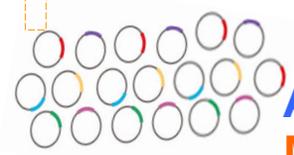
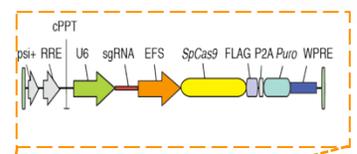
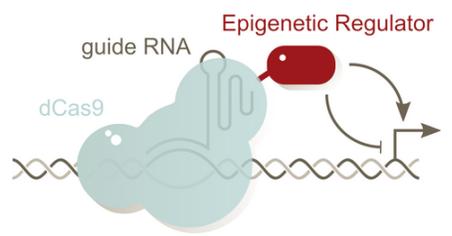


# Genome wide CRISPR applications in Toxicology

## Chris Vulpe



- Amin Sobh, Graduate Student**
- Mani Tagmount, Scientist**
- Alex Loguinov, Bioinformatics**
- Quan Lu, Collaborator, Harvard University**
- Luoping Zhang, Collaborator, UC Berkeley**
- Martyn Smith, Collaborator, UC Berkeley**



Invader genomes

# Outline

1. The world's shortest introduction to Adverse outcome pathways
2. Functional Toxicology – how to mess things up to learn something useful – you hope
3. Genome wide screens – how to mess up a whole lot of things, okay genes, all at the same time and of course, learn a whole lot more, really
4. Some examples from the lab -
  - Acetaldehyde – Ethanol's nasty metabolite
  - Arsenic – Toxic metalloid and cancer drug
5. Where we are headed – this is going to be an exciting and bumpy ride

