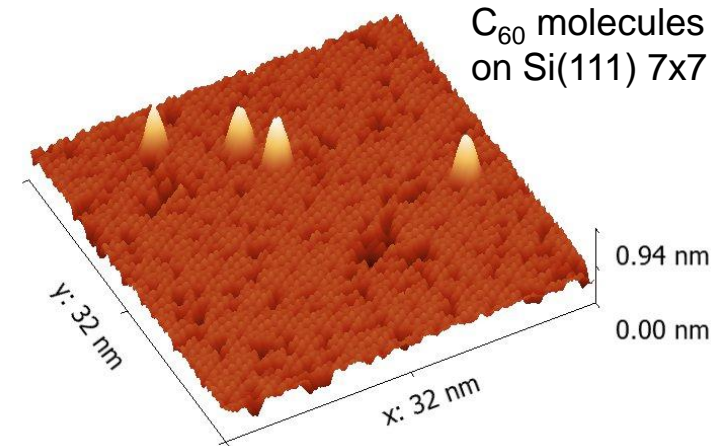


# Potential Future Impact

*What does the future hold for a robot that can recognise atoms and molecules...*



*Image courtesy of S. Jarvis*



*....and can develop the nanoscale tools and necessary protocols to manipulate those atoms and molecules?*

*What would you get the robot to build?*

*What if it evolved things that **it** wanted to?*



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<http://icos.cs.nott.ac.uk/>



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Engineering and Physical Sciences  
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