# Order from Chaos



The design and interpretation of high-throughput crystallization screens to guide optimization

Edward Snell

# Acknowledgements



Ray Nagel for programming support

Joe Luft for discussions on the 1536 screen and analysis of the results





Miriem Said



Melvin for the initial programming during his summer student project.

Ann, Miriem, Jen and Elizabeth for useful discussions, helping with the design of the chemical space, scoring images and testing the initial versions of the program.

Steve for providing multiple macromolecule data for testing and George for supporting the research.

Not to forget the rest of the High-Throughput Lab, Tina, Angela and Ellie for putting up with me. Thanks also to Dean Myles, Hugh O'Neal and Flora Meilleur for samples.









### Simplified phase diagram for crystallization



**Precipitant Concentration** 

## Even simpler phase diagram for crystallization



### Start to throw some reality into the equation



### And reduce the chances of crystallization a little



#### Add the experimental space we sample



#### And the fact that it's not just two dimensions



## Lets introduce a typical crystallographer ...



Overconfidentii Vulgaris

(Cristali Coltivatore Optimista)

And the crystal of interest ...

Road Runner (Beep beep)



Disappearialis Quickius

(Cristallio Perfetto)

# And how the rules of the crystallographer relate to crystallography ...

- 1. Road Runner cannot harm the Coyote except by going "Beep! Beep!"
- 2. No outside force can harm the Coyote only his own ineptitude or the failure of Acme products.
- 3. The Coyote could stop anytime If he was not a fanatic.
- 4. No dialogue ever, except <u>"Beep! Beep!"</u>
- 5. Road Runner must stay on the road for no other reason than that he's a roadrunner.
- 6. All action must be confined to the natural environment of the two characters -- the southwest American desert.
- 7. All tools, weapons, or mechanical conveniences must be obtained from the Acme Corporation.
- 8. Whenever possible, make gravity the Coyote's greatest enemy.
- 9. The Coyote is always more humiliated than harmed by his failures.
- 10. The audience's sympathy must remain with the <u>Coyote.</u>

- 1. The crystal cannot harm the crystal grower except by not diffracting.
- 2. No outside force can harm the crystal grower only his own ineptitude or the failure of Hampton research products.
- 3. The crystal grower could stop anytime If they were not a fanatic.
- 4. No dialogue ever from the crystal.
- 5. The crystal will be on the path between precipitate and clear for no other reason than it's a crystal.
- 6. All reactions must be confined to the natural environment of the crystal.
- 7. All tools, weapons, or mechanical conveniences must be obtained from Hampton Research.
- 8. Whenever possible, make salt crystals the crystal grower's greatest enemy.
- 9. The crystal grower is always more humiliated than harmed by his failures.
- 10. The audience's sympathy must remain with the <u>crystal grower.</u>



# Crystallizing Macromolecules

Many different methods but they all have things in common:

- They are designed to traverse the crystallization phase diagram.
- They use many different kinds of solutions to sample crystallization space at many points.

# Catching Road Runners









Molecular Dimensions Limited





# Crystallization is complex

How do we grow crystals?

- Multiple guess?
- Intelligent design?

Set up many small scale experiments in conditions likely to be favorable for crystallization

- Limited by amount of sample, time and effort.
- How many conditions is optimum? Divergent views (we'll return to this later)

# Lets do the experiment



#### What results can we expect to see?



#### What do we actually see?



### What do we actually see?



Optimize crystals by screening around the hit conditions, *i.e.* 0.1 M ammonium phosphate dibasic, 0.1 TAPS pH 9 and 20% (w/v) PEG

# Remember how the rules of the crystallographer relate to crystallography ...

- 1. Road Runner cannot harm the Coyote except by going "Beep! Beep!"
- 2. No outside force can harm the Coyote only his own ineptitude or the failure of Acme products.
- 3. The Coyote could stop anytime If he was not a fanatic.
- 4. No dialogue ever, except <u>"Beep! Beep!"</u>
- 5. Road Runner must stay on the road for no other reason than that he's a roadrunner.
- 6. All action must be confined to the natural environment of the two characters -- the southwest American desert.
- 7. All tools, weapons, or mechanical conveniences must be obtained from the Acme Corporation.
- 8. Whenever possible, make gravity the Coyote's greatest enemy.
- 9. The Coyote is always more humiliated than harmed by his failures.
- 10. The audience's sympathy must remain with the <u>Coyote.</u>