# Toxicity

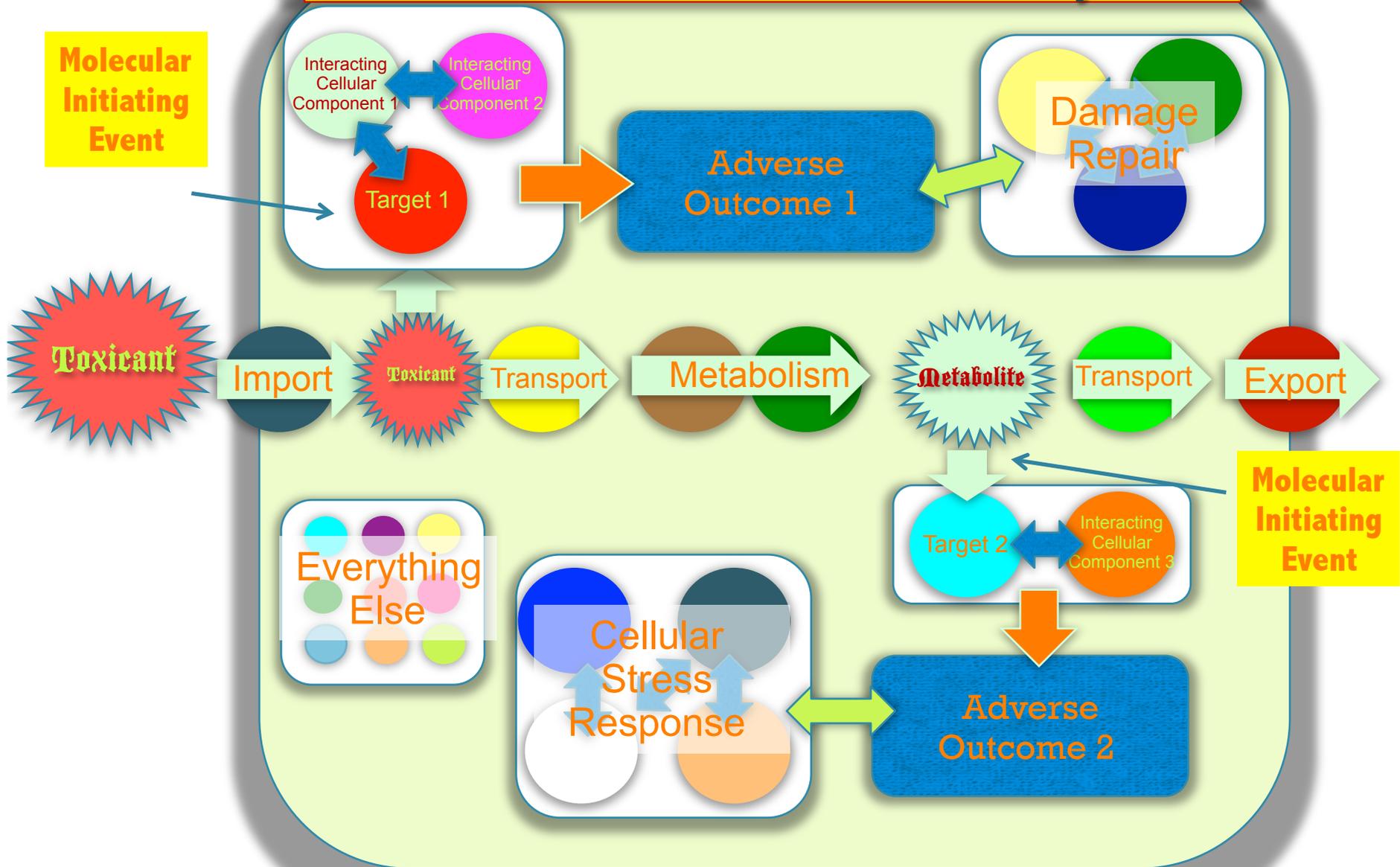
Old School



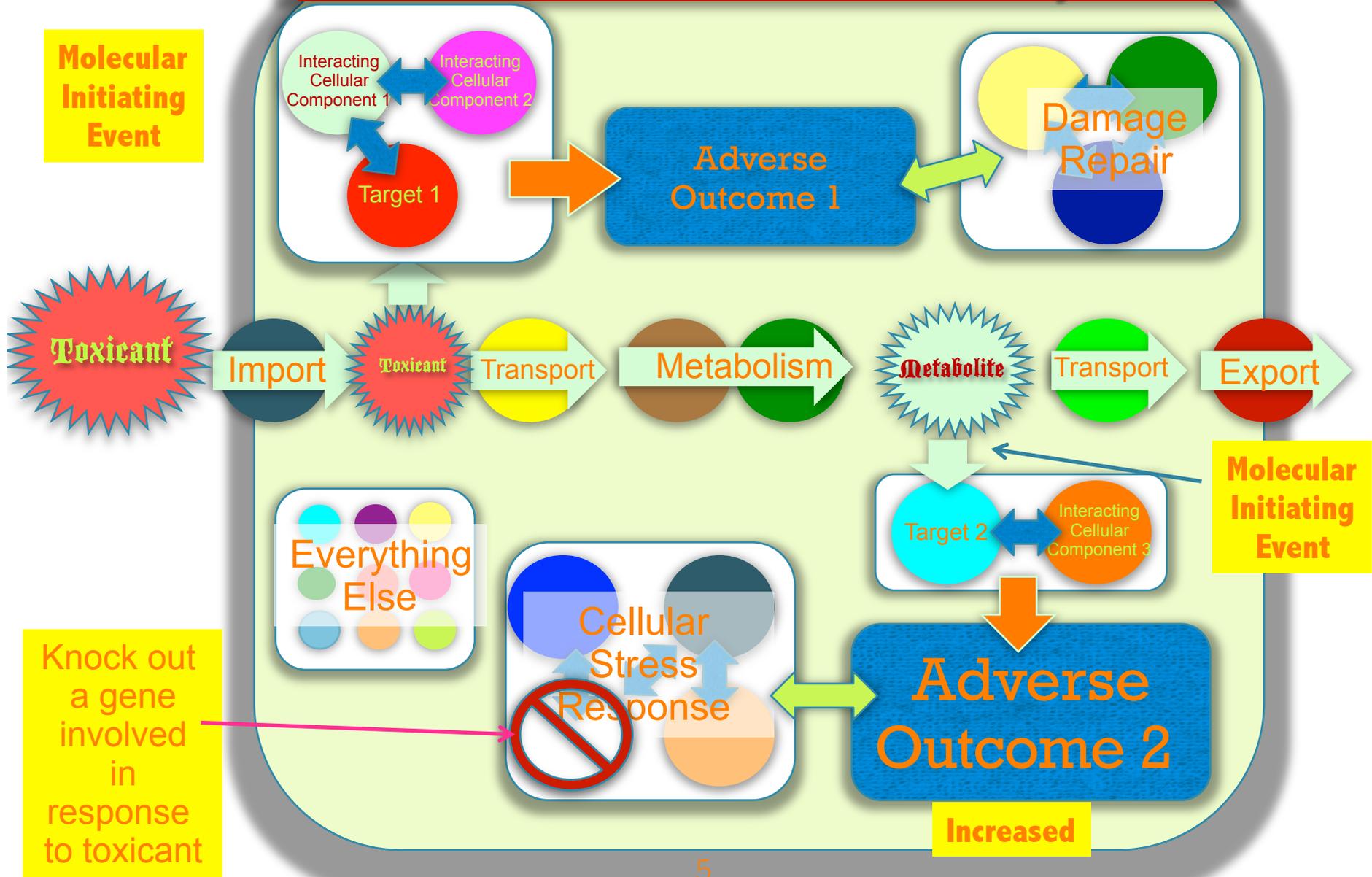
## Adverse outcome pathways

Reformed School

# Functional Toxicology to reveal Adverse Outcome Pathways



# Functional Toxicology to reveal Adverse Outcome Pathways

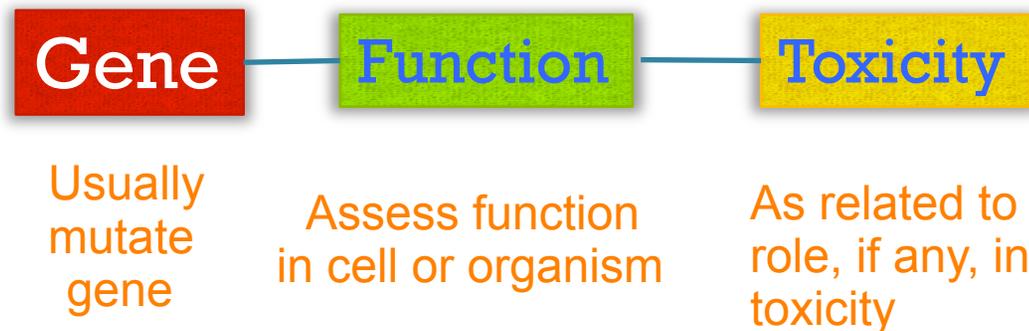


# Functional Profiling in Toxicology

the study of the requirement for the biological activities of genes and corresponding proteins in the response to, and effect on, an organism by a toxicant

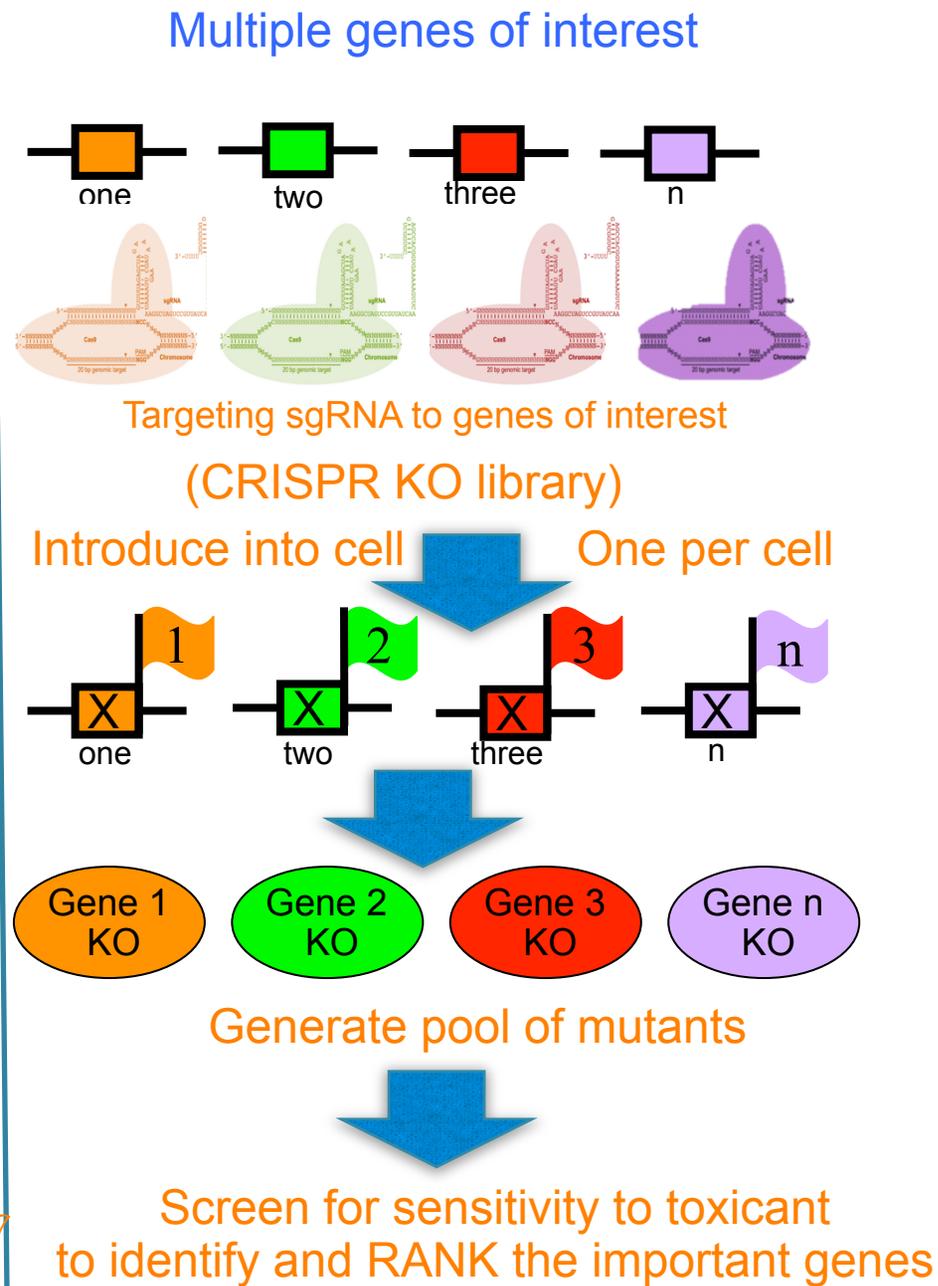
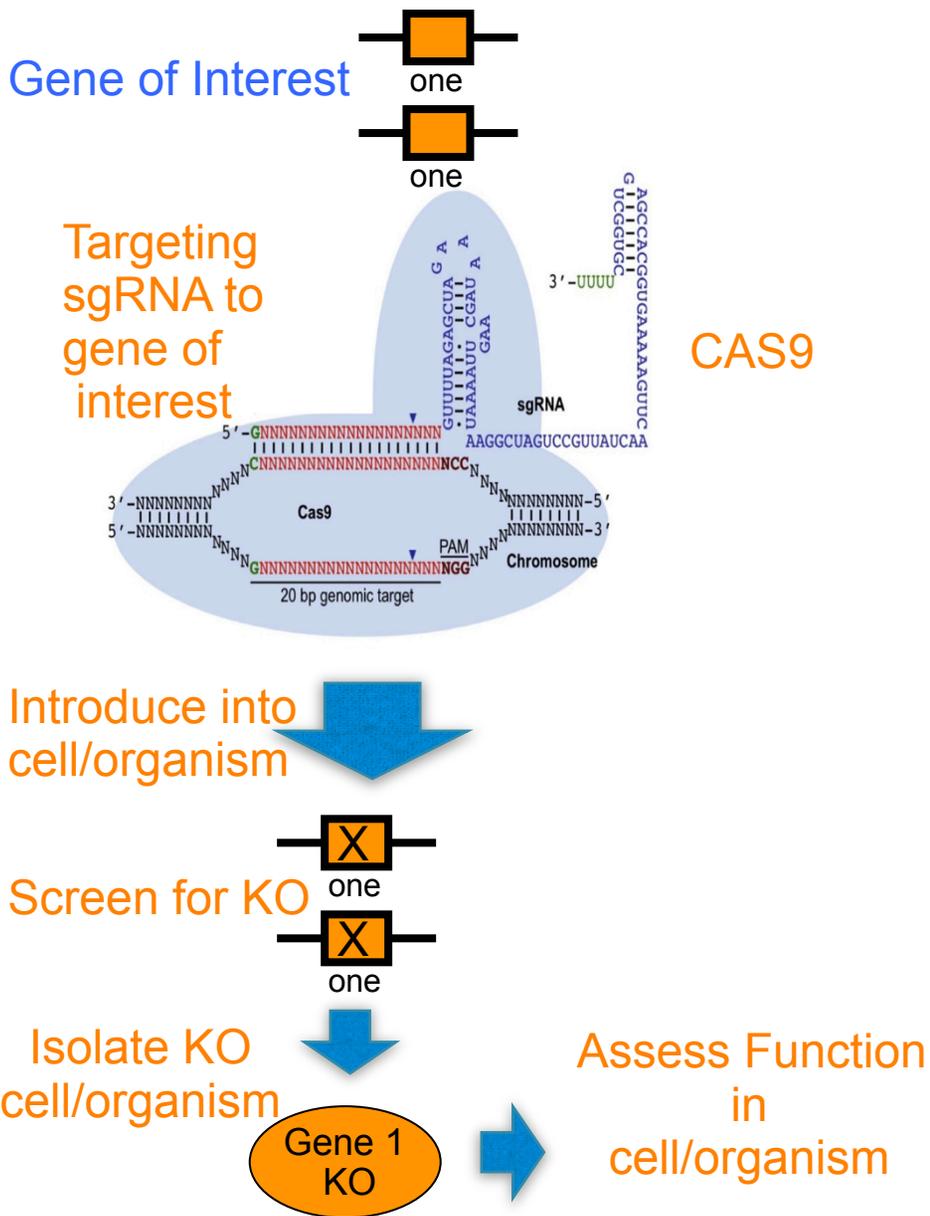
**OR if you muck it up (the gene) & bad (or good) things happen, then it's probably important**

