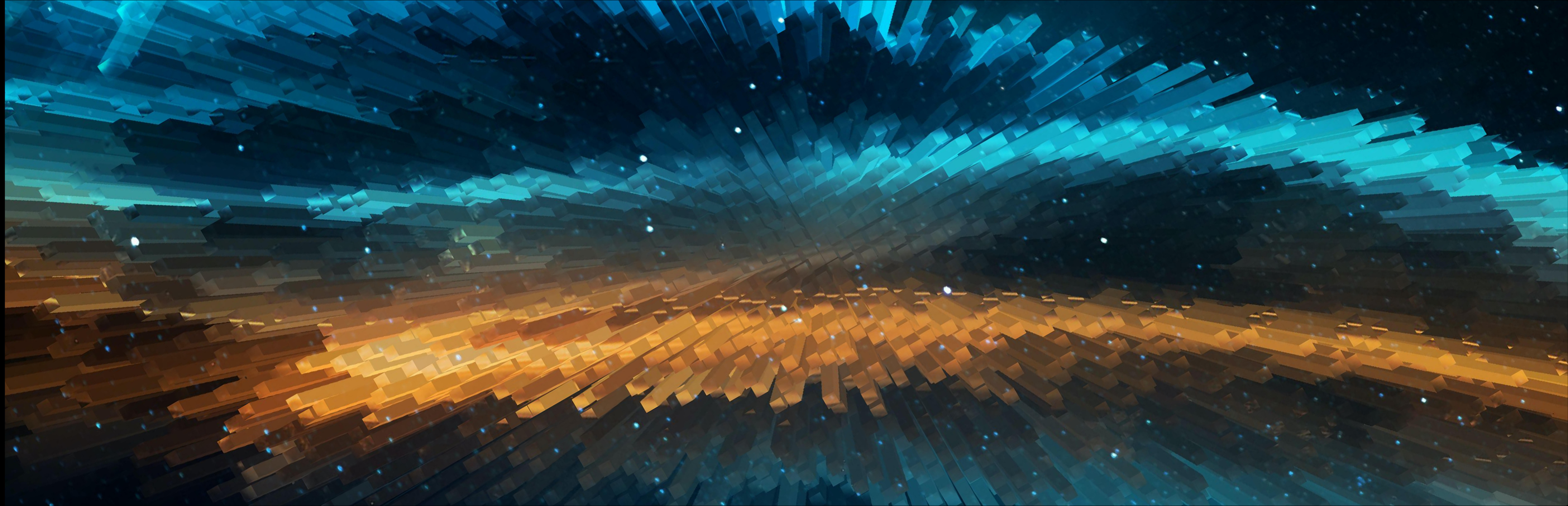


技术联想 驱动行业智能化变革

Tech-Powered Lenovo Drives
Intelligent Transformation



机械化时代

Age of Steam Engine

1760s-1840s



信息化时代

Age of Information

1950s-2000s



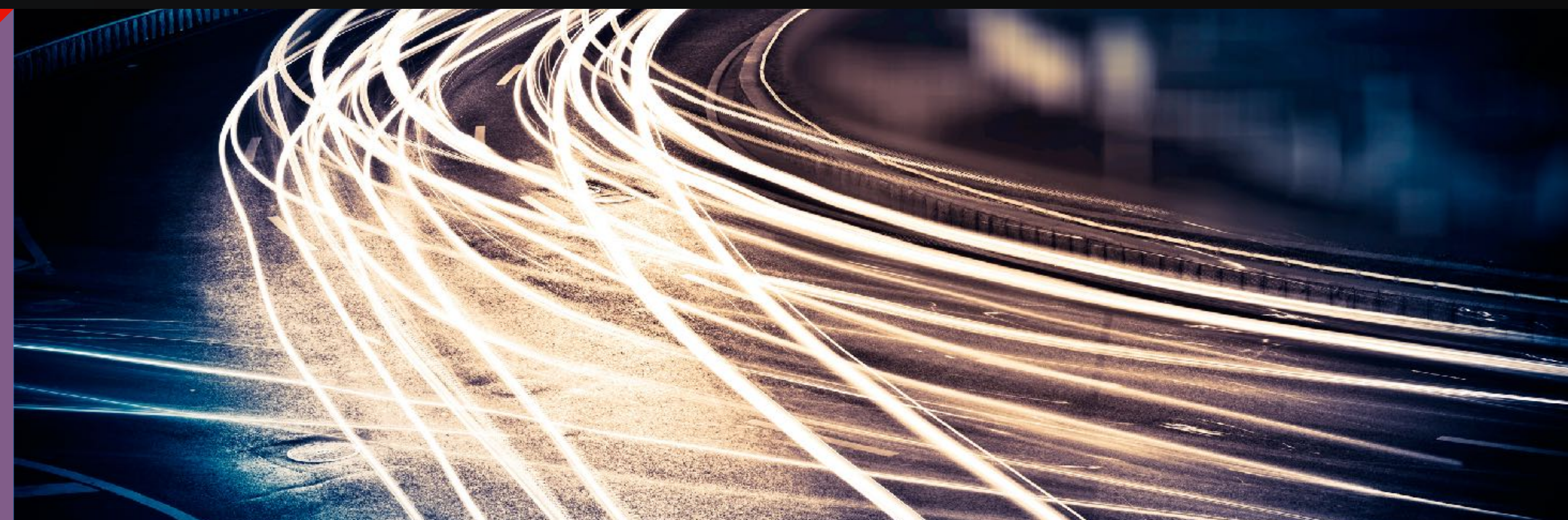
技术驱动行业变革的历史 Tech-Powered Industrial Revolution



1870s – 1910s

电气化时代

Age of Electricity



2010s-?

智能化时代

Age of Intelligence



智能物联网

Smart IoT



智能物联网：AR与计算机视觉技术

Smart IoT : AR & Computer Vision Technology



智能物联网： AR与计算机视觉技术

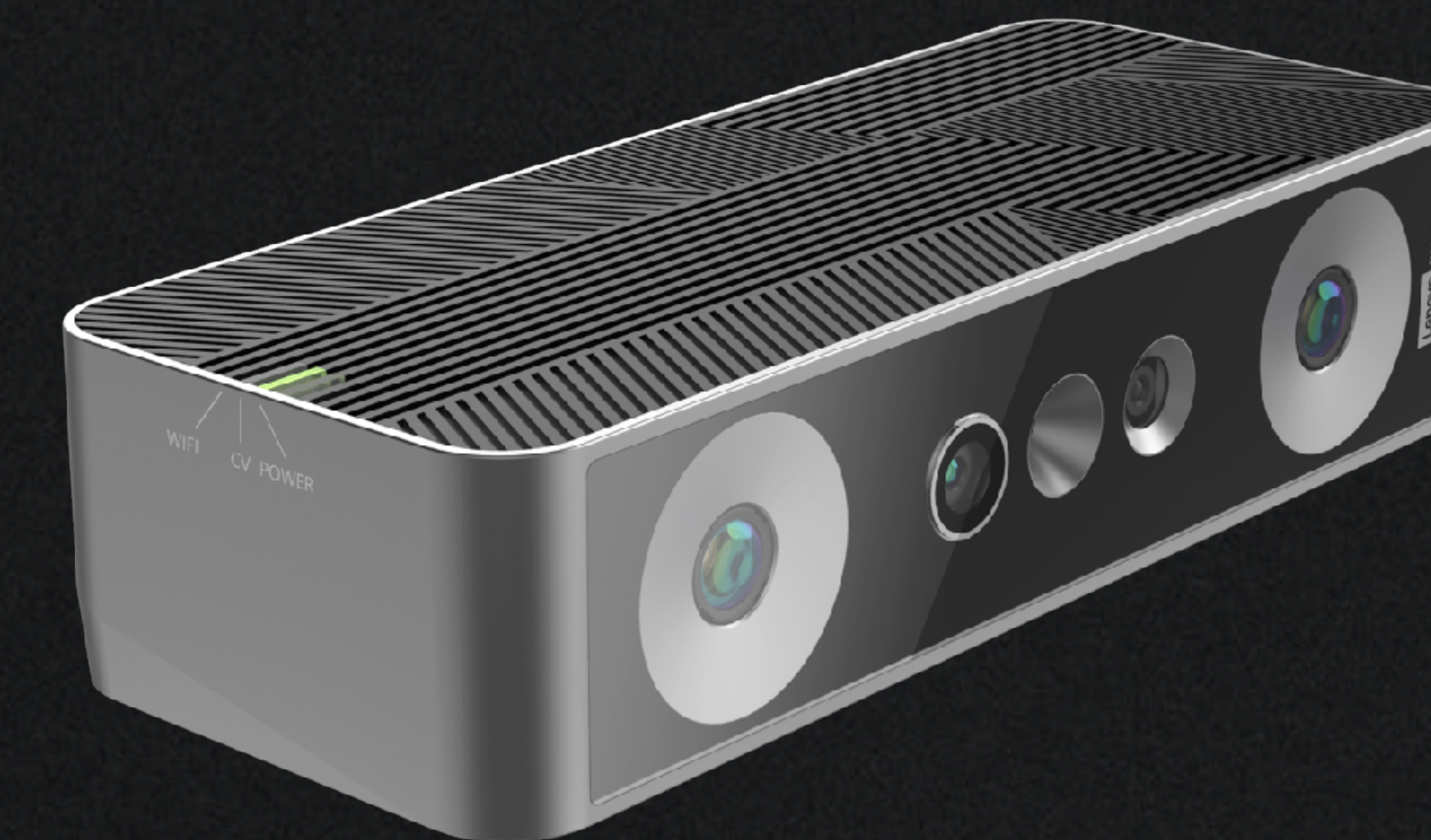
Smart IoT: AR & Computer Vision Technology