- 1. The crystal cannot harm the crystal grower except by not diffracting.
- 2. No outside force can harm the crystal grower only his own ineptitude or the failure of Hampton research products.
- 3. The crystal grower could stop anytime If they were not a fanatic.
- 4. No dialogue ever from the crystal.
- 5. The crystal will be on the path between precipitate and clear for no other reason than it's a crystal.
- 6. All reactions must be confined to the natural environment of the crystal.
- 7. All tools, weapons, or mechanical conveniences must be obtained from Hampton Research.
- 8. Whenever possible, make salt crystals the crystal grower's greatest enemy.
- 9. The crystal grower is always more humiliated than harmed by his failures.
- 10. The audience's sympathy must remain with the <u>crystal grower.</u>

# Remember how the rules of the crystallographer relate to crystallography ...

- 1. Road Runner cannot harm the Coyote except by going "Beep! Beep!"
- 2. No outside force can harm the Coyote only his own ineptitude or the failure of Acme products.
- 3. The Coyote could stop anytime If he was not a fanatic.
- 4. No dialogue ever, except <u>"Beep! Beep!"</u>
- 5. Road Runner must stay on the road for no other reason than that he's a roadrunner.
- 6. All action must be confined to the natural environment of the two characters -- the southwest American desert.
- 7. All tools, weapons, or mechanical conveniences must be obtained from the Acme Corporation.
- 8. Whenever possible, make gravity the Coyote's greatest enemy.
- 9. The Coyote is always more humiliated than harmed by his failures.
- 10. The audience's sympathy must remain with the <u>Coyote.</u>

- 1. The crystal cannot harm the crystal grower except by not diffracting.
- 2. No outside force can harm the crystal grower only his own ineptitude or the failure of Hampton research products.
- 3. The crystal grower could stop anytime If they were not a fanatic.
- 4. No dialogue ever from the crystal.
- 5. The crystal will be on the path between precipitate and clear for no other reason than it's a crystal.
- 6. All reactions must be confined to the natural environment of the crystal.
- 7. All tools, weapons, or mechanical conveniences must be obtained from Hampton Research.
- 8. Whenever possible, make salt crystals the crystal grower's greatest enemy.
- 9. The crystal grower is always more humiliated than harmed by his failures.
- 10. The audience's sympathy must remain with the <u>crystal grower.</u>

# Remember how the rules of the crystallographer relate to crystallography ...

- 1. Road Runner cannot harm the Coyote except by going "Beep! Beep!"
- 2. No outside force can harm the Coyote only his own ineptitude or the failure of Acme products.
- 3. The Coyote could stop anytime If he was not a fanatic.
- 4. No dialogue ever, except <u>"Beep! Beep!"</u>
- 5. Road Runner must stay on the road for no other reason than that he's a roadrunner.
- 6. All action must be confined to the natural environment of the two characters -- the southwest American desert.
- 7. All tools, weapons, or mechanical conveniences must be obtained from the Acme Corporation.
- 8. Whenever possible, make gravity the Coyote's greatest enemy.
- 9. The Coyote is always more humiliated than harmed by his failures.
- 10. The audience's sympathy must remain with the <u>Coyote.</u>

- 1. The crystal cannot harm the crystal grower except by not diffracting.
- 2. No outside force can harm the crystal grower only his own ineptitude or the failure of Hampton research products.
- 3. The crystal grower could stop anytime If they were not a fanatic.
- 4. No dialogue ever from the crystal.
- 5. The crystal will be on the path between precipitate and clear for no other reason than it's a crystal.
- 6. All reactions must be confined to the natural environment of the crystal.
- 7. All tools, weapons, or mechanical conveniences must be obtained from Hampton Research.
- 8. Whenever possible, make salt crystals the crystal grower's greatest enemy.
- 9. The crystal grower is always more humiliated than harmed by his failures.
- 10. The audience's sympathy must remain with the <u>crystal grower.</u>



### Chemical space provides a vector for optimization

In this case the path from precipitate through crystals to clear is obvious. The phase diagram is reversed. Also clear are the number of chemical conditions that have not been sampled.

