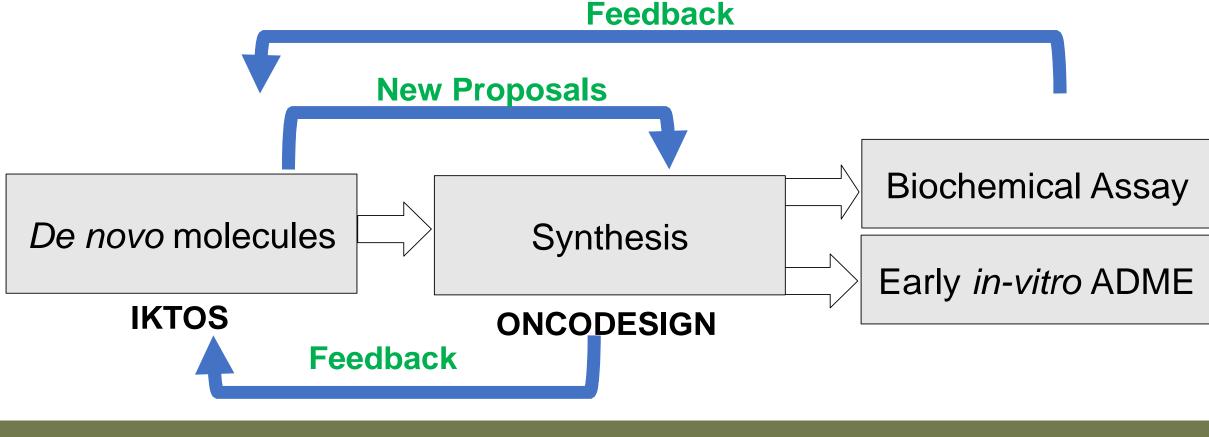


### BACKGROUND

- Proto-oncogene serine/threonine-protein (PIM-1) kinase is implicated in multiple human cancers and is an attractive therapeutic target.
- Small-molecule inhibitors for this target have shown promising anti-cancer activity in clinical trials. However, side effects due to insufficient selectivity have proven problematic; further research is needed to overcome these issues.
- Oncodesign and Iktos have collaborated on the de novo design of novel PIM-1 kinase inhibitors, utilizing Oncodesign's expertise with PIM-1 and implementing **Iktos's** structure-based generative artificial intelligence (AI) technology.



## **OBJECTIVES**

- Use generative AI to generate and identify new PIM-1 kir inhibitor hits with activity <1 µM, freedom-to-operate (F and good in vitro ADME properties.
- Use this as a case-study to demonstrate the benefits and capabilities of the generative AI technology developed at Iktos.

## **STRUCTURE-BASED (SB) GENERATIVE AI**

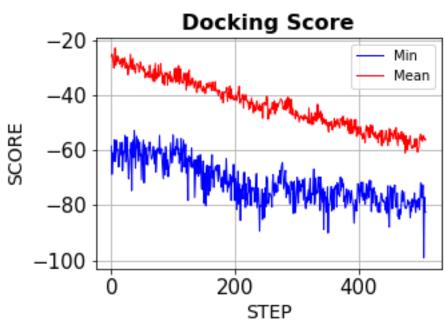
Iktos has developed a state-of-the-art SB generative AI pipeline with the goal of overcoming the shortcomings of traditional virtual screening processes. This pipeline generates new molecules with high predicted activity on the protein target while also maintaining critical drug-like characteristics. By maximizing 3D scores and/or interactions with key pocket residues, this technology increases the odds of identifying novel molecules with desired properties earlier in a drug discovery project.

