



THE UNIVERSITY OF  
**AUCKLAND**  
Te Whare Wānanga o Tāmaki Makaurau  
NEW ZEALAND

# SDDP.jl

A Julia library for Stochastic Dual Dynamic Programming

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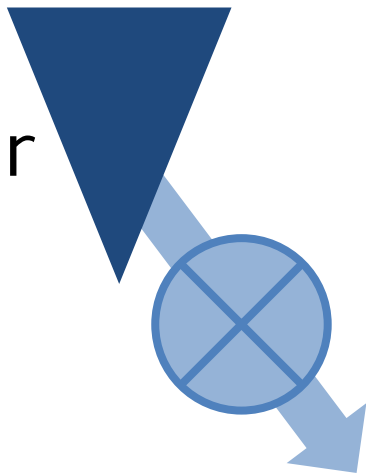
1. Hydro-thermal scheduling problem
2. Cow management problem

## **TWO PROBLEMS**

# **HYDRO-THERMAL SCHEDULING**

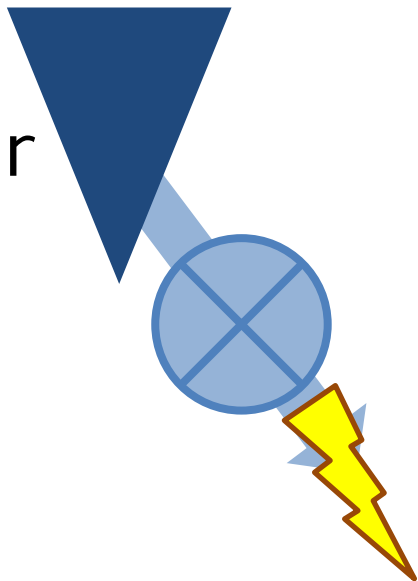
Reservoir

Hydro-  
turbine



Reservoir

Hydro-  
turbine



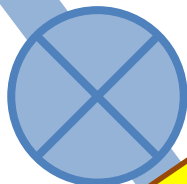
Rainfall



Reservoir



Hydro-  
turbine



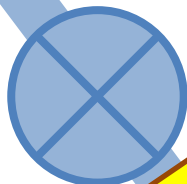
Rainfall



Reservoir



Hydro-  
turbine



Demand

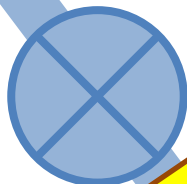


Rainfall



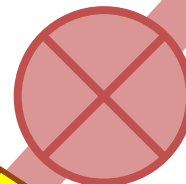
Reservoir

Hydro-  
turbine



Coal

Steam-  
turbine



Demand



*The milk **P**roduction **O**ptimizer incorporating  
**W**eather **D**ynamics and **E**conomic Risk*

**POWDER**

*The milk **P**roduction **O**ptimizer incorporating  
**W**eather **D**ynamics and **E**conomic Risk*

a.k.a. the shameless plug for Thursday morning.

**POWDER**



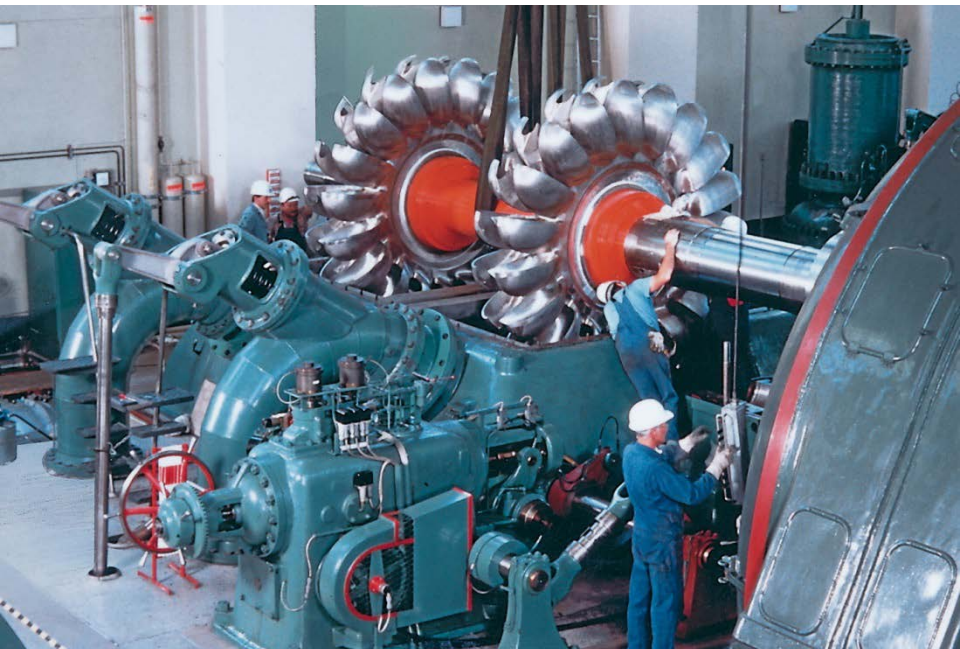
**Paddocks** are lakes of **Grass** and **Cows** are lakes of **Energy**