Functional Profiling – systematically testing multiple genes for their functional role, if any, by perturbing their function



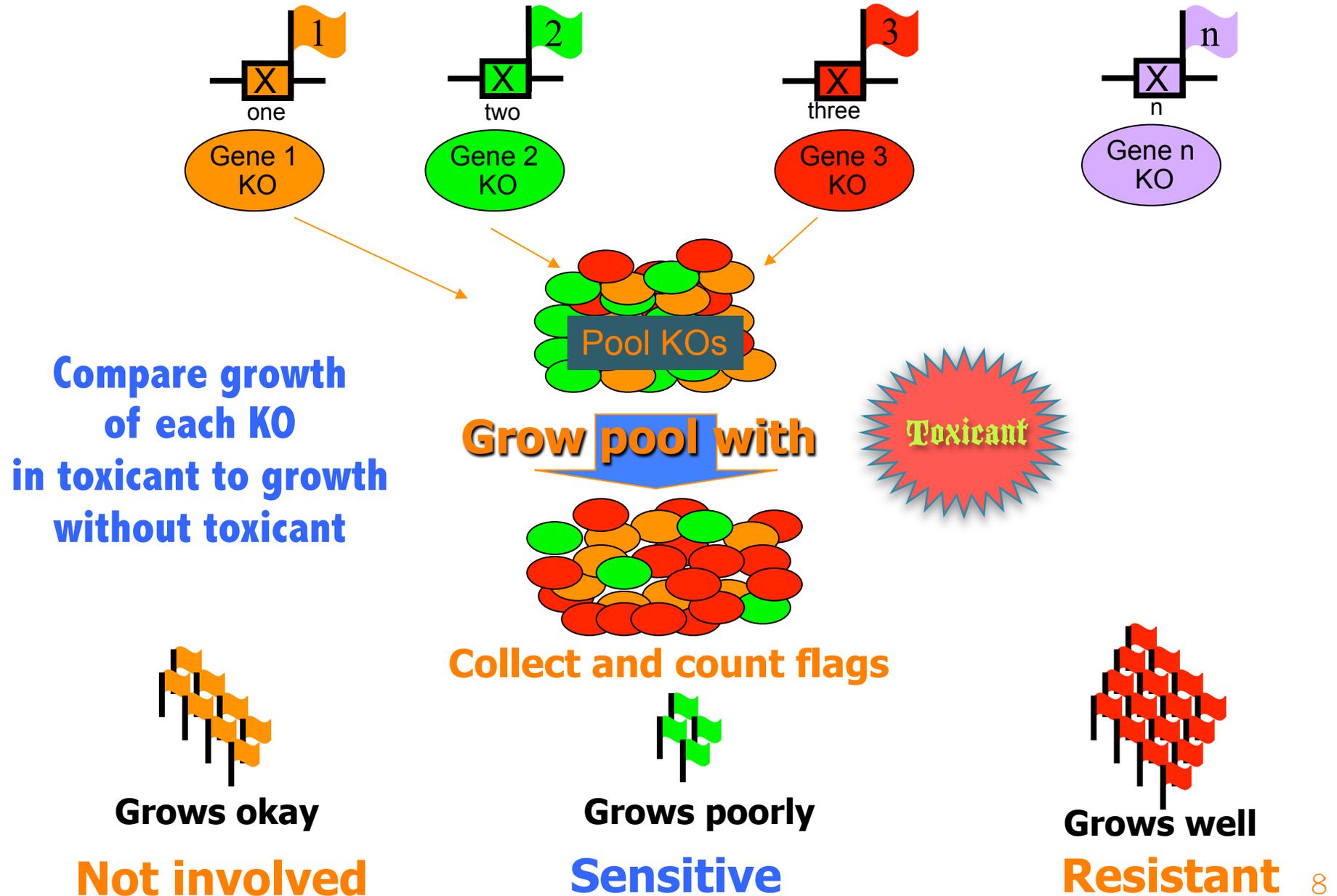
Goal is to link gene through its function to observed toxicity  
e.g. molecular target, transport, metabolism, cellular response, etc