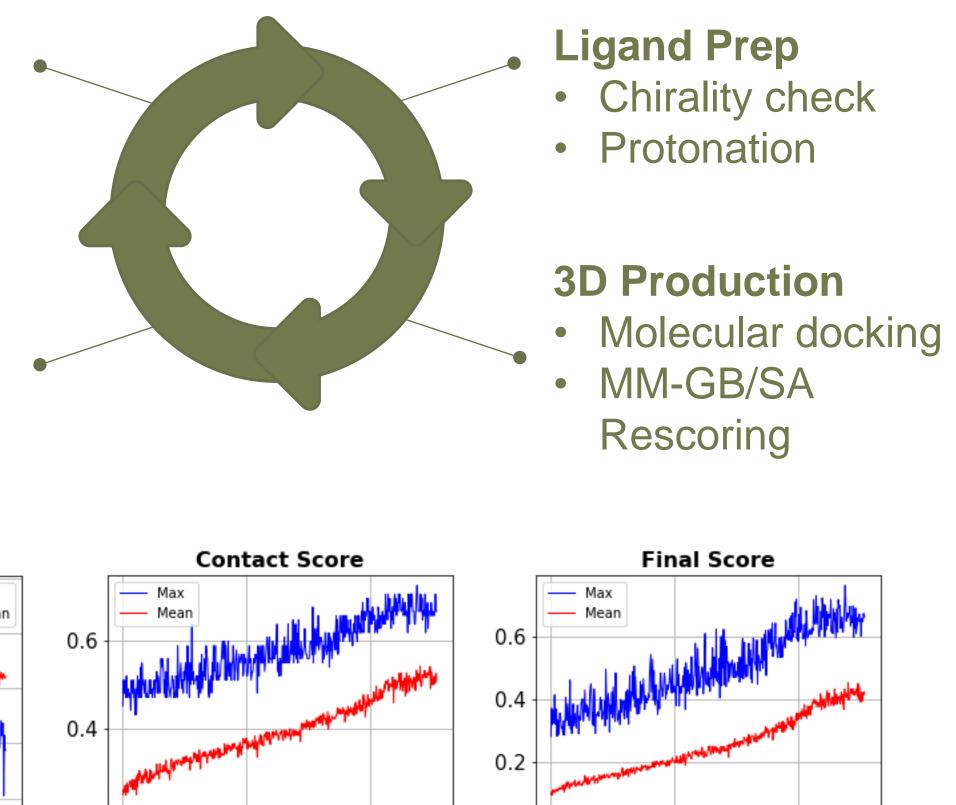
### **AI Generation**

Batch of 128 SMILES

### Score

- Pose filtering, clustering, scoring
- Proprietary <u>Contact</u> <u>Score</u>
- Overall score computation





200

STEP

400

## Discovery of Novel Inhibitors of PIM-1 Kinase Enabled by Generative Al oncodesign [Rohit Arora, Anna Kriukova, Maud Jusot, Nicolas Devaux, Brice Hoffmann, Christopher Housseman, Quentin Perron]<sup>1</sup> Vector of innovation

# [Yann Lamotte, Pascaline Jacquemard, Quentin Janet, Anthony Martinez, Stéphane Sautet, Alexis Denis]<sup>2</sup>

<sup>1</sup>Iktos SAS & Iktos Inc. (<u>www.iktos.ai</u>); <sup>2</sup>Oncodesign (<u>www.oncodesign.com</u>)



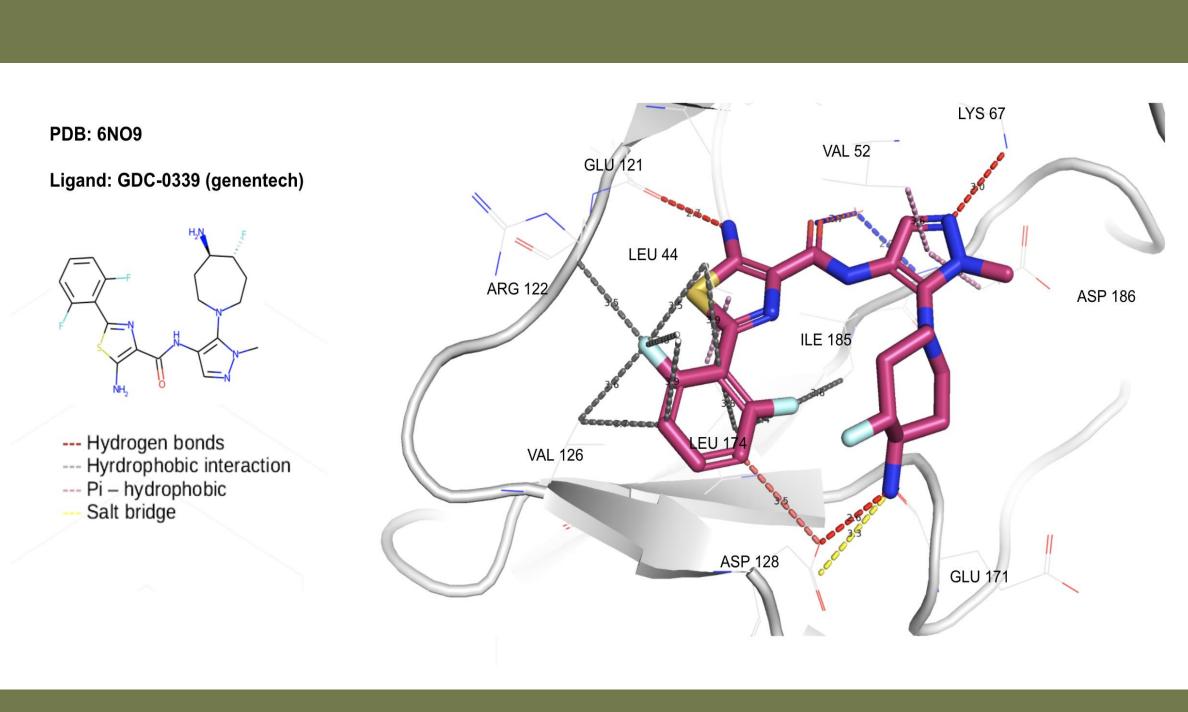
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STEP