**Paddocks** are lakes of **Grass** and **Cows** are lakes of **Energy**

**Turbine** grass into the cow and **Turbine** the cow to produce milk







Random **grass growth** instead of **rainfall**





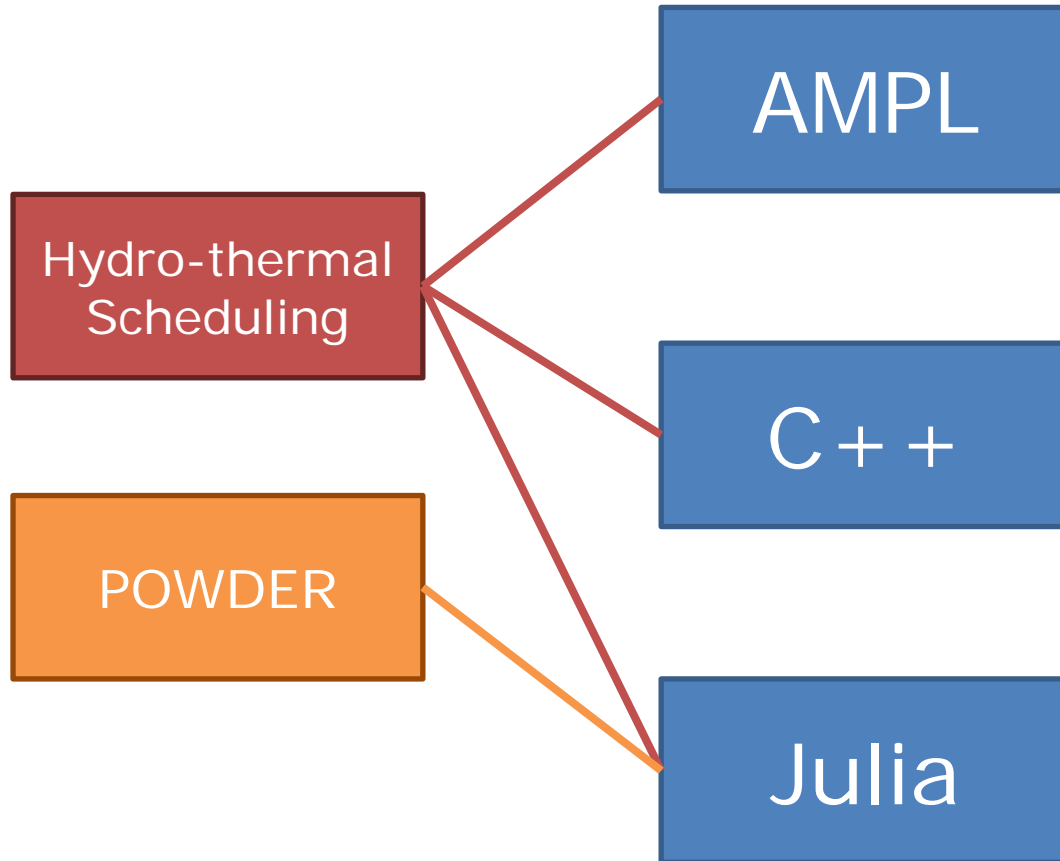
Random **grass growth** instead of **rainfall**  
**maize or palm kernel** instead of **coal**





A complicated solution technique. The details need not concern us

# **STOCHASTIC DUAL DYNAMIC PROGRAMMING**





Why not make a generic solver?

**THAT SEEMS INEFFICIENT**

# That's exactly what people have done over the few years...

- FAST (Finally an SDDP Toolbox)  
<https://github.com/leopoldcambier/FAST>
- SDDP.jl  
<https://github.com/odow/SDDP.jl>
- StochDynamicProgram.jl  
<https://github.com/JuliaOpt/StochDynamicProgram.jl>
- StructDualDynProg.jl  
<https://github.com/blegat/StructDualDynProg.jl>
- PSR (Commercial)

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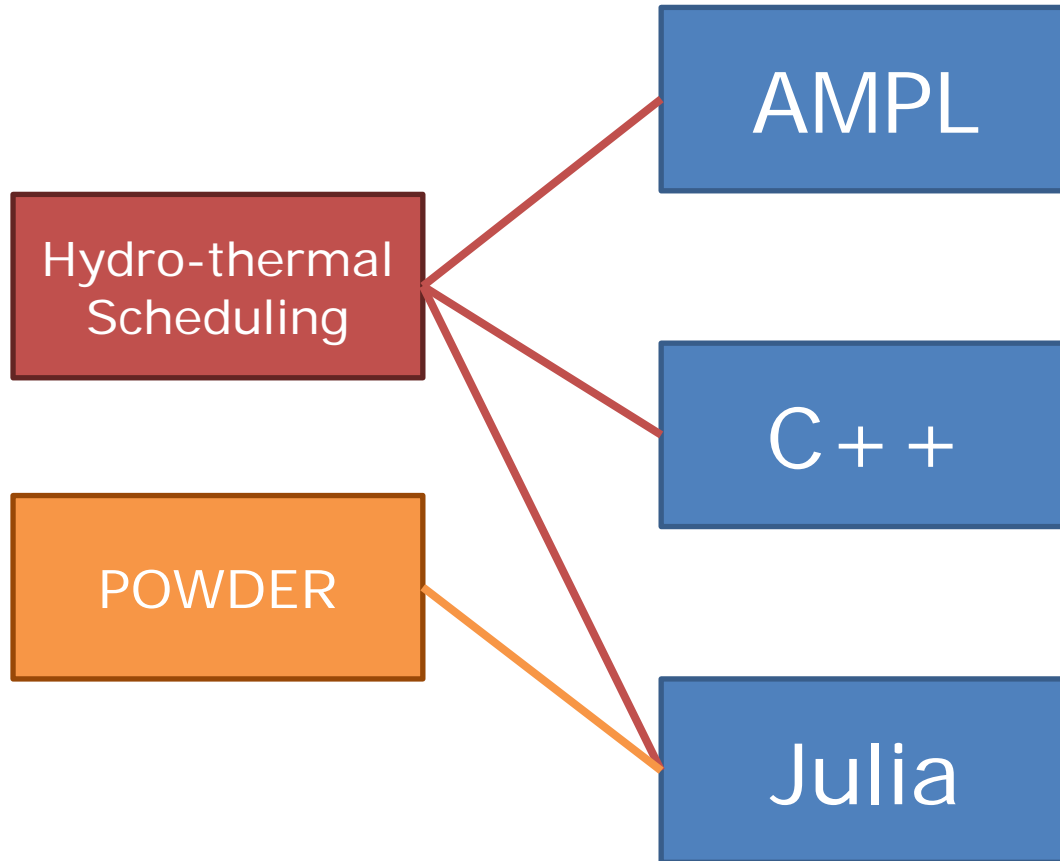
- StochDynamicProgram.jl