晨星AR眼镜G2
daystAR G2



- 双目SLAM 6自由度定位与姿态估计
Stereo SLAM and 6DoF Position Estimation
- 实时3D Mesh 建模
Realtime 3D Mesh Reconstruction
- 三维弱纹理物体识别
3D Feature-less Object Recognition

晨星3D视觉相机
daystAR 3D CV Camera



智能物联网： AR与计算机视觉技术

Smart IoT: AR & Computer Vision Technology

- 双目SLAM 6自由度定位与姿态估计
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3D Feature-less Object Recognition



智能基础架构

Smart Infrastructure



智能基础架构：AIOps智能运维技术

Smart Infrastructure: AIOps (Artificial Intelligence for IT Operations)



Artificial Intelligence for IT Operations (AIOps)

数据中心AI赋能异常检测及故障定位

AI-driven Anomaly Detection & Fault Location in Data Center

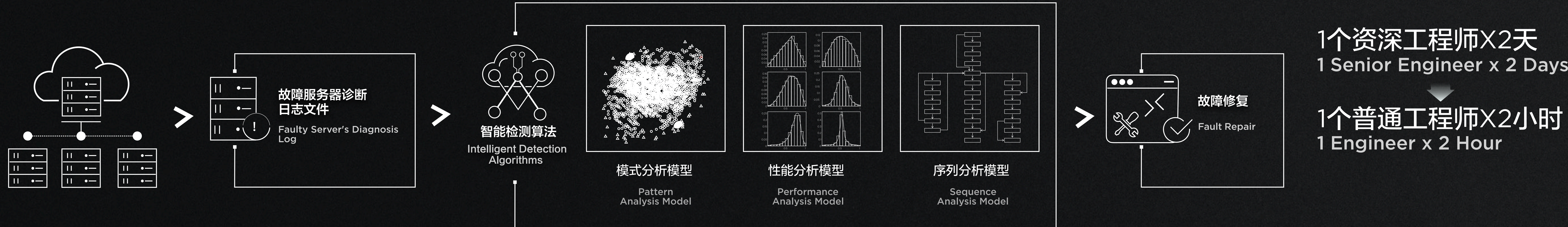
百万行日志
Millions of Log Lines

1个资深工程师X2天
1 Senior Engineer x 2 Days



数据中心AI赋能异常检测及故障定位

AI-driven Anomaly Detection & Fault Location in Data Center





行业智能

Smart Verticals



行业智能：基于增强学习的智能排产优化算法

Smart Verticals : SPS (Smart Production Scheduling)

based on Deep Reinforcement Learning



基于增强学习 的智能排产优化算法

SPS (Smart Production
Scheduling) based on Deep
Reinforcement Learning

人机大战 Human vs. A.I.