# Targeted CRISPR vs Genome Wide CRISPR



# Genome Wide CRISPR in Toxicology

Each KO is individually flagged with a unique molecular barcode so they can be tracked



# Genome-wide Loss-of-function Screening (the weeds)

Okay – you are convinced – GW CRISPR is way cool

## Decisions, Decisions, and Issues, even more issues

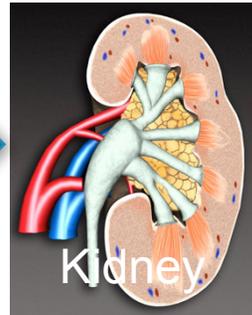
- **What organism?**
  - Pre-made Tools for Humans, Mice and Rats
  - But can generate CUSTOM tools for any organism with a sequenced genome
- **What genes do you want to target?**
  - All of the genes? Genome wide – every gene in the genome
  - Only a subset of genes – e.g the genes which encode proteins which carry out a specific set of functions – KREBS cycle
- **How much do you trust a COMPUTER?**
  - Selecting the targeting guides is done by computer algorithms
  - JUST TOO MANY to test them all with experiments
  - Some guides may not work – NO TARGET
  - Some guide may misdirect the CAS9 – OFF TARGET
  - Need to use MULTIPLE guides (3-10)
  - Redundancy – HOPE that some work and increases CONFIDENCE if you see same thing with different guides to the SAME gene.

# Genome-wide Loss-of-function Screening (more weeds)

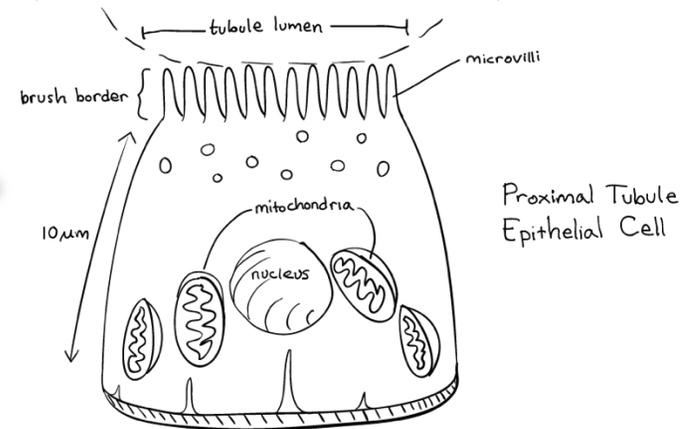
- You picked the organism, thought you were clever, well now what tissue, what cell?



©Warren Photographic



Tissue/Organ



Cell type

In fact, most whole genome CRISPR KO screens use CANCER Cell Lines

Why? They grow *in vitro*, they grow **FAST**, and *its CHEAPER*  
But lots of issues with USING CELL LINES  
FOR TOXICOLOGY – a big one is POOR or NO Metabolism

PRIMARY CELLS ARE POSSIBLE BUT HARD TO GROW, SLOW, EXPENSIVE

- AND finally what DOSE to USE? And for HOW LONG?

NOT TOO HIGH – KILL EVERYTHING / NOT TOO LOW – EVERYBODY HAPPY  
NOT TOO LONG – Yup, same reason / NOT TOO SHORT – ahh, cleansing bath

CONTROL – Always comparing to growth of each KO in absence of toxicant

Only a few published Genome wide CRISPR screens related to Toxicology

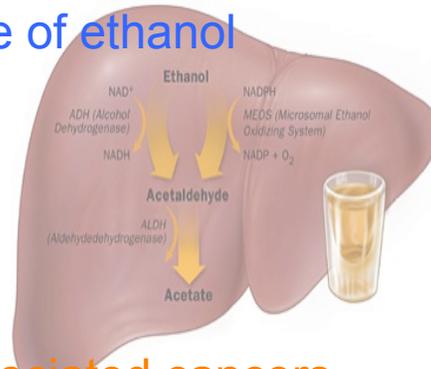
<b>Cell line</b>	<b># Genes</b>	<b>Toxicant</b>	<b>Reference</b>
HL-60 (Human AML Leukemia)	7114	6-TG, etoposide	Science 2014, 343, 80–84
A375(melanoma) HUES62 (ES cell) Human	18000	BRAF inhibitor	Nature 2015, 517, 583–588
Mouse ES	18000	6-TG	Nat. Biotechnol. 2014, 32, 267– 273.
K562 Human red blood cell leukemia	16000	DPT	Cell 2014, 159, 647–661
HepG2 Human liver cancer	18080	Triclosan	EST,2016;50(19): 10682-92

Generally CANCER cells and CANCER drugs

# Acetaldehyde and Arsenic Trioxide Toxicity

## Acetaldehyde

- Primary oxidative metabolite of ethanol
- Genotoxic
- Group 1 carcinogen (IARC)
- Likely underlies alcohol-associated cancers
- Mechanisms of toxicity are poorly understood



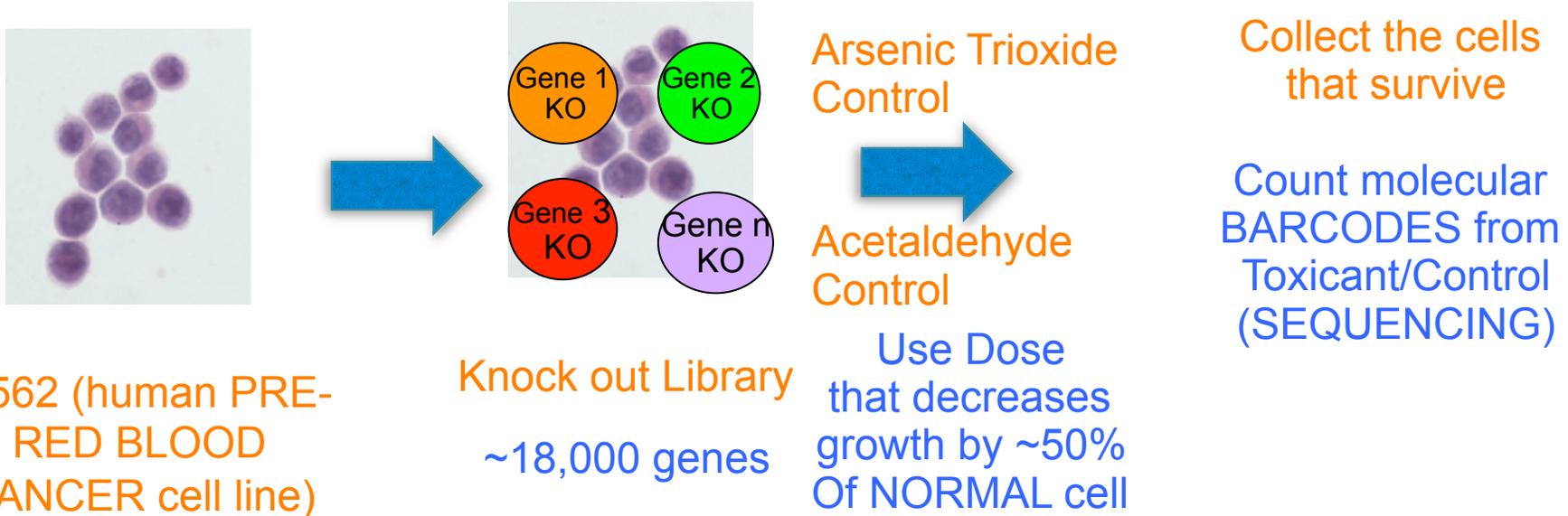
## Arsenic Trioxide

- Arsenic Trioxide used in blood cancer treatment – metabolised to usual As metabolites
- Arsenics - IARC type I carcinogen
- Drinking water exposure
- Mechanisms still controversial (depending on who you ask)