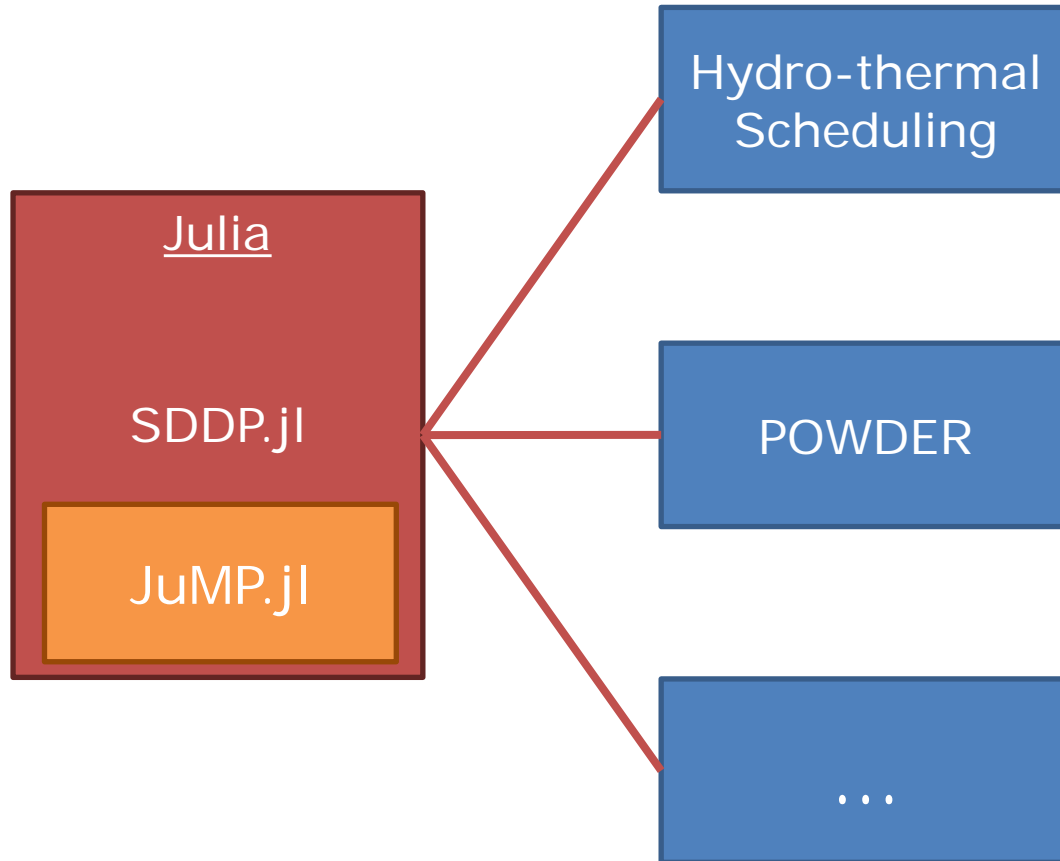
<https://github.com/JuliaOpt/StochDynamicProgram.jl>

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- PSR (Commercial)





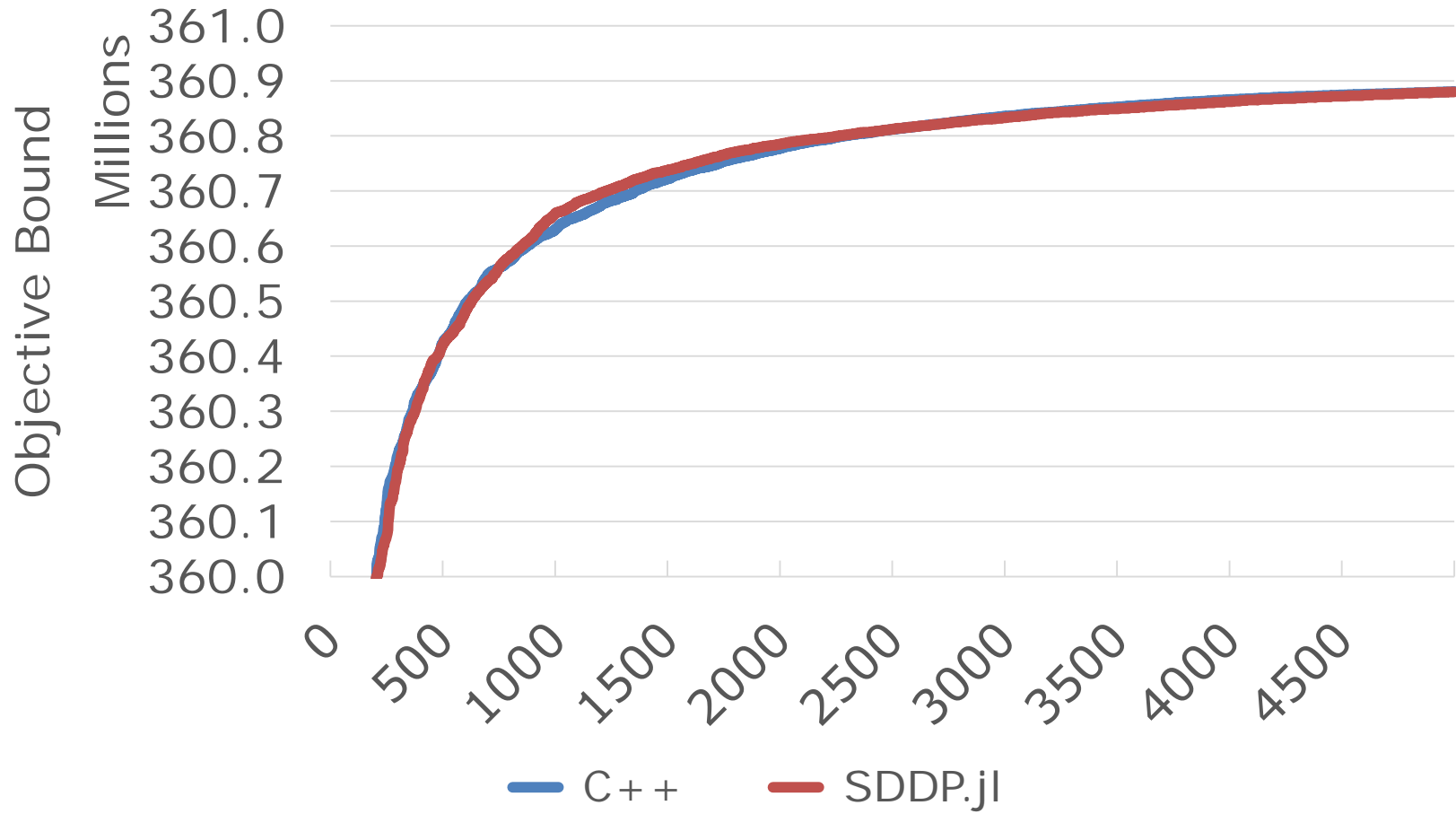
Benchmarking the NZ Hydro-Thermal Scheduling Problem