1997
深蓝 Deep Blue



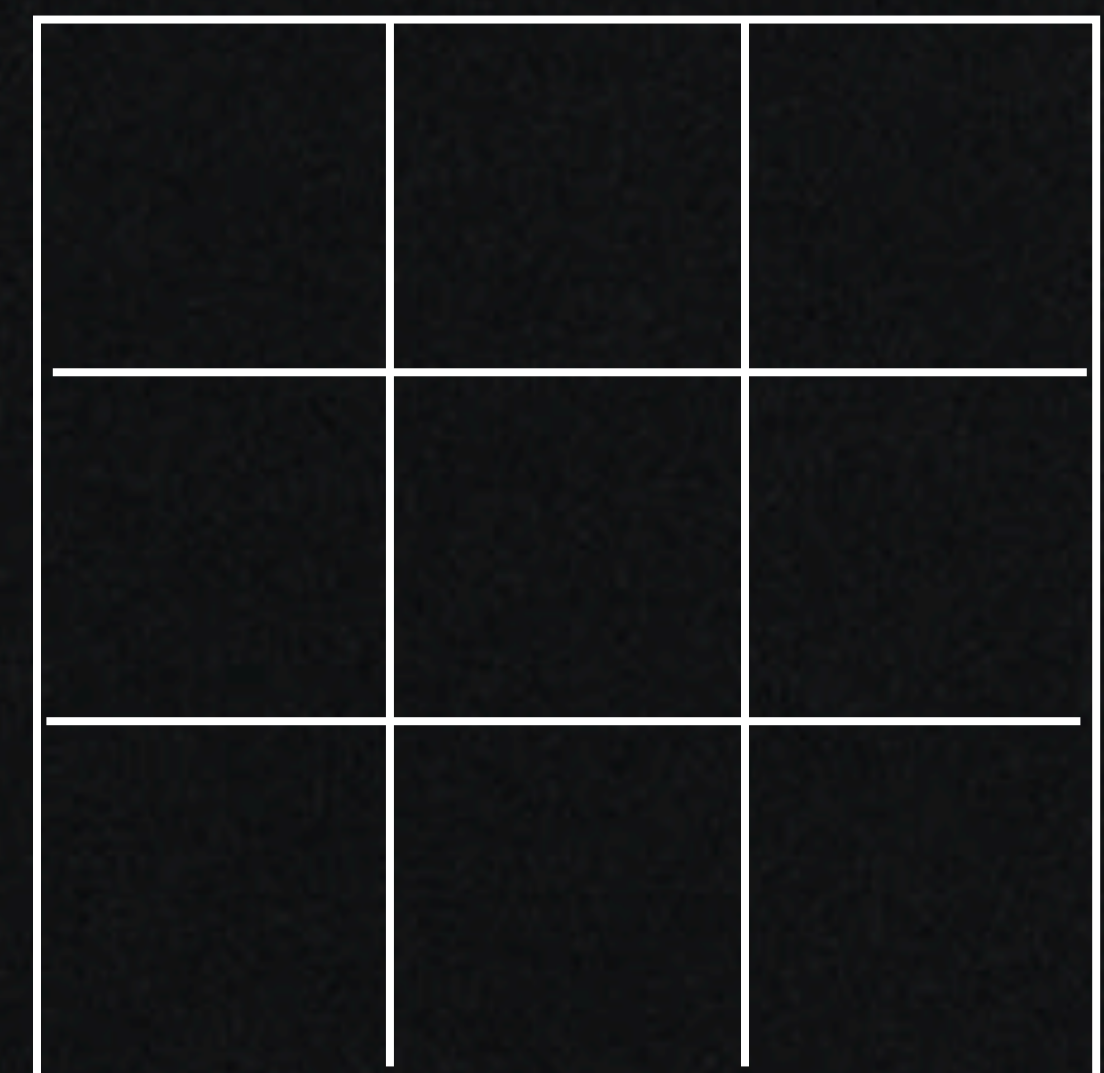
2016
阿尔法围棋 AlphaGO



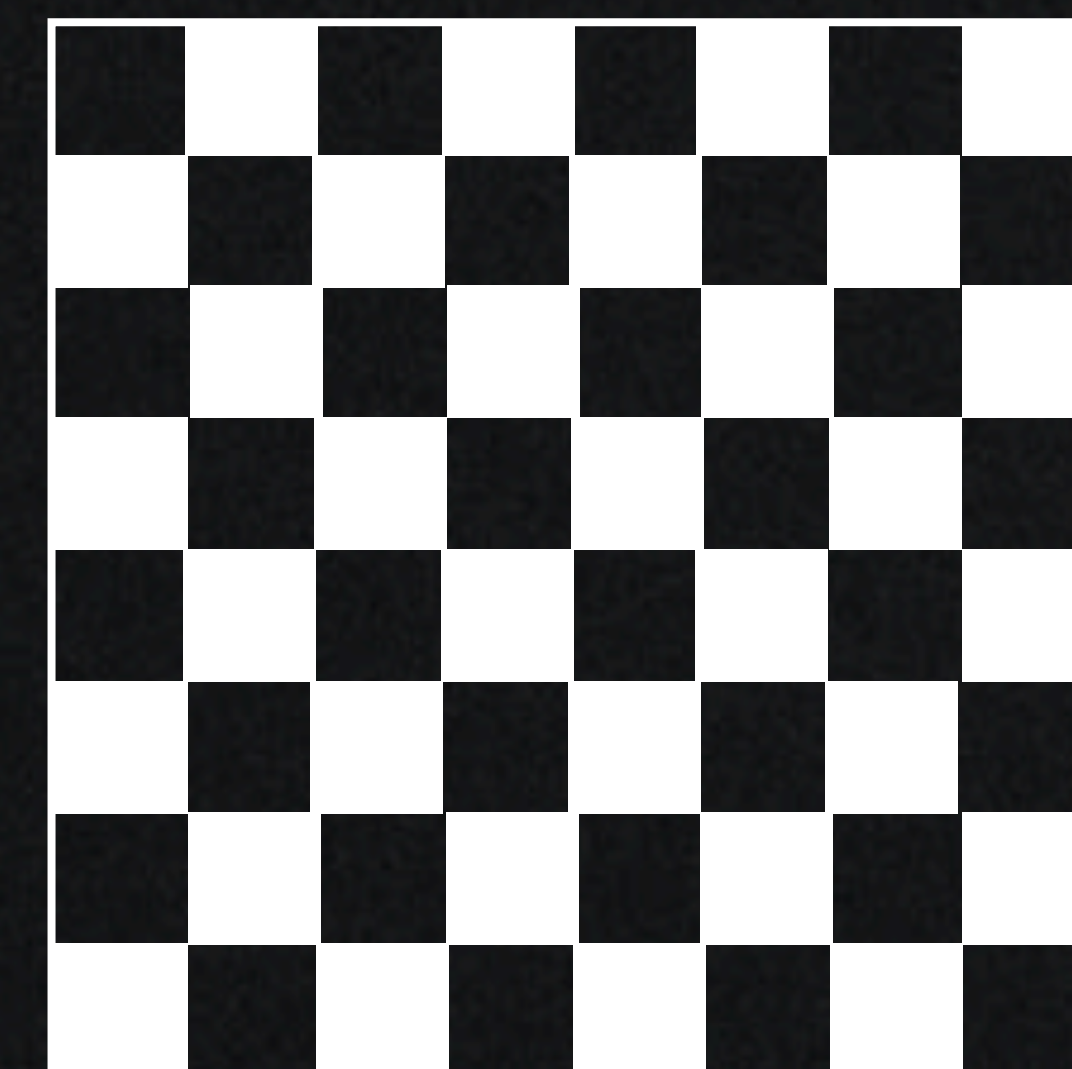


博弈树复杂度