Ubiquitin, 40% PEG, 0.1M zinc acetate





### It also illustrates the space we do not sample



We only sample discrete points within the sampling space



# The HWI crystallization cocktail screen.

The 1536 diverse chemical cocktails (Luft et al., 2003). The 984 in-house conditions comprise a incomplete factorial sampling of 36 salts, eight buffers, and 5 different PEGs.

The remainder of 1536 cocktails are comprised of commercial screens available from Hampton Research. Specifically, in order of use; the Natrix Screen, Quick Screen, Nucleic Acid Screen, Sodium Malonate Grid, PEG/Ion, PEG 6000 Grid, Ammonium Sulfate Grid, Sodium Chloride Grid, HT Screen, Index and the SaltRx screen. The original Hampton Research 1+2 sample a set of conditions known to produce crystals in the past with the predominant variable being pH. Although described as a sparse matrix the number of samples is small and the distribution in chemical space wide therefore it is difficult to relate results from one condition to results from other conditions. This is the primary reason that crystallization today is target focused.

B12

C2

G2

G5

F8

F11

H1

H2

H6

C9

C10

E11

E12

H11

H12

pН

6.9

E2

0.4M

0.7M

1.0M

1.8M

0.8M

1.0M

1.5M

0.6M

1.2M

0.5M

1.2M 2.2M

0.5M

1.0M

35%

60%

1.0M

Formate

dihydrate

Sulfate

hydrate

Sulfate

nonohyd

ate

Sodium

tartrate

Thiocynat

B11

G1

G4

ithium

F7

F10

H5

**DL-Malic** acid

Succinic acid

Tacsimate

E1

Potassiu

C1

G3

G6

F9

F12

H3

H4

H7

# The Commercial Screens in the HWI crystallization cocktails

The commercial screens incorporate several distinct mechanisms of sampling the crystallization space. Examples are shown here.



### A special case – The Hampton Research Index Screen

Hampton Research Index Screen																			
Note, the HT screen is not a convential screen as such. It is designed to sample a range of reagents and provide an indication of the																			
appropiate chemical area and variables that would be appropiate for crystallization and should be used in this manner.																			
pН	Ammonium Sulfate 2.0M	Sodium chloride 3.0M		Magnesium	formate dihy drate		Sodium	phosphate		Neutralized organic acids (ph 7.0)		High supersaturatio	n salt and low polymer		Low ionic strendth	systems		Non-volatile	organics
pН		-		0.3M	0.5M		рΗ					pН			pН	-		pH	
3.5	A1	A7					5.6	B5		B9		5.5	C8		3.5	D4		55	D12
4.5	A2	A8					6.9	B6		B10		6.5	C6		4.5	D5		0.0	E2
5.5	A3	A9		B1			8.2	B7		B11		8.5	C7		5.5	D6			E1
6.5	A3	A10			B2					B12			C9			D7			E3
7.5	A5	A11		B3						C1		7	C10		6.5	D10		6.5	E6
8.5	A6	A12			B4					C2		ľ í	C11			D11			E9
										C3			C12		7	D2			E10
	Classic salt versus pH									C4					'	D3			E4
									C5					7.5	D8		7.5 E	E7	
	Lite have indicate that a variation of z = "													8.5	D9		7.5	E8	
	rills here indicate that a variation of salt																		E11
	has a strong potential for crystallization																	85	E5
										0.0	E12								
	PEGs and Salts as a function of pH PEG 3350 and salts																		
	3.35K 10K 3.35K							_											
pН	Ammonium sulfate	Sodium chloride	Lithium sulfate monohydrate	Ammonium acetate	Magnesium Chloride hexahydrate	Ammonium acetate	Mixed chloridehydrates	%	Potassium sodium tartrate tetrahydrate	Sodium malonate pH 7.0	Ammonium citrate tribasic pH 7.0	Succinic acid pH 7.0	Sodium formate	DL-Malic acid pH 7.0	Magbesium formate dihydrate	Zinc acetate dihydrate	Sodium citrate tribasic dihydrate	Potassium thiocyanate	Potassium bromide
5.5	F6	F10	G2	G6	G10	F5		15				H5			H8				
6.5	F7	F11	G3	G7	G11			20	H2	H3	H4		H6	H7		H9	H10		
7.5	F8	F12	G4	G8	G12		F4	25											
8.5	F9	G1	G5	G9	H1			30										H11	H12