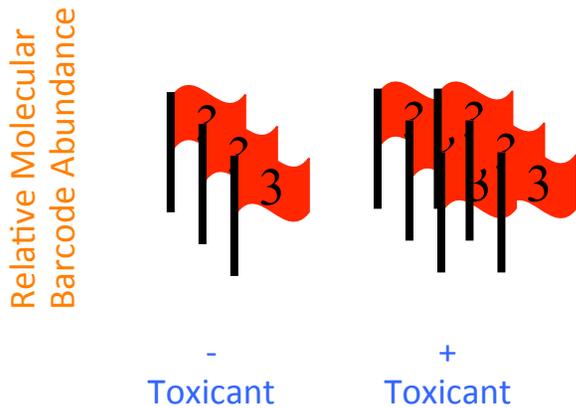
An abundance of mechanisms – there are too many mechanisms and it is unclear which are the most important

Can whole genome CRISPR give us some insights into the cellular mechanisms and maybe their relative importance?

# What did we do?

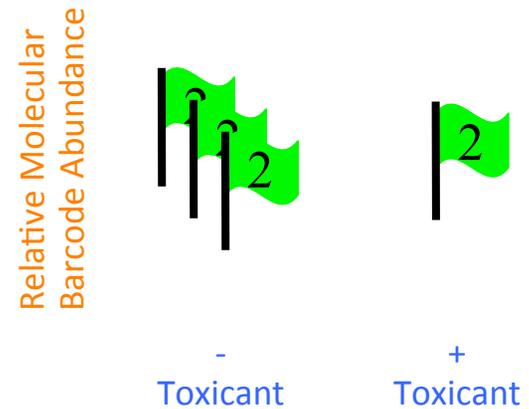


## Resistant Mutants



Some mutant CRISPR KO mutants will be enriched in presence of toxicant as compared to its frequency in control <sup>13</sup>

## Sensitive Mutants



Some mutant CRISPR KO mutants will be depleted in presence of toxicant as compared to its relative abundance in control

# Arsenic Trioxide whole genome CRISPR screen

(DATA SLIDE – PROVES WE ACTUALLY DID SOMETHING) Confirmatory Screen

## Top 10 - Whole Genome Screen Candidates

Log FC – relative abundance in treated vs control

Gene ID	Gene name	logFC	P Value	FDR
<b>KEAP1</b>	kelch-like ECH-associated protein 1	2.05	3.13E-59	6.87E-55
<b>SEPHS2</b>	selenophosphate synthetase 2	1.77	1.88E-23	2.06E-19
<b>EEFSEC</b>	eukaryotic elongation factor, selenocysteine-tRNA-specific	1.25	1.09E-17	7.97E-14
<b>PSTK</b>	phosphoserine-tRNA kinase	1.49	3.23E-17	1.77E-13
<b>KRT73</b>	keratin 73	-2.5	2.88E-15	1.26E-11
<b>ARID1B</b>	AT rich interactive domain 1B (SWI1-like)	1.42	5.44E-13	1.99E-09
<b>TXNDC17</b>	thioredoxin domain containing 17	0.9	3.20E-10	1.00E-06
<b>SLC6A12</b>	solute carrier family 6 (neurotransmitter transporter), member 12	0.92	8.66E-10	2.37E-06
<b>DCLRE1A</b>	DNA cross-link repair 1A	-1.1	5.52E-09	1.34E-05
<b>DLGAP5</b>	discs, large (Drosophila) homolog-associated protein 5	-1.1	2.91E-08	6.38E-05

**KEAP1** – NRF2 Partner – involved in oxidative stress  
**Selenocysteine metabolism**  
**DNA Repair**

FDR – False Discovery Rate

## Resistant

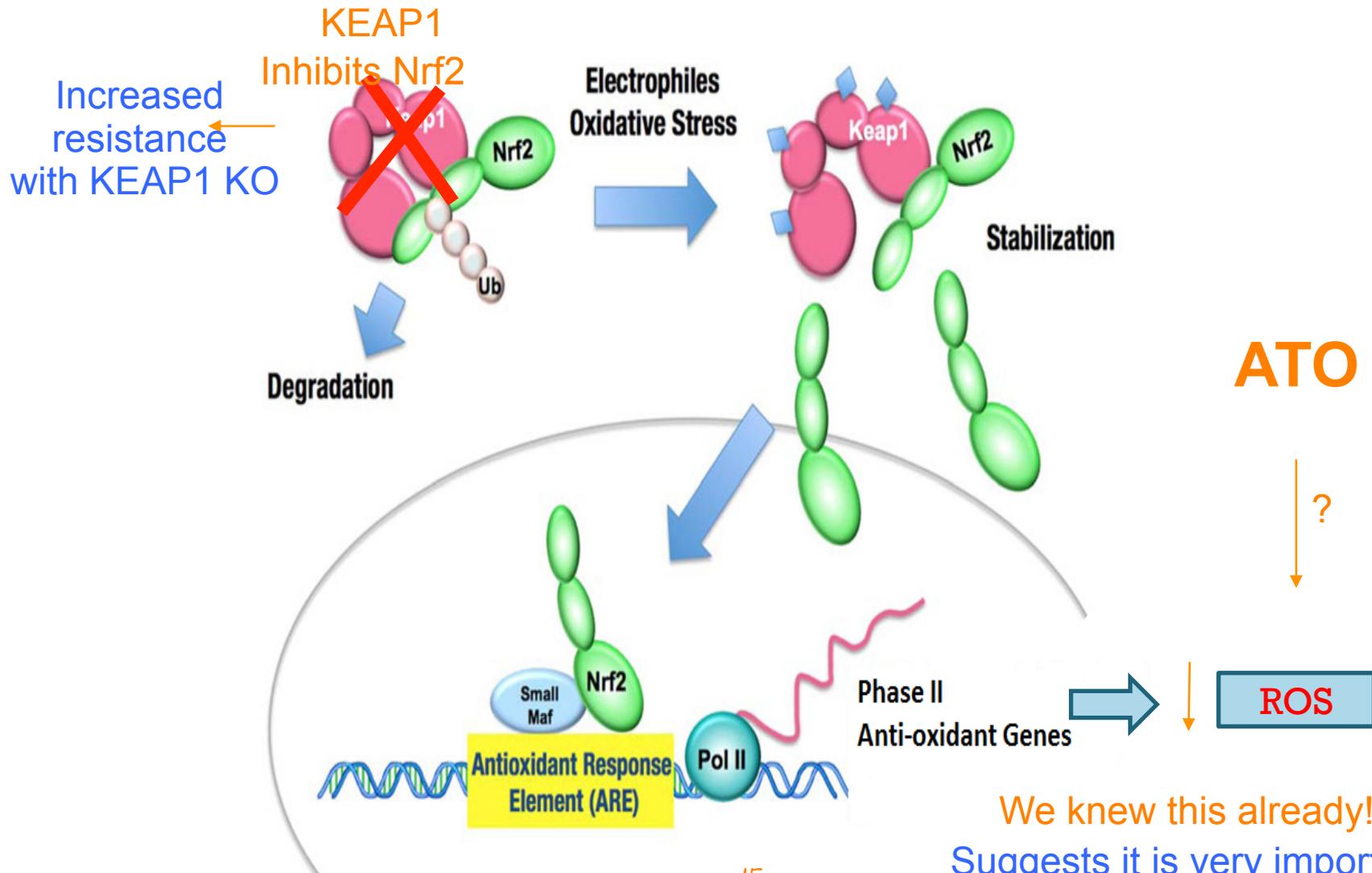
Gene	sgRNA	FDR	Log FC
KEAP1	8/8	0.000354	3.6
<b>TXNDC17</b>	8/8	0.000354	1.4
<b>PSTK</b>	7/7	0.000354	1.6
GFI1B	7/7	0.000354	1.1
SLC30A1	7/7	0.000354	1
FLCN	7/7	0.000354	1.3
EED	7/7	0.000354	0.7
RRAGC	8/8	0.000354	1
<b>EEFSEC</b>	6/7	0.000354	1.6
C15orf41	7/7	0.000354	0.6
SET	7/8	0.000354	0.8
<b>SEPHS2</b>	6/7	0.000354	1.4
<b>SEPSECS</b>	7/8	0.000354	0.7
DPH6	6/7	0.000354	0.8
NAA38	8/8	0.000928	0.7