## **GENERATIVE AI SETUP**

- Generator (LSTM) trained on CHEMBL dataset
- Reference PDB structure for docking: 6NO9
- Murcko scaffolds of known PIM-1 inhibitors forbidden during generation
- Reward functions:
  - Molecular descriptors (MW, cLogD, TPSA, HBD/HBA, QED, PFI)

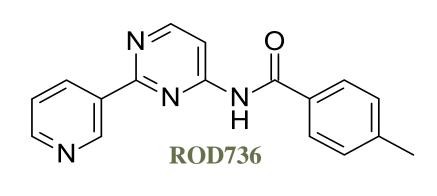


3D scores: Docking and Contact

## **GENERATION AND SYNTHESIS**

### First Generation Synthesis

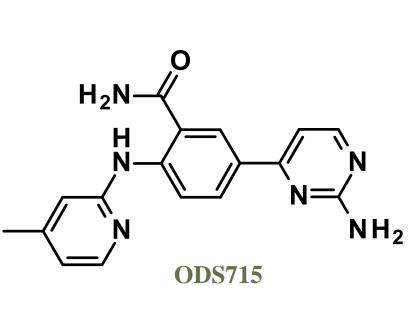
- 5 molecules synthesized; 2 actives + 3 inactives. Tested on PIM-1 and co-target PIM-3. • From scratch  $\rightarrow \sim 5 \,\mu$ M activity within first round of generation and synthesis of 5 molecules.



	PIN	1-1	PIM-3					
	@10µM	@1µM	@10µM	@1µM				
ROD736	69%	32%	88%	22%				
ODS587	45%		71%	69%				