**BUT IS IT ANY GOOD?**

# Correctness I

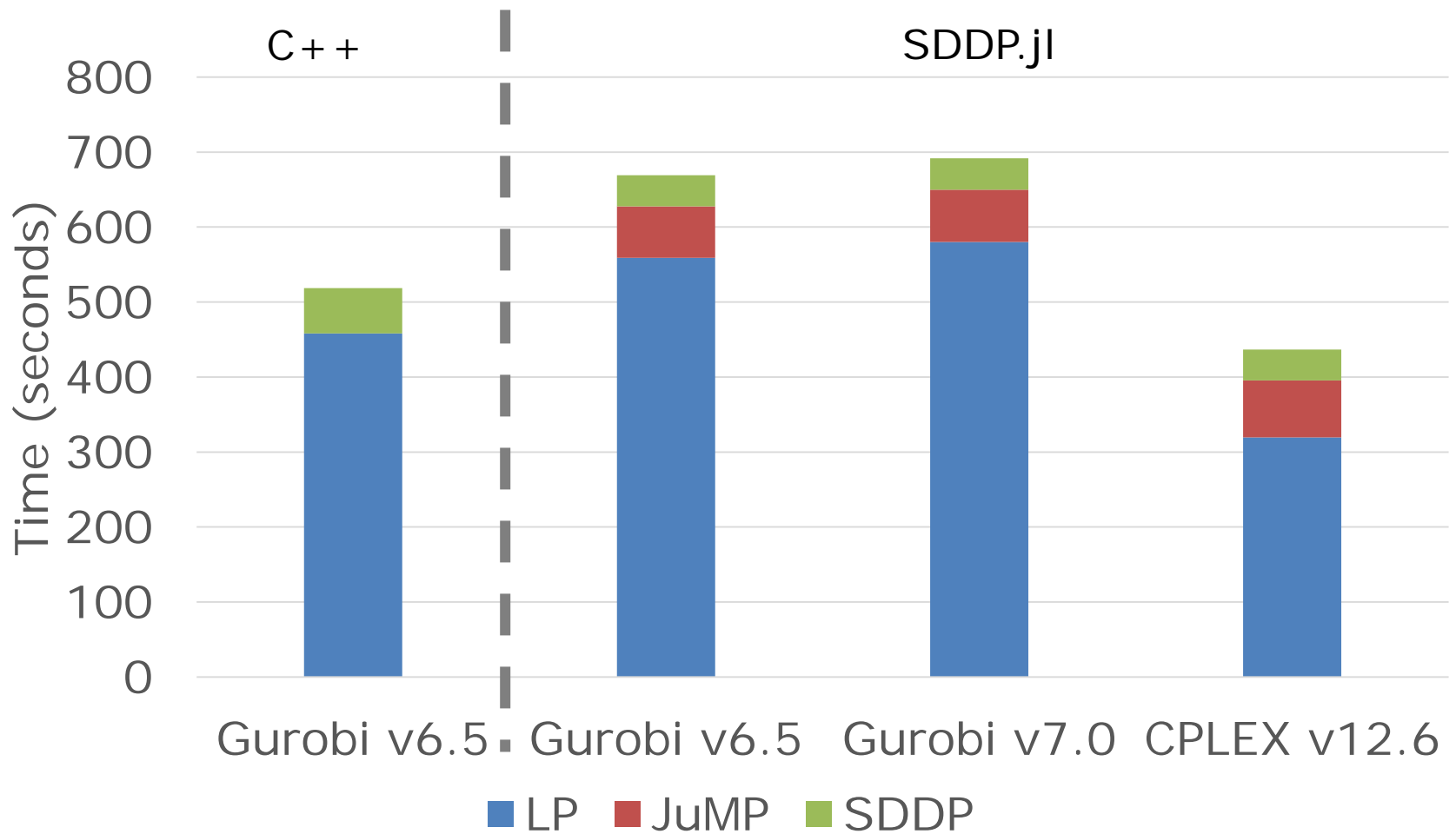
	<b>C + +</b>	<b>SDDP.jl</b>
<b>2005</b>	\$493,125,281	\$493,125,281
<b>2006</b>	\$423,420,729	\$423,420,729
<b>2007</b>	\$575,859,349	\$575,859,349
<b>2008</b>	\$446,507,222	\$446,507,222
<b>2009</b>	\$340,096,459	\$340,096,459