## Sensitive

Gene	sgRNA	FDR	Log FC
ABCC1	8/8	0.000619	-2.1
MTPN	7/7	0.000619	-0.7
NCAPD3	6/7	0.000619	-0.7
DEPDC5	7/7	0.000619	-0.4
UBE2H	7/8	0.000619	-0.6
NPRL2	6/6	0.000619	-0.3
CNOT2	7/7	0.000619	-0.6
NDE1	7/8	0.000619	-0.7

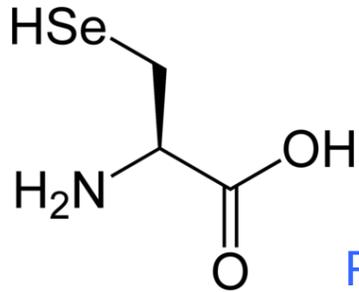
# ATO Toxicity: Reactive Oxygen Species

Nrf2 primary anti-oxidant transcription factor – KEAP1 is REPRESSOR of NRF1



We knew this already!  
Suggests it is very important  
in ACUTE short term toxicity

# Selenocysteine Incorporation into Proteins Increases Susceptibility to Arsenic Trioxide



Selenocysteine  
The 21<sup>st</sup> amino acid

Selenium  
Previously known As binds Se

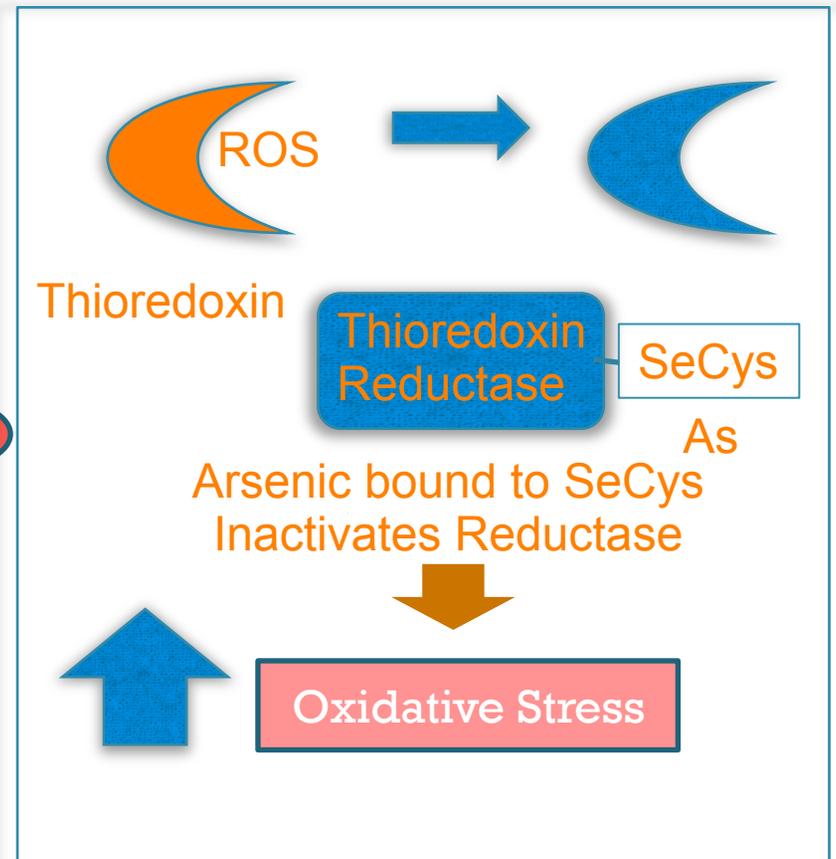
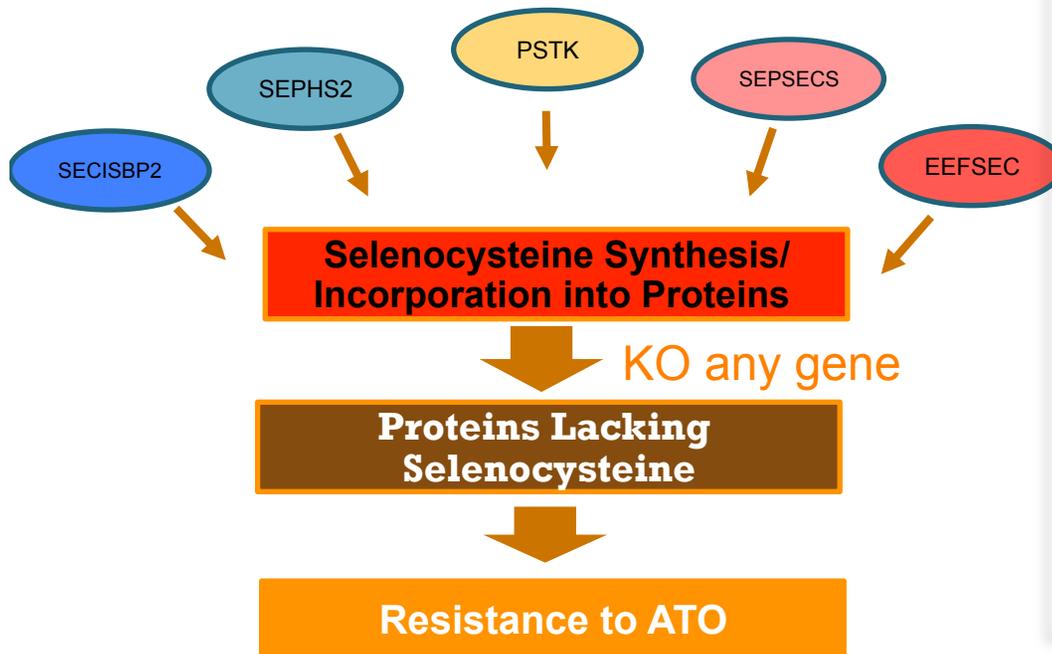
Specialized, totally cool, system for putting them in proteins