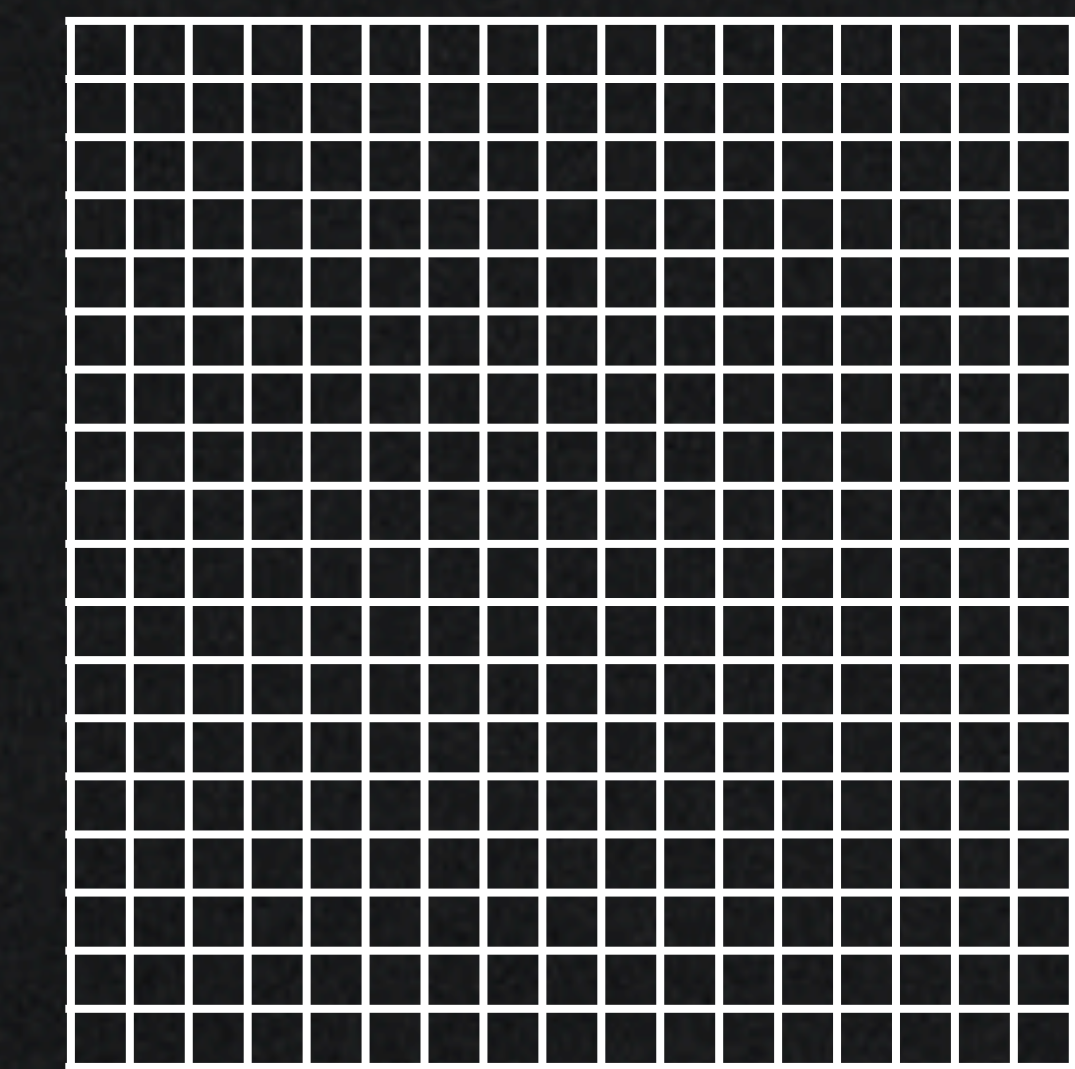
Game Tree Complexity



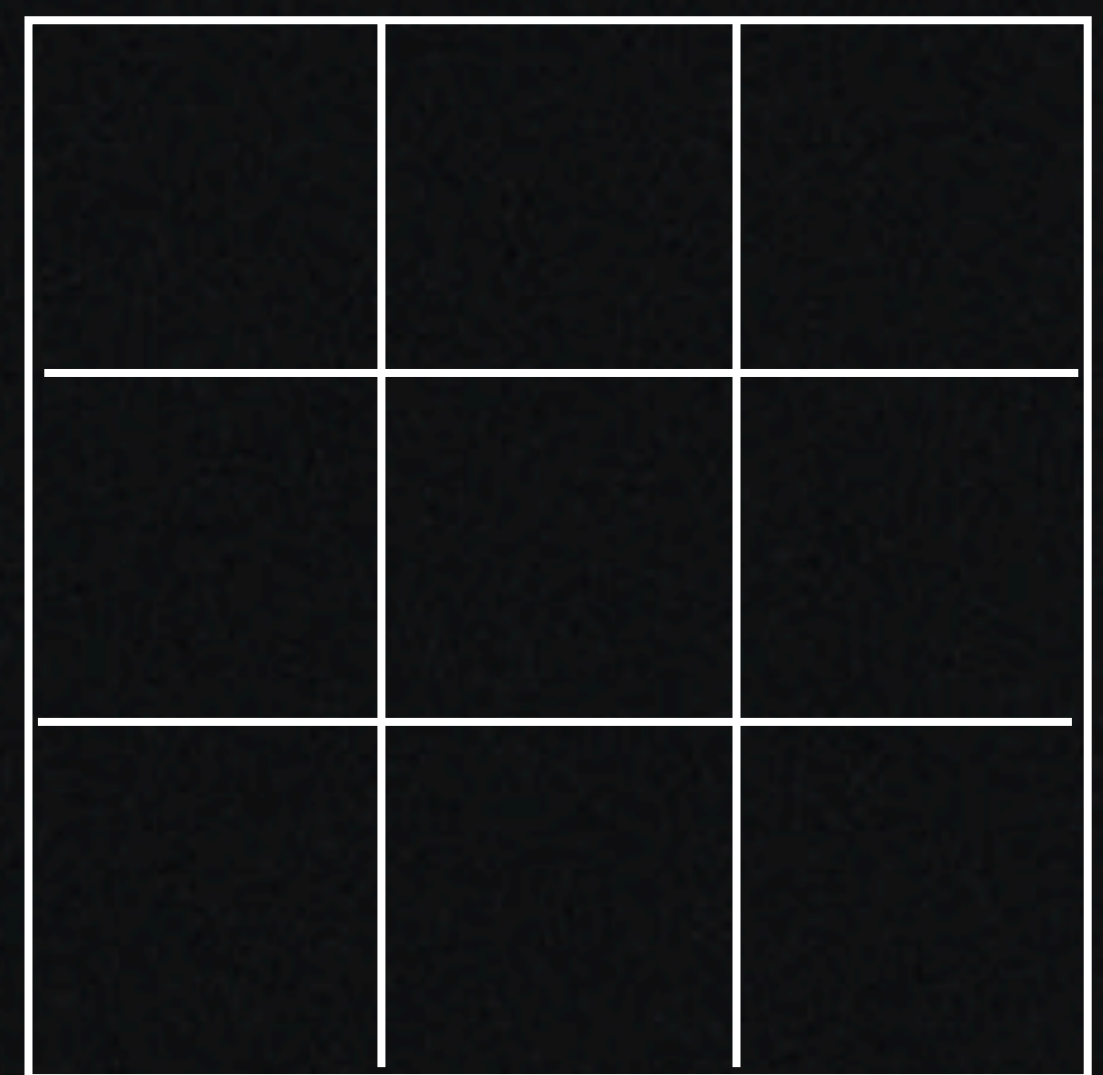
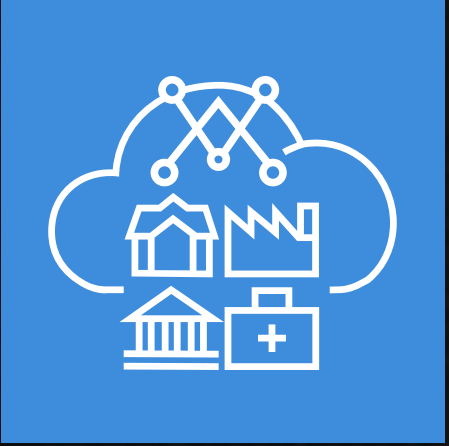
井字棋
TIC-TAC-TOE