# Correctness II

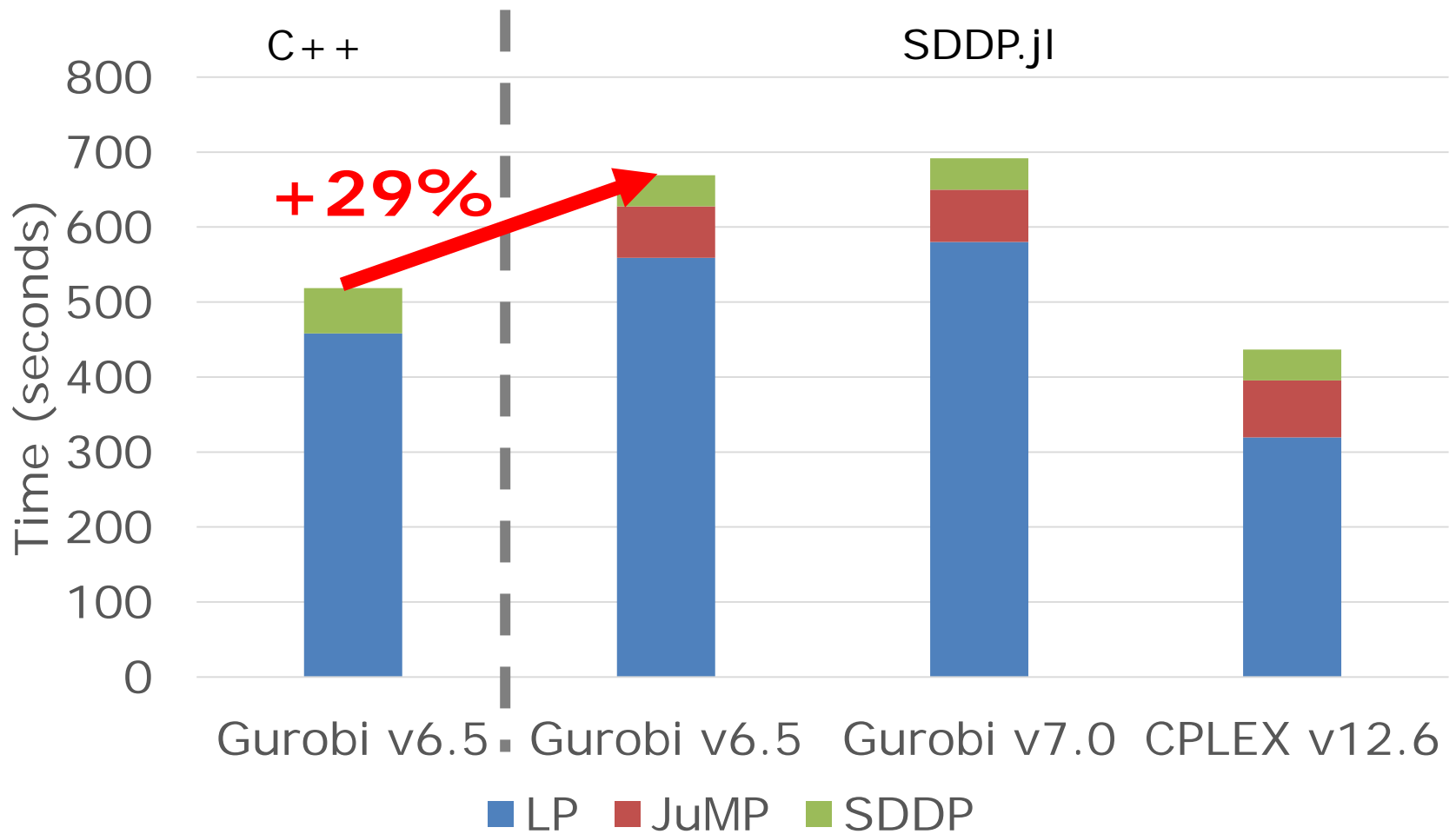




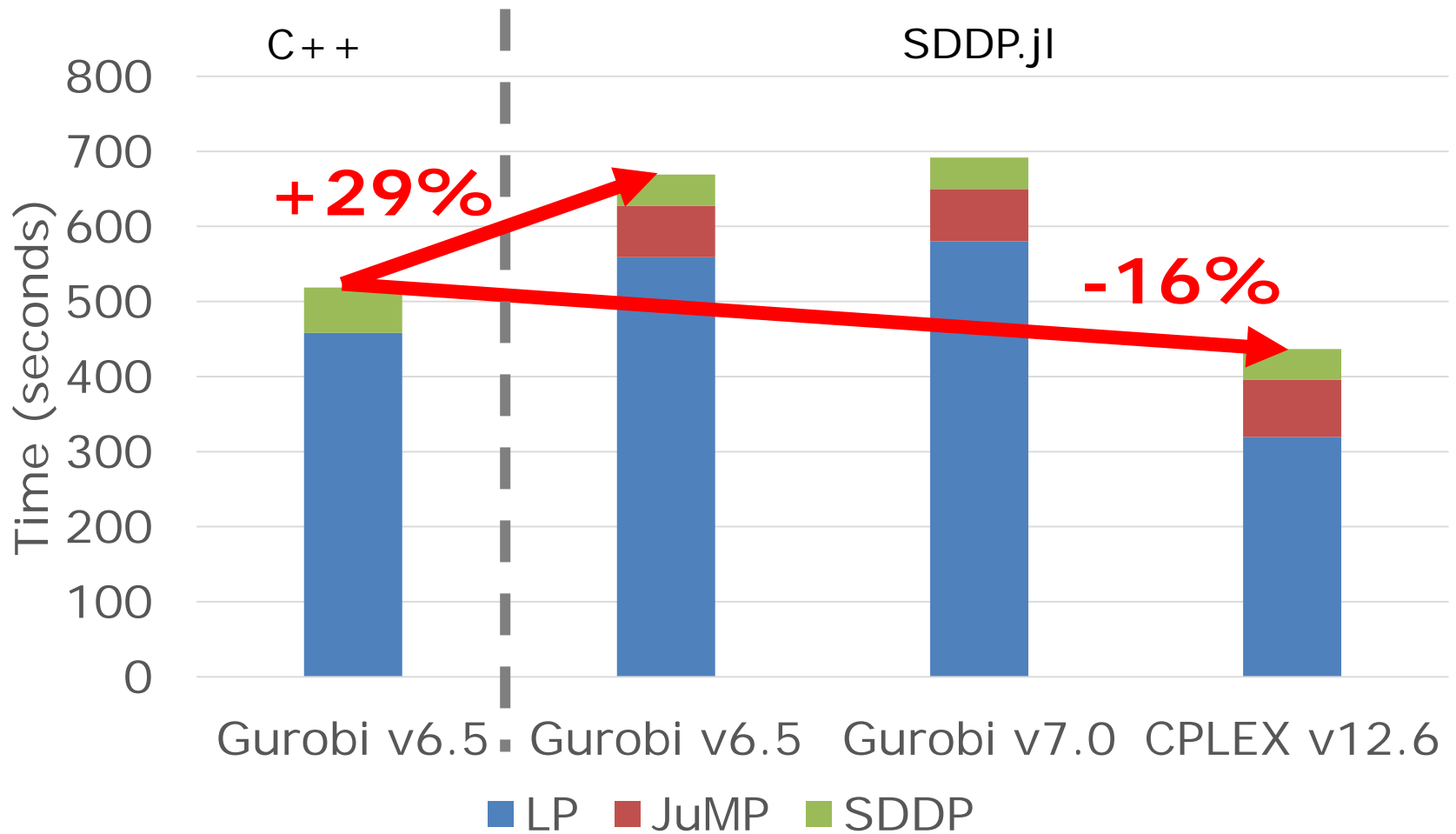
# Performance



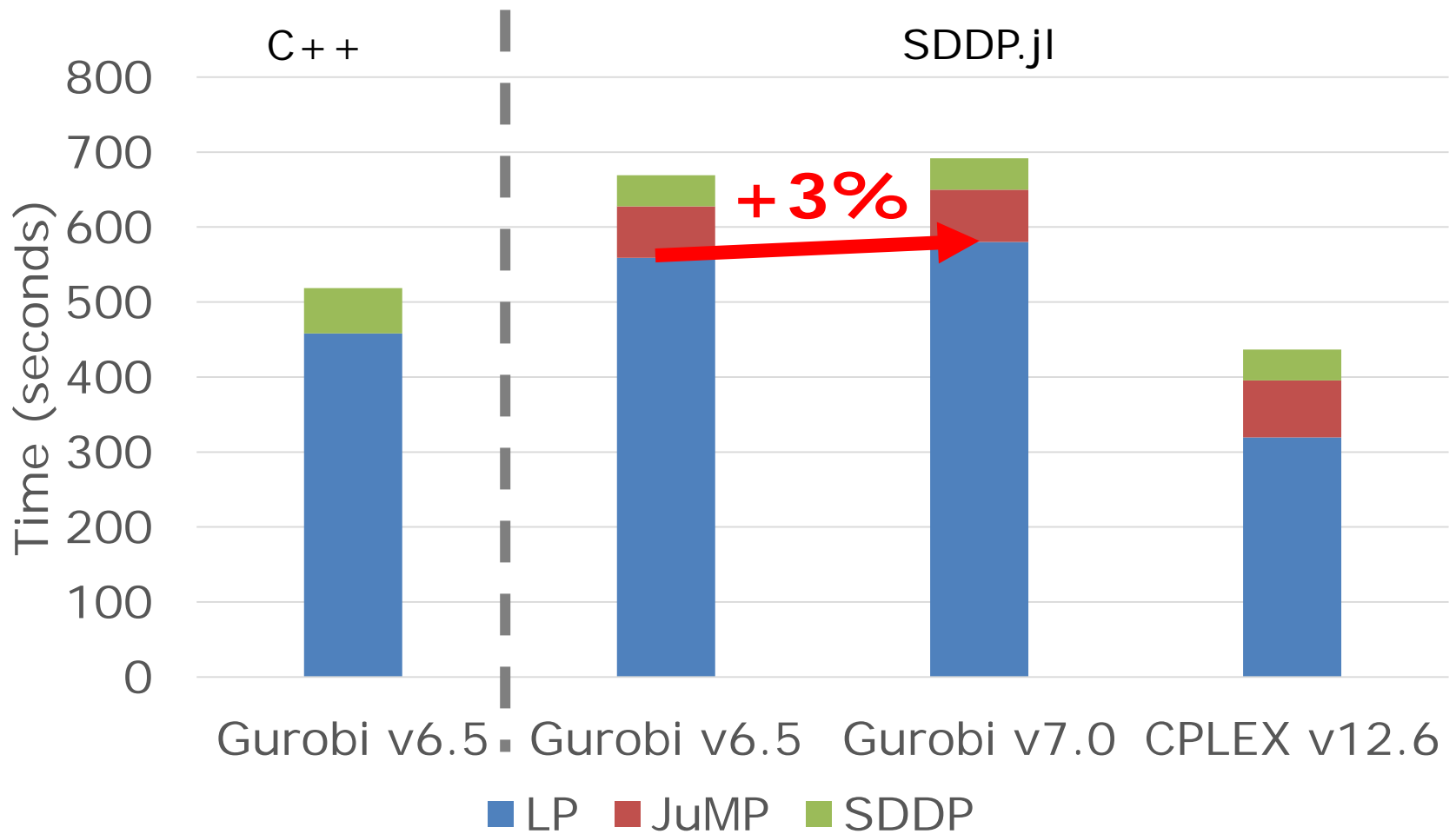