Coarse test for chemical conditions likely to produce crystallization

### Sherlock and Watson.

"We approached the case, you remember, with an absolutely blank mind, which is always an advantage. We had formed no theories. We were simply there to observe and to draw inferences from our observations"

Sherlock Holmes to Dr. Watson

I never get your limits, Watson. There are unexplored possibilities about you.

Sherlock Holmes on Dr. Watson.

Two pieces of related software under development;

- Sherlock to look at the individual 'crime', *i.e.* examine results from a single macromolecule
- Watson to tell the complete story, *i.e.* look at trends from many experiments.



### Sherlock and Watson.

"We approached the case, you remember, with an absolutely blank mind, which is always an advantage. We had formed no theories. We were simply there to observe and to draw inferences from our observations"

Sherlock Holmes to Dr. Watson

I never get your limits, Watson. There are unexplored possibilities about you.

Sherlock Holmes on Dr. Watson.

Two pieces of related software under development;

- Sherlock to look at the individual 'crime', *i.e.* examine results from a single macromolecule
- Watson to tell the complete story, *i.e.* look at trends from many experiments.





Draw = 🔓 | AutoShapes = 🔨 🔍 🗔 🔿 🔤 🐗 🤃 🕲 🕼 😓 = 🗮 🛱 🚇 🗃 🧝

Ready

-					Multiple Images				
💌 Micr	osoft Excel					1. 11 94 4	and the		
Eile Eile	<u>E</u> dit <u>V</u> iew <u>I</u> nsei	rt F <u>o</u> rmat <u>T</u> ools <u>D</u> ata <u>W</u> indo	w <u>H</u> elp	Ado <u>b</u> e PD		100			
1	*	🖀   🌺 •   🗄 🎟   🗄 🏢   🔇	8 🗞 🗧	Arial					
2	) 🐔 📕 💷 🐿	🔁 🖉 🔁 🖄 🛛 🏷 🕅 🖡	b (2)	₩¥ Reply w			Anna I		
A	2 🗸	fx					the second second		
텔 4w	k sherlock.xls					a second			
	А	В	С	D					
			X00	00007					and the second sec
1				mine and					
					B SA				1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1
				S L	Constant and				e
				CA					
2		ļ	M						
3		pН		9	Well #41 (6_C0011) -Precipitate -Phase Separation				
4					2.5M Ammonium chloride 0.1M Na Acetate, pH: 5				
5			1.19		21	25 201	λ	1	
6		bromide	2.38		9 13	404	%		
7			3.56	5		1			
8			1.25		197 2	209	% 383		
9		chloride	2.5	193	41	45 404	%		
Image of W	ell #41 00011)			Ma Ima	ge of Well #29 I #29 (6_C0008)		Image of Well #33 (	Well#33 6 C0009)	
-Precipitate -Phase Separ 2.5M Ammoni	ation um chloride			-*C -Pri -Ph	RYSTALS* scipitate ase Separation		-*CRYSTA 3.74M Am 0.1M MOP	L5* nonium chloride 5, pH: 7	
0.1M Na Acel	ate, pH: 5	Accel		13 <sup>3.7</sup>	IM Ammonium chloride M Na Citrate, pH: 4			and the second se	
	1.11.39				2000	ST.			1000
	1111ST	0		ary	and a second	AS-		11111	No. 1 and a second
		The second se				V F			
					13	00			.» 1
		· 18-31			NY a	D.M.			
	A	J.			Second Contraction	9201			
					A 10	L.		1 1	
					and the second				Section 1
			-			and the second second			