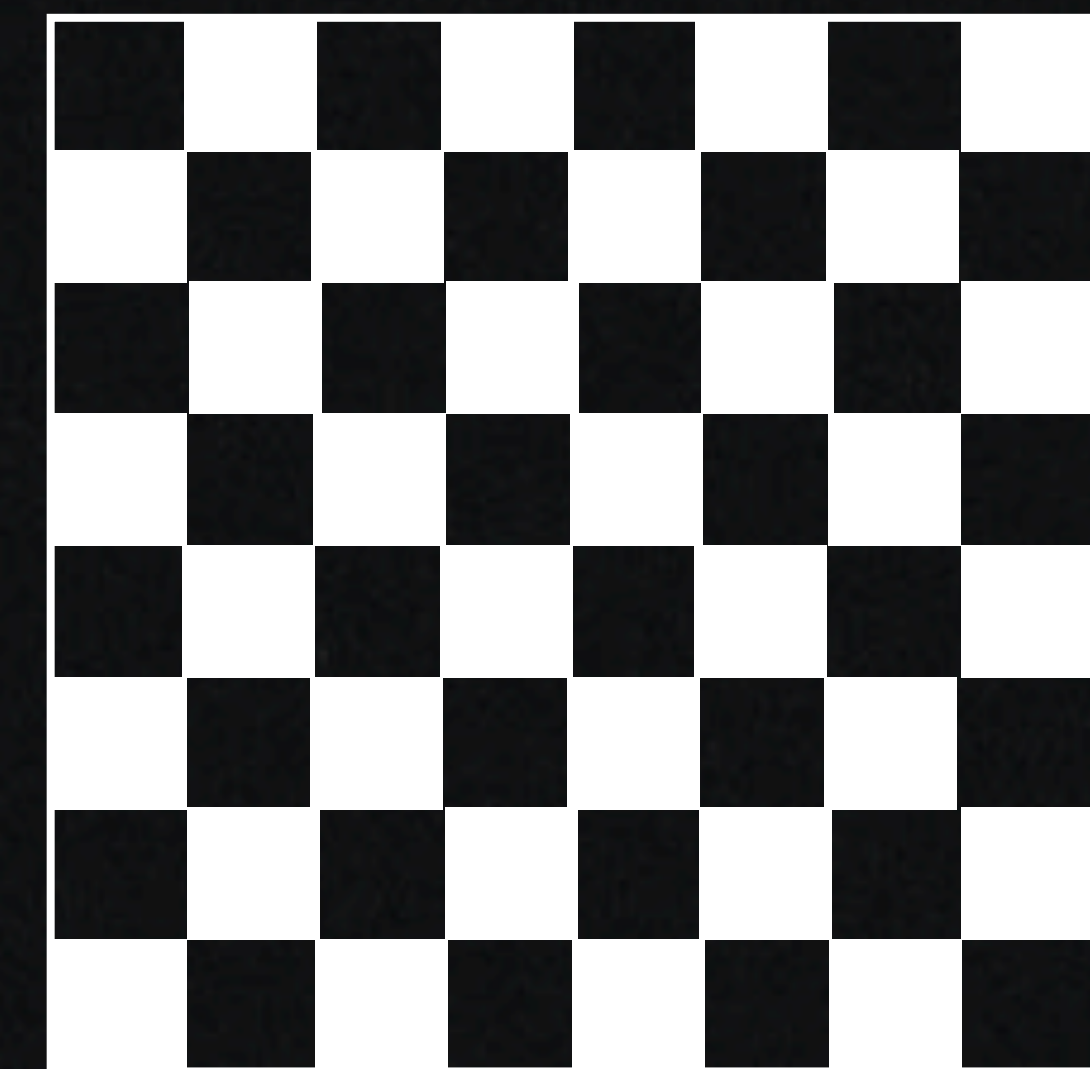
国际象棋
CHESS



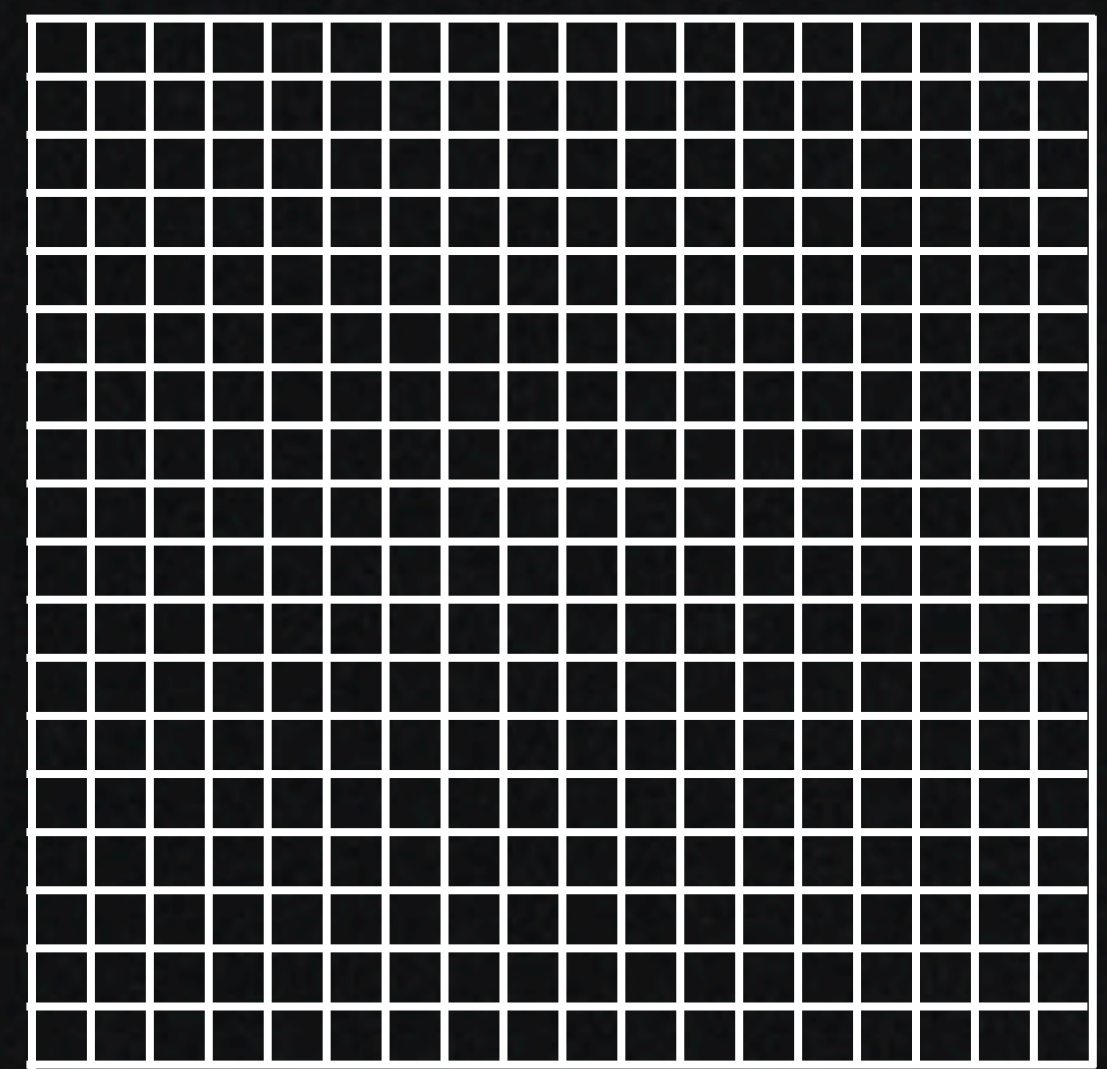
围棋
GO



井字棋
TIC-TAC-TOE



国际象棋
CHESS



围棋
GO

博弈树复杂度 Game Tree Complexity(GTC)

$$GTC \geq \lg(b^p)$$

b=分支因子
b=branching factor

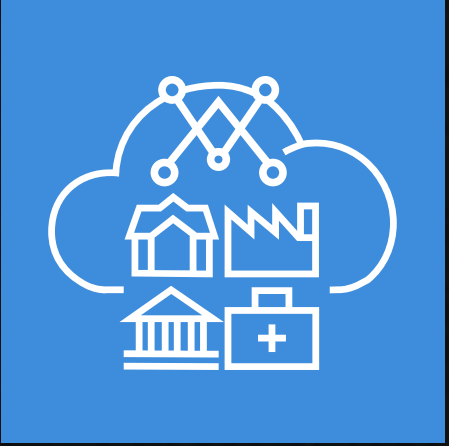
p=手
p=plies

以围棋为例
Taking Go for example

平均每局
For a Go game on average

$b \approx 250$ $p \approx 150$

$$GTC \geq \lg(250^{150}) \approx 360$$



井字棋
— 博弈树复杂度
TIC-TAC-TOE
- Game Tree Complexity

5
.....

宇宙中原子数
Atoms in Universe

80
.....

国际象棋
— 博弈树复杂度
Chess
- Game Tree Complexity

123
.....

围棋
— 博弈树复杂度
GO
- Game Tree Complexity

360
.....