# Performance



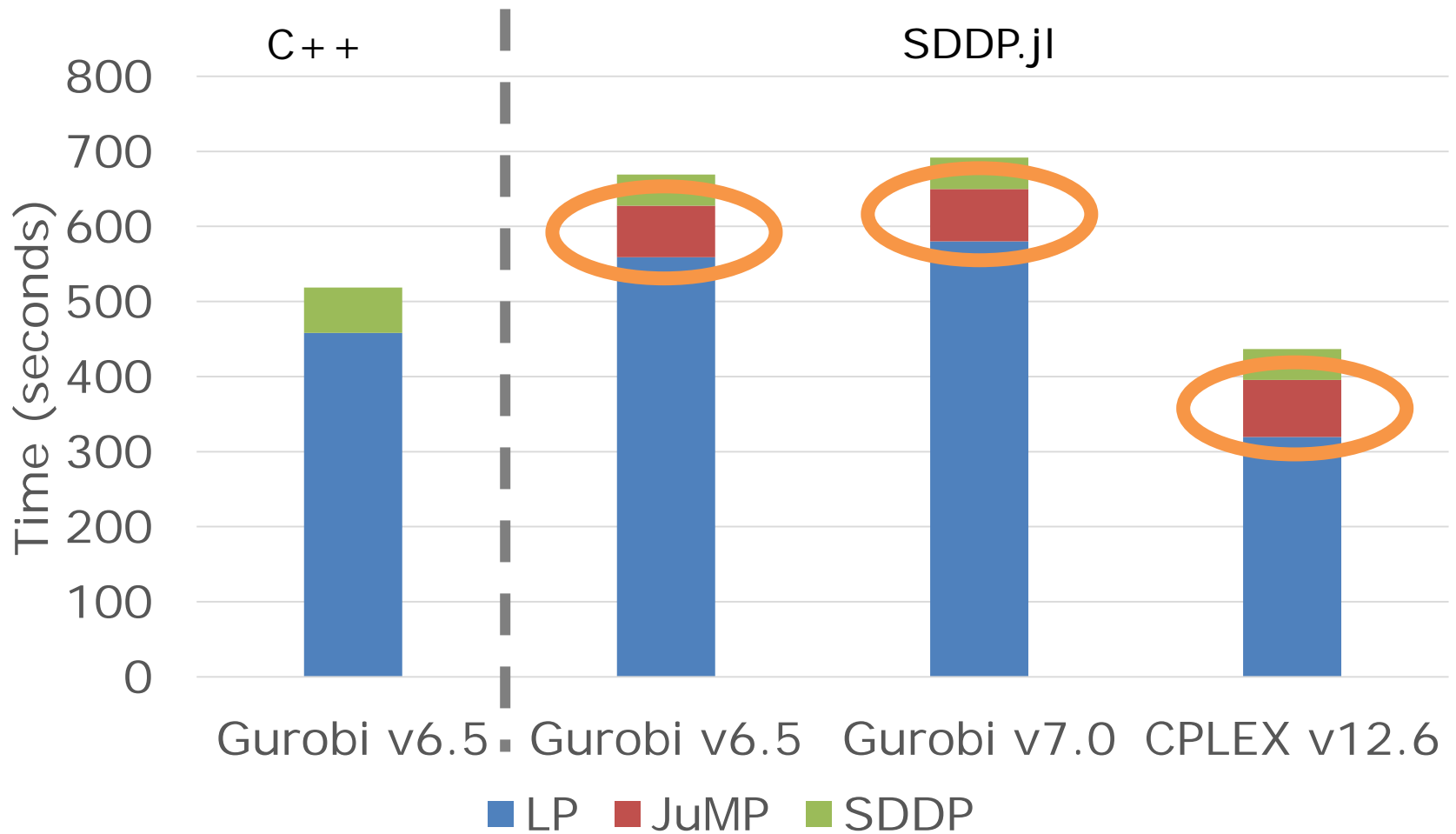
# Performance



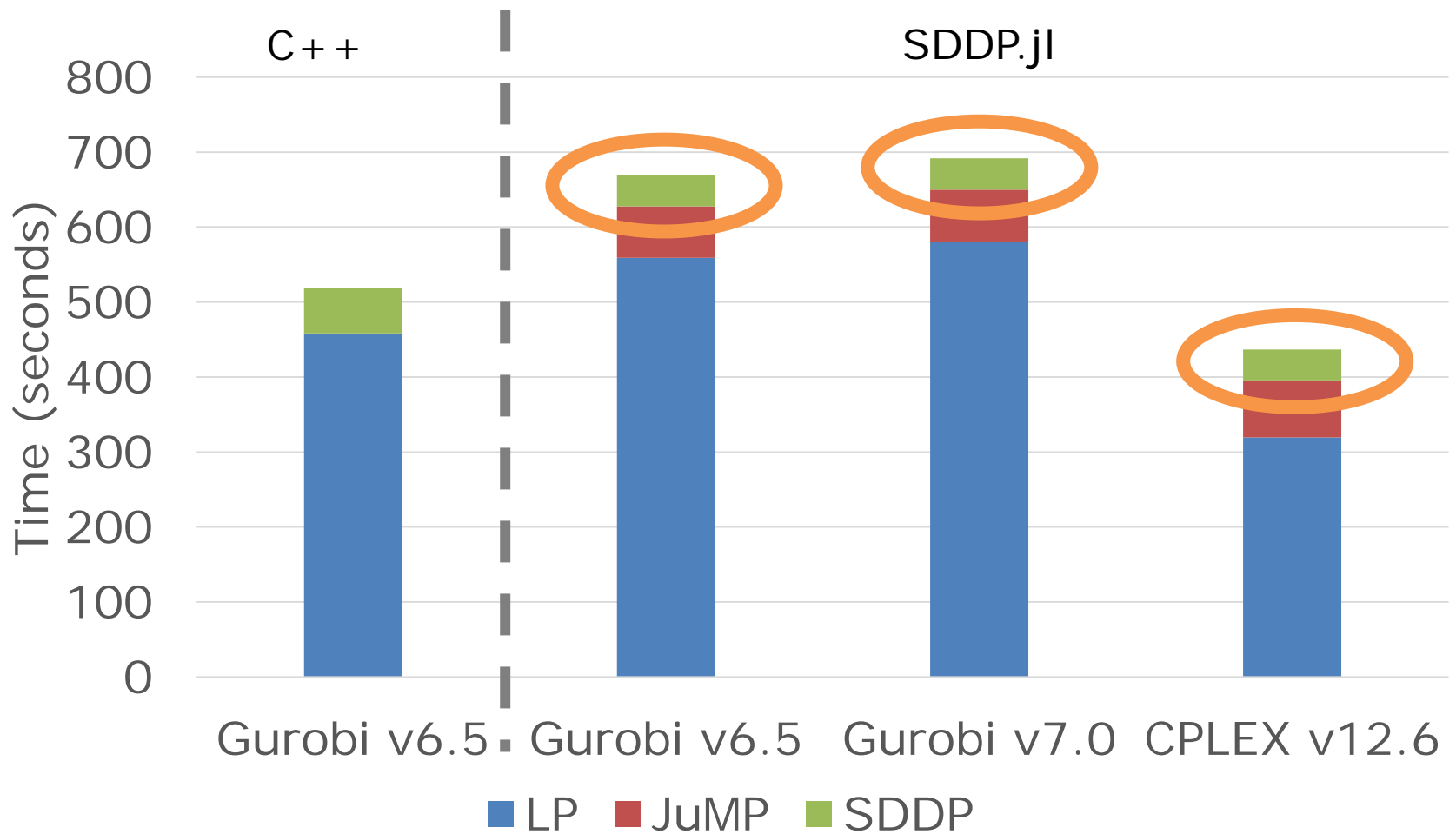