Many of these proteins involved in response to oxidative stress

## What did we find?

Loss of any gene needed for SeCys  
Incorporation in proteins leads to RESISTANCE

THIS IS NEW AND KINDA UNEXPECTED

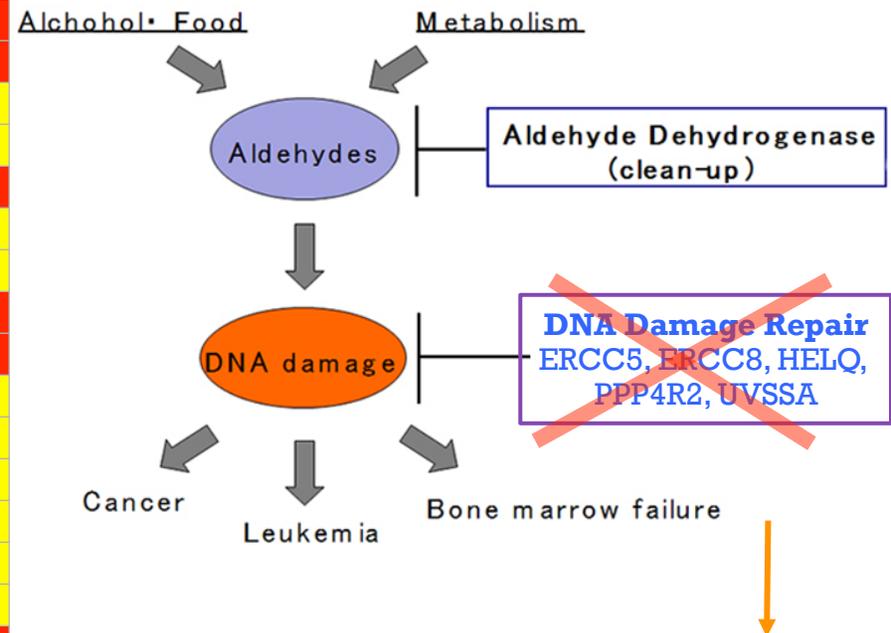


# Blocking DNA Repair Increases Susceptibility to Acetaldehyde

## Validated Acetaldehyde Susceptibility Candidates

Gene	sgRNA sequence	FDR
OVCA2	GCCGAGCTCGTGTGCCTCAG	4.78E-12
OVCA2	GACACCAAGAGGATAAACCG	8.91E-10
OVCA2	TGTCTCACCGAAGTCTGATC	8.91E-10
HELQ	TGCTGGAATAGATACTATTG	1.39E-08
HELQ	GGAGTTGCCTATCACCACAG	1.20E-07
OVCA2	CGGGGCTTCCGTGAGAAGAC	9.18E-07
HELQ	GTTGACAGCAAAGCTGAGAA	9.22E-07
HELQ	TCCTGATCACTTGGTAGCAT	9.73E-07
OVCA2	TTCCAATGCGGAGAAAACGT	9.73E-07
OVCA2	GGGCTTCCGTGAGAAGACCG	1.66E-06
HELQ	TGAAGTATATCATCCAATCA	4.16E-06
ERCC8	GCCAAGATATAGTCATAACG	0.000198
ERCC5	TTAATGGCTGAAAGAGTCCG	0.0003243
ERCC8	CAGTGGTATCCTCATGACAC	0.0003705
PPP4R2	CATGACAAAGAAACTGATCC	0.0003731
PPP4R2	TCACATTGTTTCTCCAGTCT	0.0005561
OVCA2	GAGGGCGCCAGATCAGACTT	0.0008455
HELQ	ACCAATGCTACCAAGTGATC	0.0022578
OVCA2	CAACTGGCCAGCCAATTTCC	0.0025663
ERCC8	TGTAAAGCAGTGTGTTCCAT	0.0028369
NANS	GAGATCGGCCAGAACCACCA	0.020249
NANS	TATGTGACGTTCCAACACCT	0.0524015
FBXO40	AACCTCCGGCTTAATGGCAA	0.0648084
UVSSA	AATTGAATCCTGCTTGACGG	0.0769292
HELQ	CTTATCTCTTACCTTCGAGC	0.0776389

## Acetaldehyde-induced DNA Damage in Blood Precursors



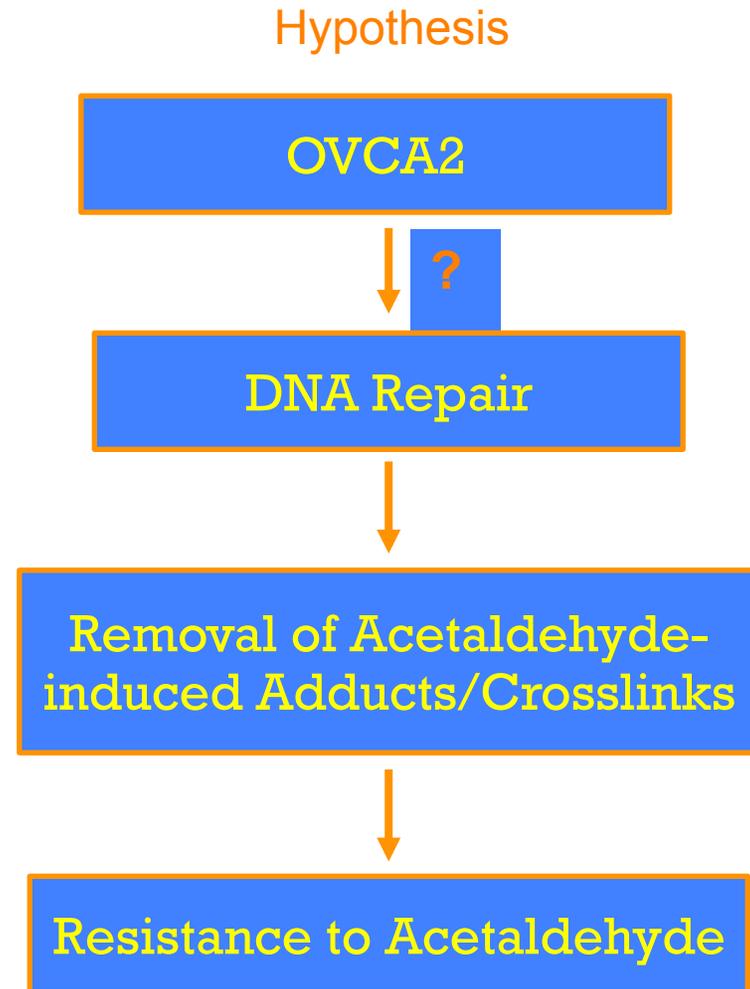
Increased Susceptibility to Acetaldehyde Toxicity

# Potential Role of *OVCA2* in DNA Repair

## *OVCA2*

- Ovarian tumor suppressor candidate 2
- Strongest candidate in our screen
- Validated with 8 sgRNAs out of 8 in a secondary screen
- Loss-of-function increases sensitivity to Acetaldehyde
- Predicted hydrolase (esterase) activity
- Downregulated in multiple cancer types
- Yeast homolog (*FSH1*) is essential for growth in ethanol media
- What the heck is it?