8

产线数

No. of
production lines

4300+

订单数

No. of orders

33000+

机器数量

No. of machines

1-30

承诺交期/天

Promised deliver day

9

系列

Series

92

机型

Model

≤3

每条产线
可生产系列

No. of supported
series per line

$\left[\text{coc} \right]_{92 \times 92}$

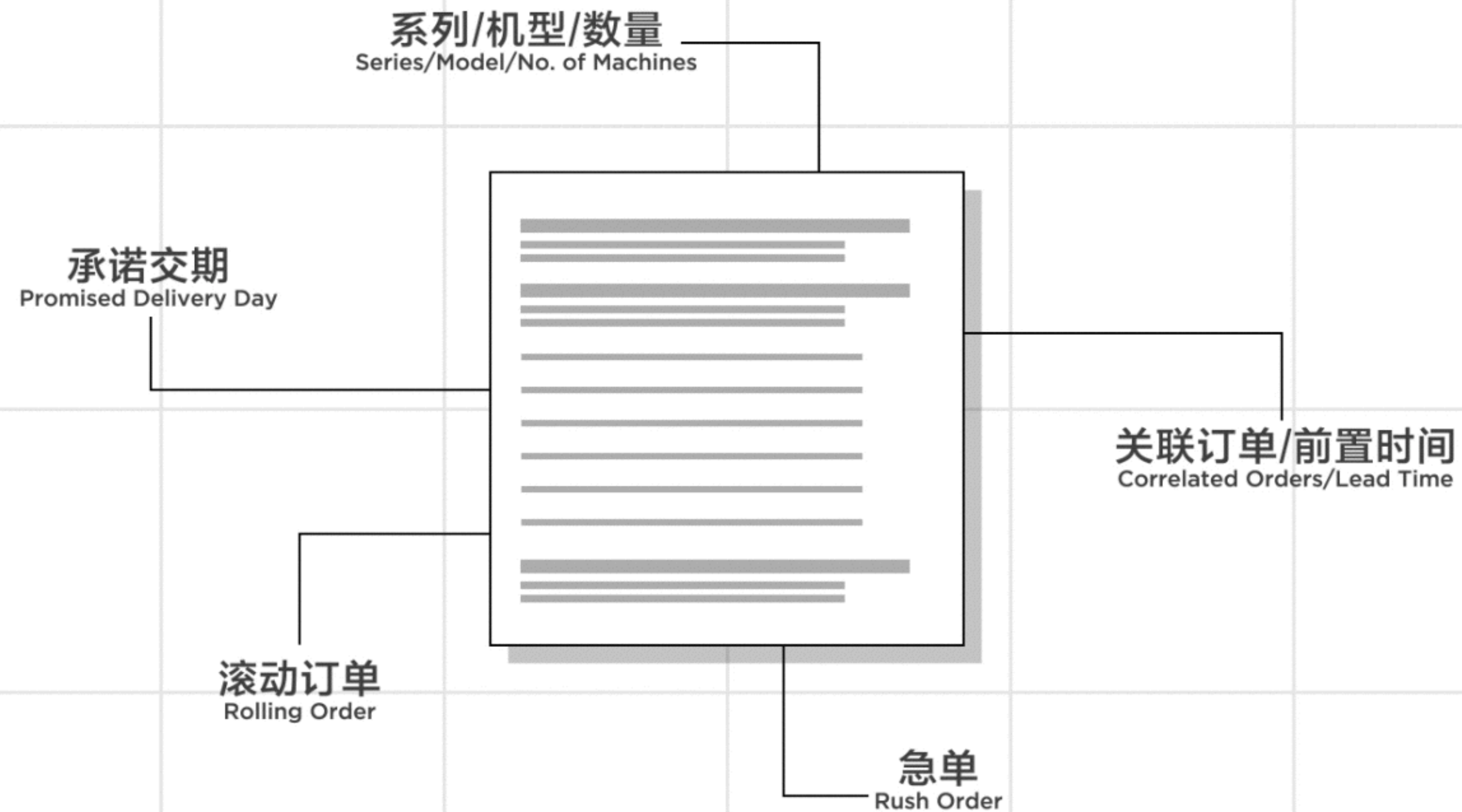
换线成本

Changeover cost



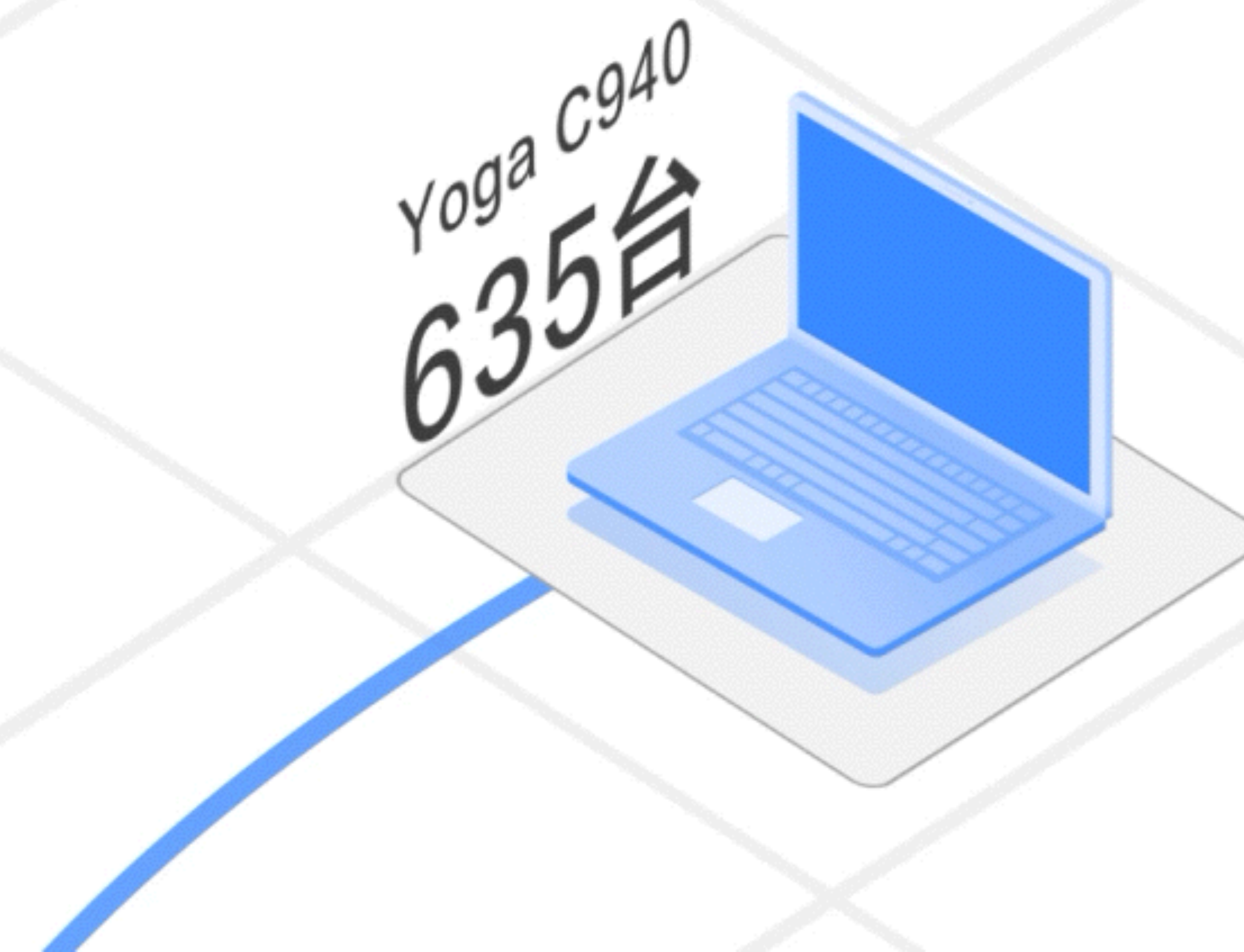
订单

Order



任务包

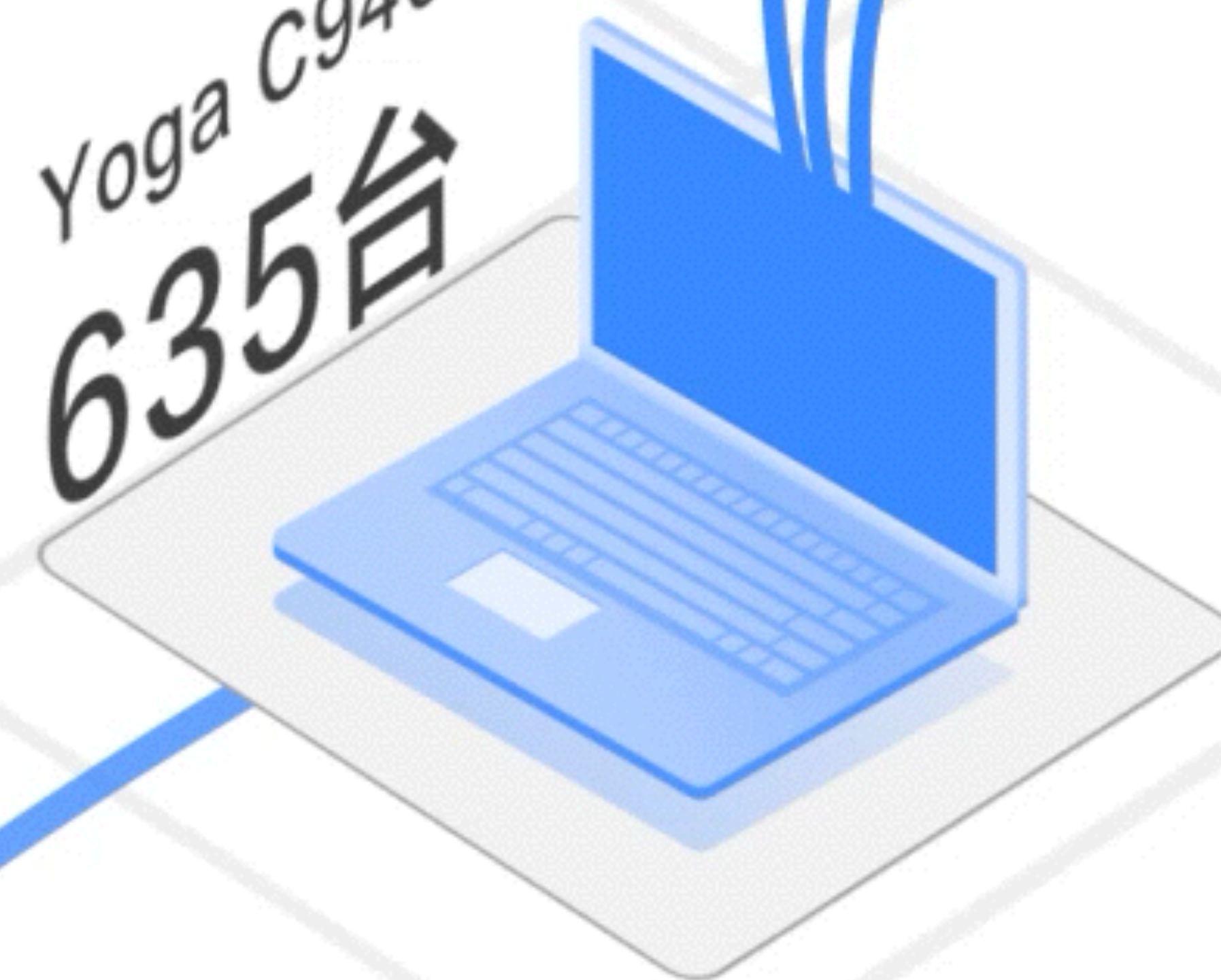
Task Package



任务包

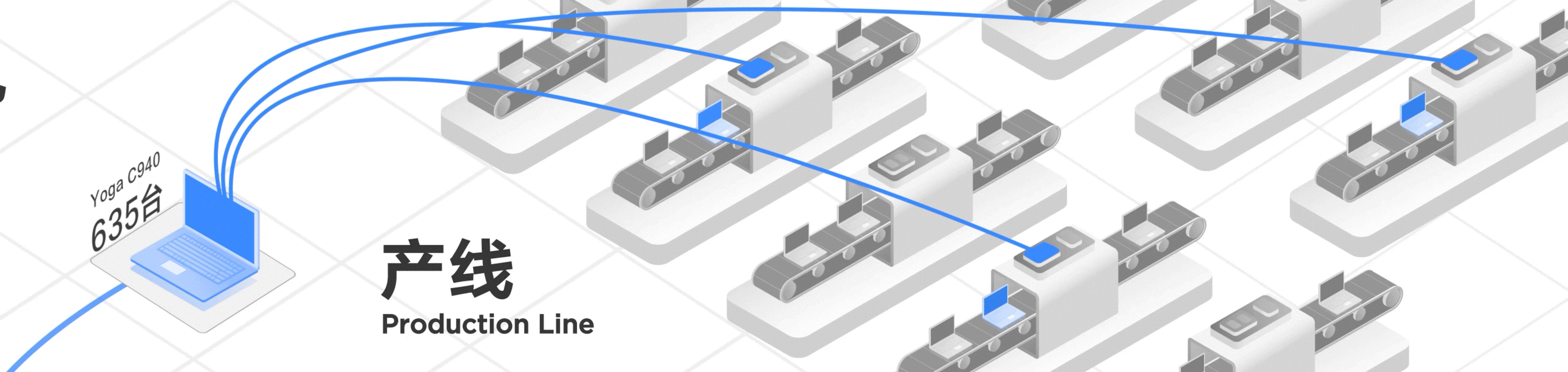
Task Package

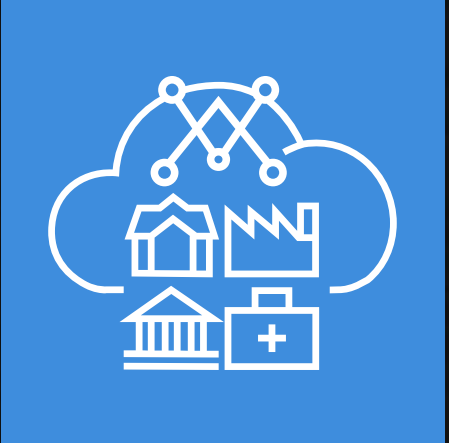
Yoga C940
635台



产线

Production Line





井字棋

— 博弈树复杂度

TIC-TAC-TOE

- Game Tree Complexity

5

.....