# Performance



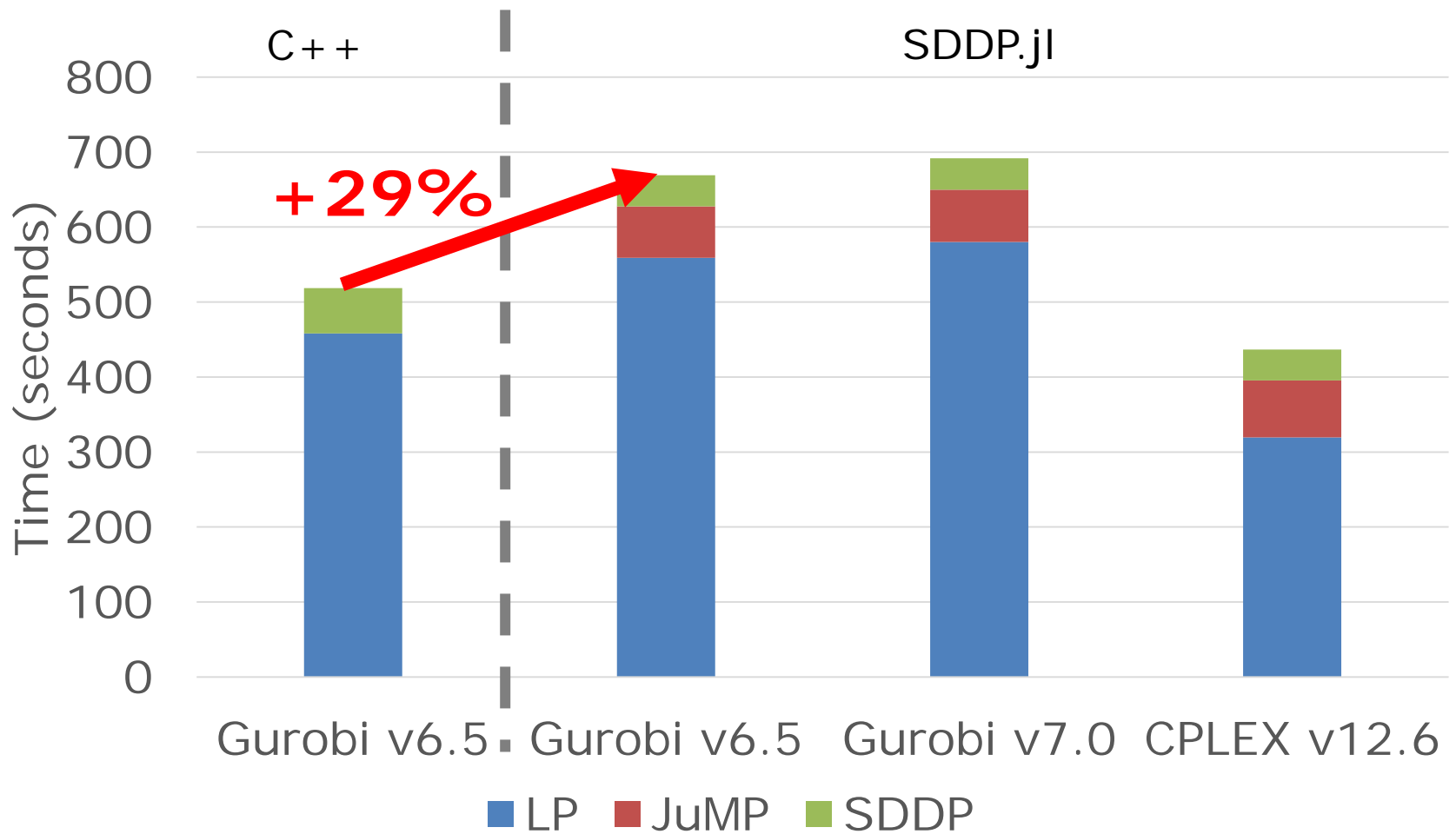
# Performance



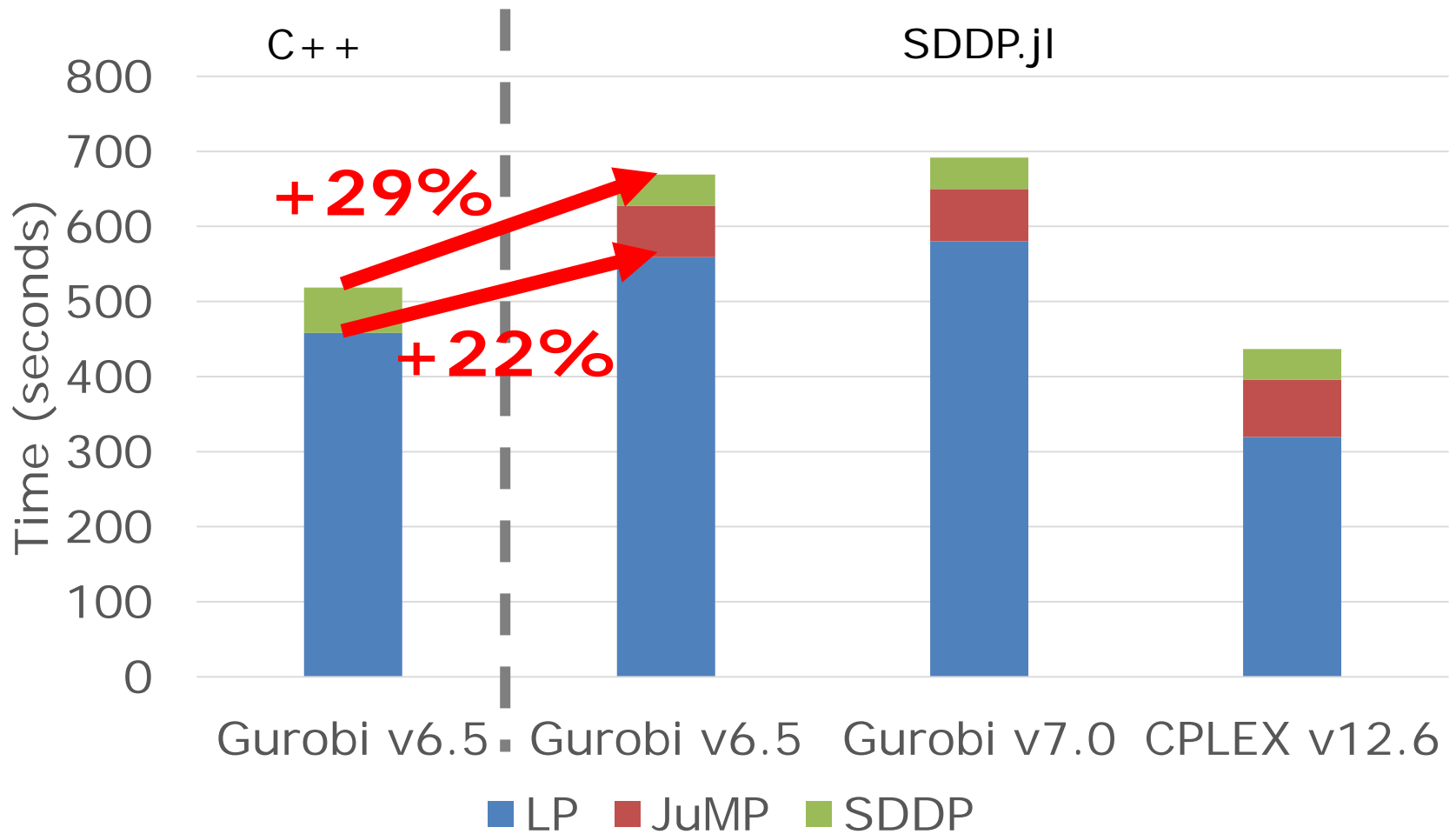
# Performance



# Performance



# Performance





## **SDDP.jl is**

- generic
- open-source
- easy to use
- competitive with hard-coded C++ implementations
- correct

# **CONCLUSIONS**