### Sherlock and Watson.

"We approached the case, you remember, with an absolutely blank mind, which is always an advantage. We had formed no theories. We were simply there to observe and to draw inferences from our observations"

Sherlock Holmes to Dr. Watson

I never get your limits, Watson. There are unexplored possibilities about you.

Sherlock Holmes on Dr. Watson.

Two pieces of related software under development;

- Sherlock to look at the individual 'crime', *i.e.* examine results from a single macromolecule
- Watson to tell the complete story, *i.e.* look at trends from many experiments.



### Sherlock and Watson.

"We approached the case, you remember, with an absolutely blank mind, which is always an advantage. We had formed no theories. We were simply there to observe and to draw inferences from our observations"

Sherlock Holmes to Dr. Watson

I never get your limits, Watson. There are unexplored possibilities about you.

Sherlock Holmes on Dr. Watson.

Two pieces of related software under development;

- Sherlock to look at the individual 'crime', *i.e.* examine results from a single macromolecule
- Watson to tell the complete story, *i.e.* look at trends from many experiments.





Watson looks at the complete picture rather than an single 1536 screen of one macromolecule.

In this case crystallization results for 106 macromolecues are shown several weeks into their growth. Only those samples showing crystals are tabulated here..

Dark blue indicates 5 or more crystal hits in the 106 conditions, medium blue is 3-4 hits and light blue is 1-2. Grey shows other conditions sampled (only 3 conditions) while white spaces are un-sampled regions of the incomplete factorial.



### Sherlock and Watson – Current Status

- Sherlock is currently being tested in the High-Throughput laboratory. The aim is to release it to external users as a beta version in the near future.
- There are several possible representations of chemical space available, only one was shown here.
- Currently it requires manual scoring of images. Developments in automated image analysis look very promising and there is near certainty that we can automatically score clear and precipitate images leaving a much smaller number of images to visually examine. Other research is underway to automatically score these as well.
- Watson is under development and at present is only being used by a limited number of testers to analyze the performance of the HWI cocktails and commercial screens used in the laboratory.

#### Future work

- To automatically flag patterns that may indicate potential regions for further exploration if a crystallization hit does not occur. For example, two results showing clear and precipitate separated by a long un-sampled chemically sensitive pathway.
- To produce separate programs for other screens.
- To incorporate time or temperature resolved data, predict the best optimization strategies or aid the interpretation of current optimization techniques such as Drop Volume Ratio/Temperature (DVR/T) Luft et al., 2007.

### How many samples?

In using chemical space mapping to analyze a number of samples it has become clear that 1536 is a good number of experiments to try. It enables a wide range of chemical space to be investigated with sufficient detail to identify common regions for crystallization together with diversely separated regions where different crystal forms may result





It is important to investigate not a single hit but as many hits as you have sample. Visual observation only indicates a crystal, not that it diffracts well or even if it is a macromolecular crystal rather than salt or PEG. Spreading the effort among many hits is better than focusing exclusively on one.





# Summary

- No experiment should be considered in isolation.
- In crystallization screening when you have a sparse matrix, incomplete factorial or any other designed sampling of chemical space the results build up a picture of the crystallization landscape.
- An experiment with no crystallization hits that which generates both precipitate and clear conditions is promising when those conditions are separated by an unsampled chemically sensible direction.
- You should know what crystallization conditions you examined but more importantly how those relate to those that were not sampled.
- Optimize as many samples as you can.
- Check with X-rays as soon as possible.
- The axis of crystallization space have a complex relationship with those in chemical space. We have a limited understanding of those relationships and hopefully Watson will reveal a better story from the >9000 cases we currently have.
- There are many more variables to explore!

# **Questions?**