宇宙中原子数

Atoms in Universe

80



国际象棋

— 博弈树复杂度

Chess

- Game Tree Complexity

123



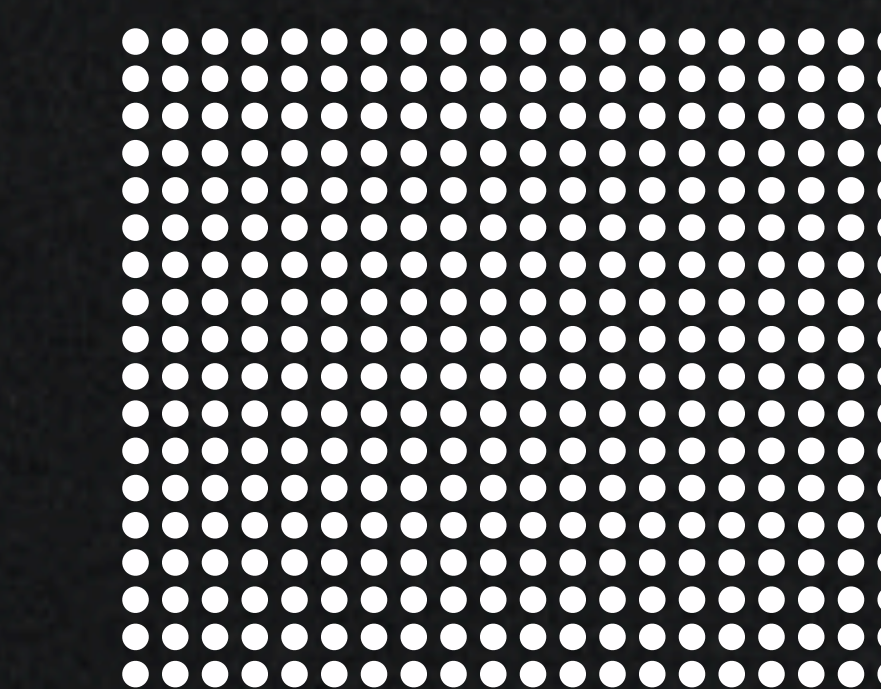
围棋

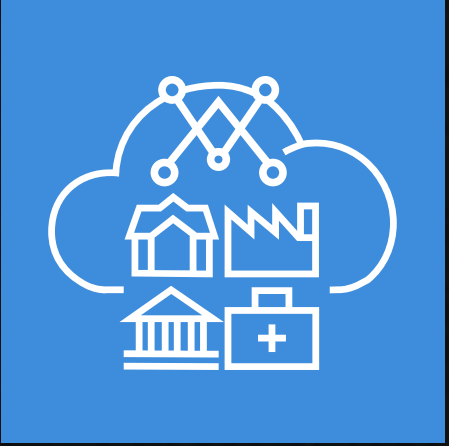
— 博弈树复杂度

GO

- Game Tree Complexity

360





井字棋
— 博弈树复杂度
TIC-TAC-TOE
- Game Tree Complexity

5
.....

宇宙中原子数
Atoms in Universe

80
.....

国际象棋
— 博弈树复杂度
Chess
- Game Tree Complexity

123
.....

智能排产
— 博弈树复杂度
SPS
-Game Tree Complexity

围棋
— 博弈树复杂度
GO
- Game Tree Complexity

162
.....

360
.....



人机大战 Human vs. A.I.