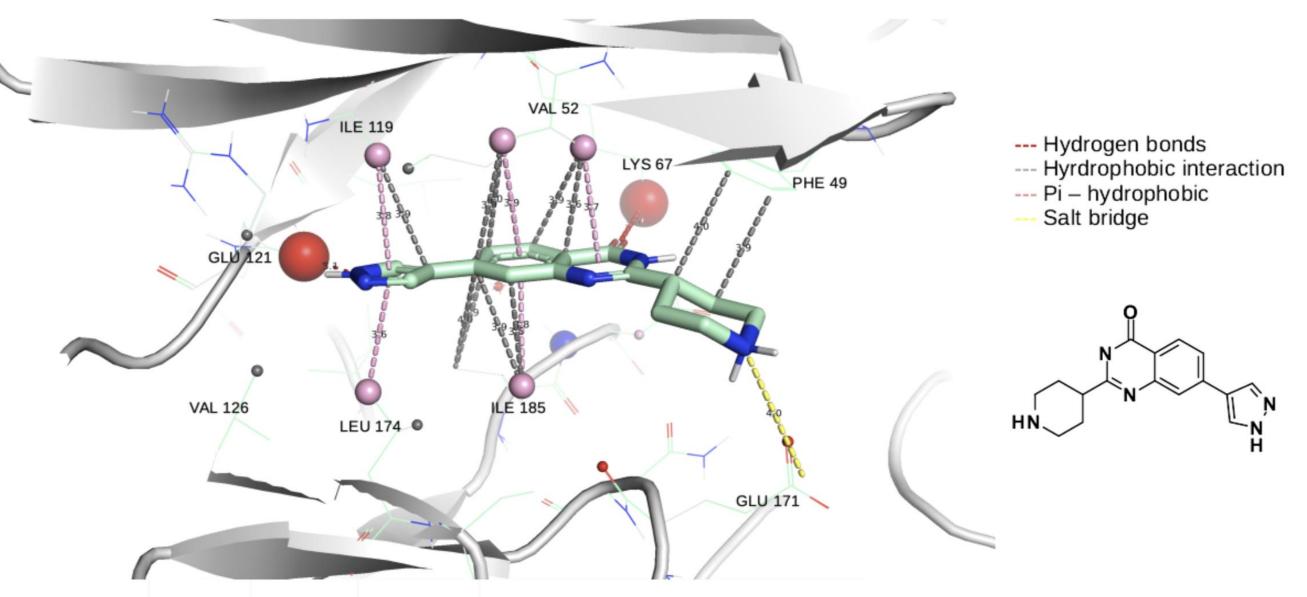
### Next Generation Synthesis

- 4 molecules synthesized; 2 actives + 2 inactives. Tested on PIM-1 and co-target PIM-3. Early in vitro ADME data generated.
- ~ 5  $\mu$ M  $\rightarrow$  ~ 1  $\mu$ M activity with synthesis of total 9 molecules.



	Inhibition						
-	PIM		PIM-3				
-	@10µM	(	201μM	@10µM		@1µM	
ODS715	DS715 72%		37%	82%		26%	
ODS785	88%	50%		90%		54%	
[	ADME Data						
-	ChromlogD		Sol. PBS/Fassif		Clint r/h		
ODS715	1.9		218/228		<5/9		
ODS785	0		221/250		54/27		

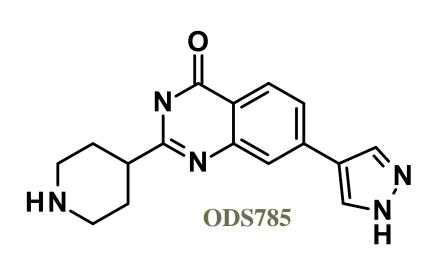
## Binding Mode of ODS785 Identified

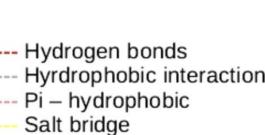


## Experience this in Virtual Reality **Manome**

### Inhibition







- Binding mode reveals that this compound does not explore the sub-pocket PIM-1 which is explored by the crystal ligand.
- New generations and launched synthesis to achieve this.





## **CONCLUSIONS AND TAKEAWAYS**

### **Technology: Generative Al**

- Iterative Design-Make-Test (DMT) cycle crucial to success







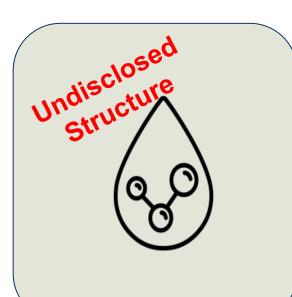
## **NEW HITS IDENTIFIED**

We have identified a new hit using this approach which was active against PIM-1 and PIM-3 and had good ADME properties

• Binding mode analysis revealed that this molecule explored the same sub-pocket as the crystal ligand but had a different scaffold

• Further analysis of this compound is ongoing

### $IC_{50} = 1.08 \ \mu M (PIM-1)$ $IC_{50} = 535 \text{ nM} (PIM-3)$



ChromlogD = 2.7**Sol. PBS/Fassif = 205/239** Clint r/h = 103/53

### Hit discovery

• Compound with activity  $\leq 1\mu M$  from new scaffolds identified • Good preliminary ADME properties (logD, solubility, stability)

• Patent busting: Forbid multiple scaffolds during generation Multi Parameter Optimization (MPO)

• Easy to create diversity around a hit

### CONTACT

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## ACKNOWLEDGEMENTS

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## **IKTOS PRODUCTS**

# **makya**

Makya is a chemistfriendly SaaS platform for Al-driven *de novo* 2D drug design focused on MPO. Ask us about its features or visit makya.ai

# **A spaya**.ai

Spaya is an Al-powered platform to discover and prioritize retrosynthetic routes for your molecules. Ask us about its features or visit spaya.ai to get started for free