Something NEW, and blue of course



# What did we learn?

- Oxidative stress is (the) major player in acute arsenic toxicity
- Selenium metabolism is important in acute arsenic toxicity
- DNA damage is important in acute acetaldehyde toxicity
- Unexpected insight into OVCA2 – a new DNA repair gene?

## Implications?

- Help fill in adverse outcome pathway for Arsenic



- Suggest selenium deficiency could decrease acute effects and selenium sufficiency could increase acute effects –Public Health Implications?
- Acetaldehyde – confirm genotoxic mechanism – suggest DNA damage also important for Acute toxicity
- OVCA2 is tumor suppressor gene<sup>19</sup> – maybe role in DNA repair explains why



# Acknowledgments



**Luoping  
Zhang**

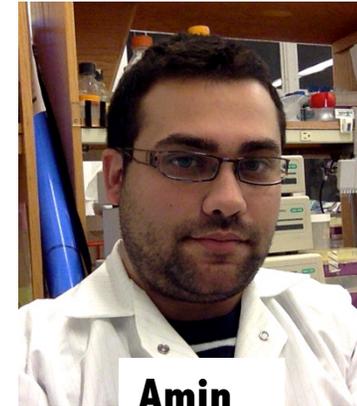


**Martyn**



**Mani**

**Scientist**



**Amin**

**Graduate  
Student**

**UF** Center for Environmental &  
Human Toxicology  
College of Veterinary Medicine



**UC BERKELEY  
SUPERFUND  
RESEARCH PROGRAM  
SCIENCE FOR A SAFER WORLD**



**Quan Lu  
Collaborator  
Harvard**

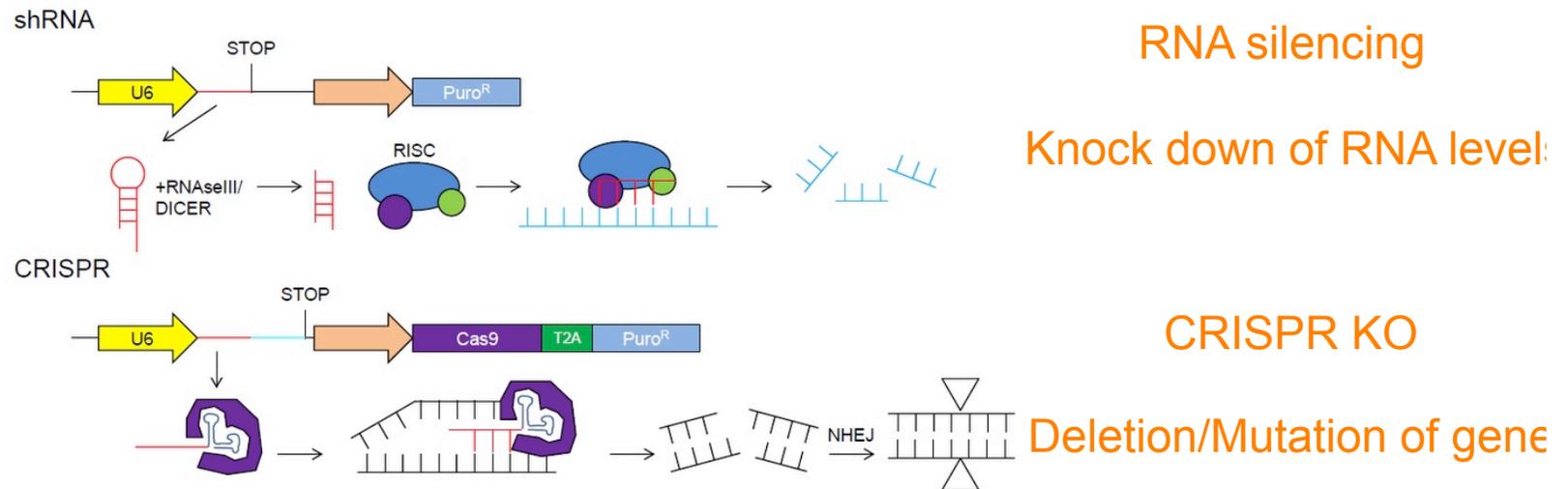


**Bioinformatics**

**UF** UNIVERSITY of  
FLORIDA

# How does whole genome CRISPR KO compare to other genome wide functional approaches?

Two recent papers compared RNA silencing with CRISPR KO



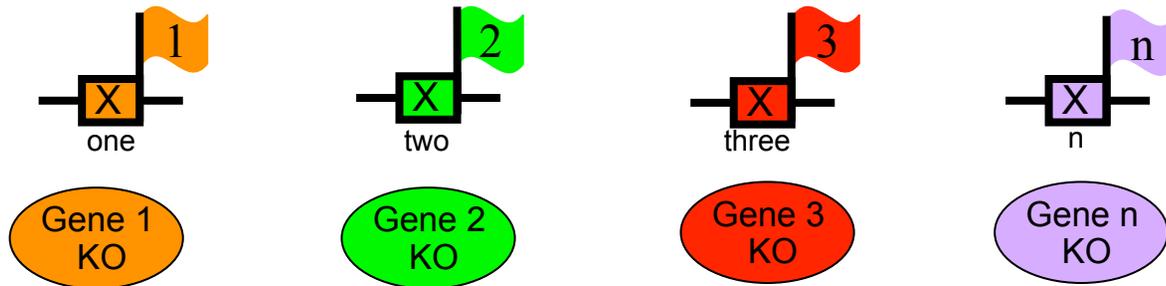
Opposite conclusions

One paper concluded CRISPR is superior  
Other paper found shRNA more reliable

1. Evers B, Jastrzebski K, Heijmans JPM, Grenrum W, Beijersbergen RL, Bernards R. CRISPR knockout screening outperforms shRNA and CRISPRi in identifying essential genes. *Nat Biotech.* 2016;34(6):631-3. doi: 10.1038/nbt.3536 <http://www.nature.com/nbt/journal/v34/n6/abs/nbt.3536.html> - supplementary-information.
2. Housden BE, Perrimon N. Comparing CRISPR and RNAi-based screening technologies. *Nat Biotech.* 2016;34(6):621-3. doi: 10.1038/nbt.3599.
3. Morgens DW, Deans RM, Li A, Bassik MC. Systematic comparison of CRISPR/Cas9 and RNAi screens for essential genes. *Nat Biotech.* 2016;34(6):634-6. doi: 10.1038/nbt.3567 <http://www.nature.com/nbt/journal/v34/n6/abs/nbt.3567.html> - supplementary-information.

# Key concepts/confusions in genome wide CRISPR screening

- “*In vitro*” - Using cell lines with all the accompanying issues and caveats –
  - e.g. metabolism, immortalized cells, toxicokinetics
- Any or every gene can be targeted in your library BUT
- Only a single gene is inactivated (KO) in each cell
- A pool (library) of individual mutant cells each containing a KO of single gene represents all genes



- The gene on each chromosome are KOd but the mutations are different on each chromosome
- Each cell with a KO is TAGGED/FLAGGED with unique DNA barcode (sgRNA) so you can see it in a crowd (pool)
- Generally measuring growth advantage or disadvantage of mutant cells in response to environmental exposure such as toxicant