排产周期长

Long scheduling cycle

只能顾及单个目标

Single target

学习时间长

Long learning curve

快速响应

Rapid response

数据驱动

Data-driven

无人员变动带来的风险

Stable scheduling





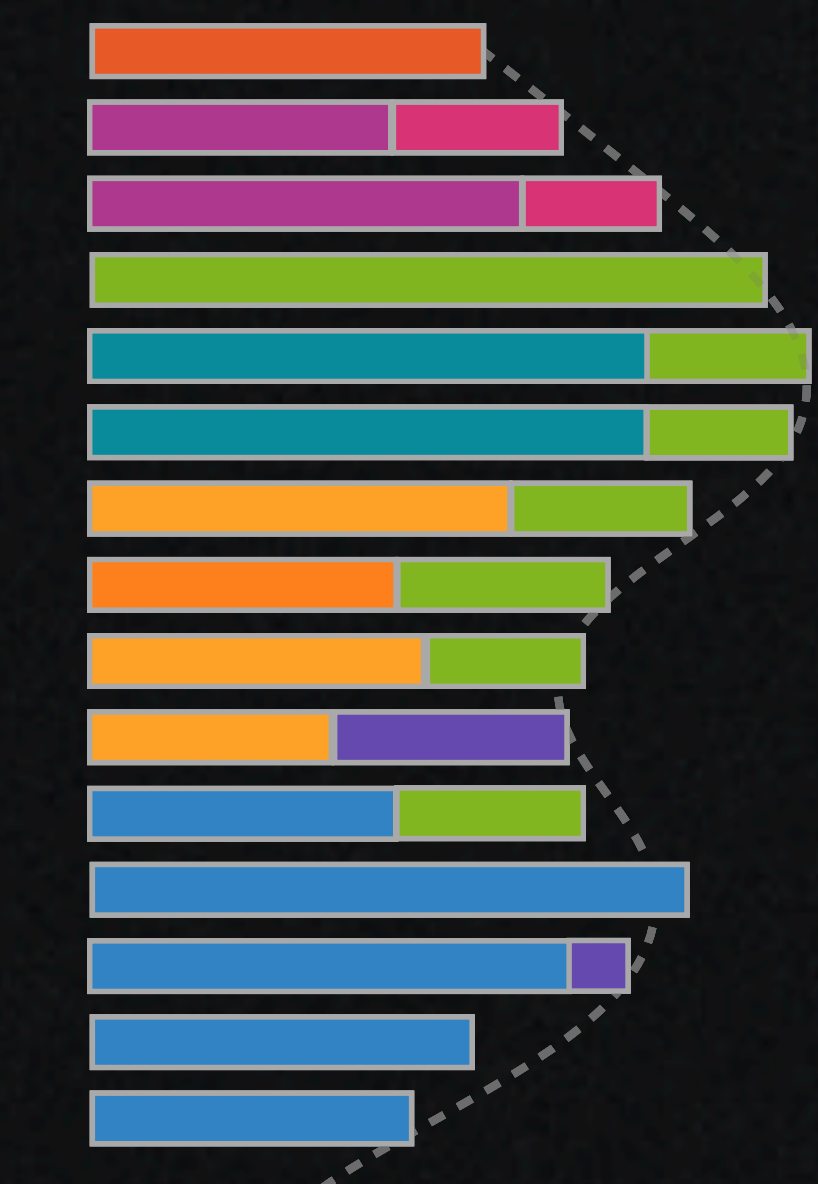
智能排产核心技术一

—多交互增强学习优化网络

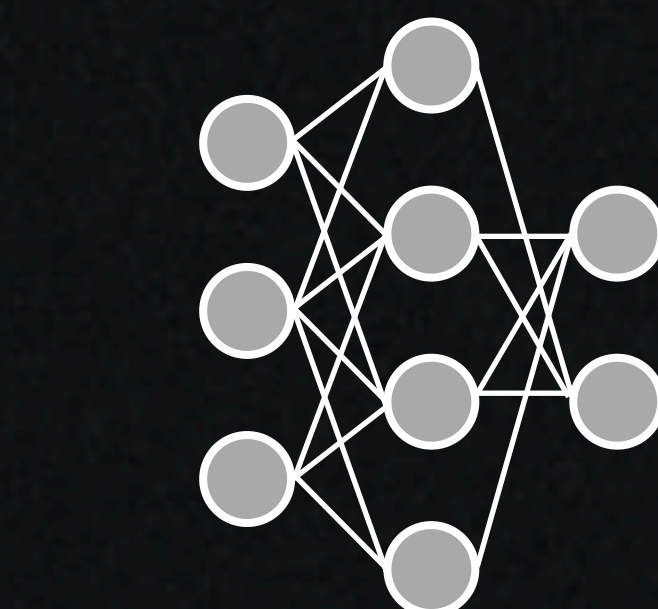
Core technology of SPS

- Multi-Interface Reinforcement Learning Optimization Network

真实数据
Real-world data

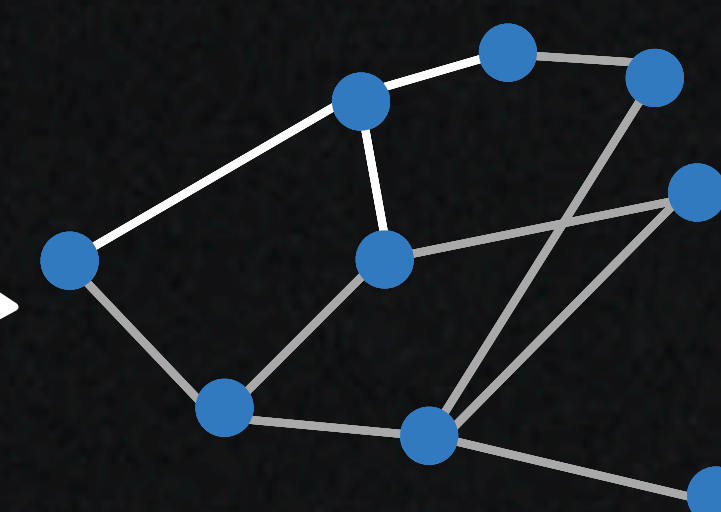


时序差分
TD-refining



价值网络
Value Network

策略梯度
Policy gradient



策略网络
Policy Network

复制
copy

行动者-01 Agent-01



复制
copy

行动者-02 Agent-02



复制
copy

行动者-03 Agent-03



异步更新 Asynchronous update

虚拟环境
Virtual environment



环境
Env-01

经验-01 Traj-01



环境
Env-02

经验-02 Traj-02



环境
Env-03

经验-03 Traj-03

汇总
Batching

异步的优势行动者-评论家方法 Asynchronous Advantage Actor-Critic(A3C)

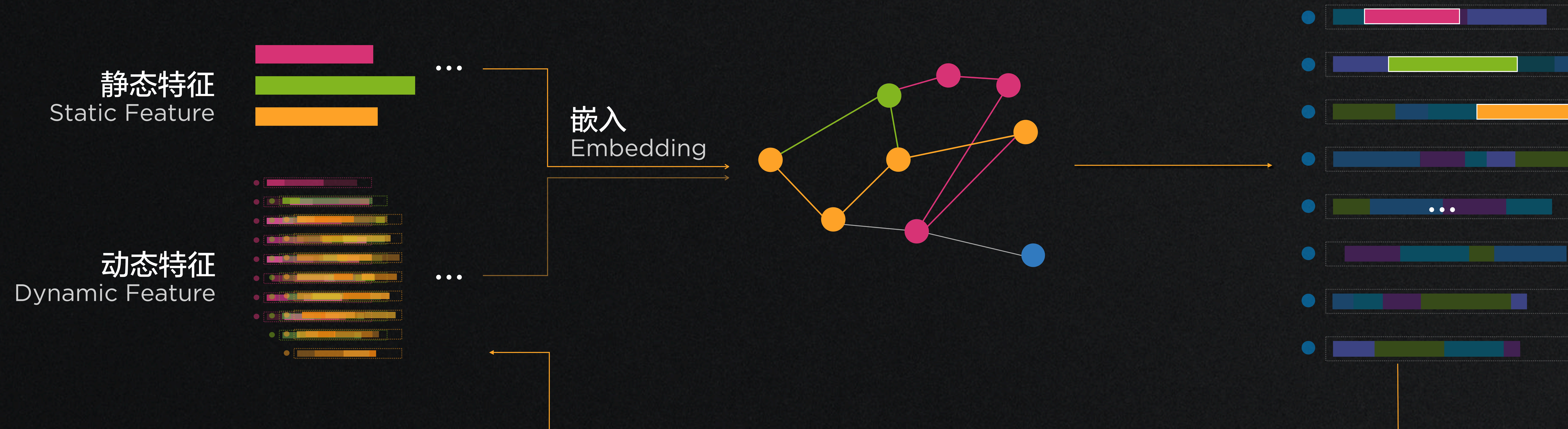


智能排产核心技术二

—基于注意力机制的最优化网络

Core technology of SPS

Attention Mechanism based Optimization Network





人机大战结果

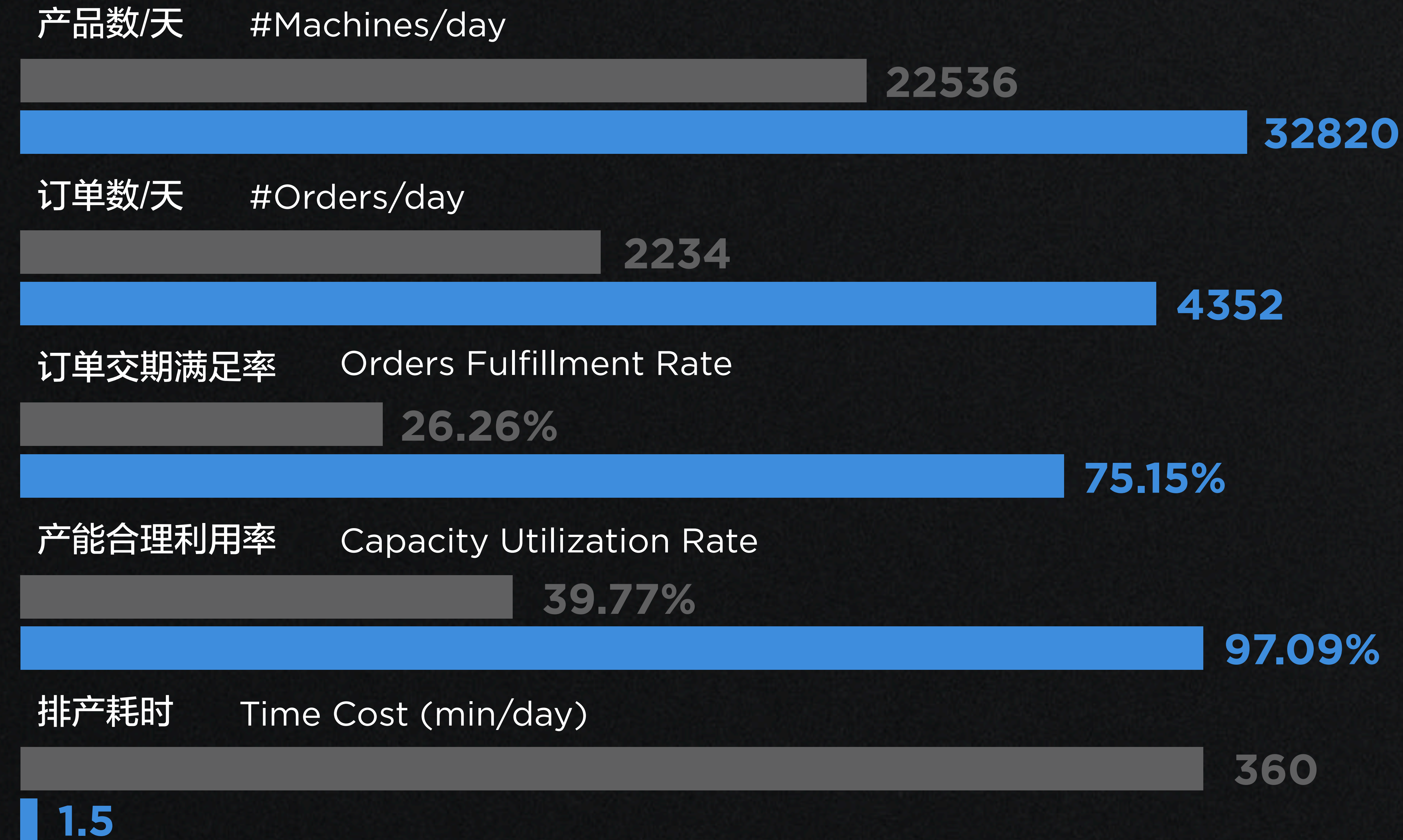
Human vs. A.I. Results

对比:

- 某生产车间人工和算法排产KPI对比
- AI排产在各指标上均优于人工

Comparison:

- Between human planner and SPS
- The schedule generated by AI algorithm is superior in terms of every KPI



人工 Human
算法 Algorithm

The background of the image is a deep space scene. It features a dark blue and black void filled with numerous small, bright white stars. A large, vibrant nebula with swirling patterns of orange, red, and blue gas clouds stretches across the upper half of the frame. In the lower-left corner, a portion of a dark, spherical planet or moon is visible, showing some surface detail. The overall atmosphere is one of vastness and technological exploration.

打造技术联想，释放效率红利，驱动智能变革

Building Tech-Powered Lenovo, Enjoying Efficiency Dividend,
& Driving Intelligent Transformation