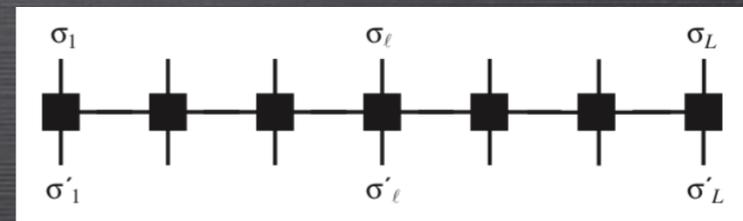
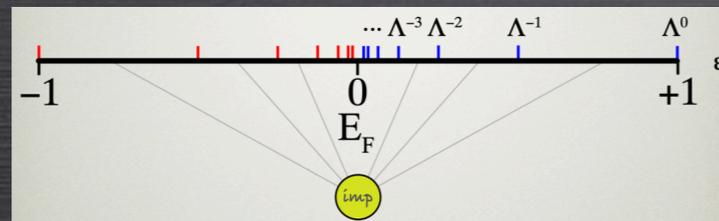


# SOLVERS FOR QUANTUM IMPURITY PROBLEMS (WITH SUPERCONDUCTING BATHS)

## TUTORIAL 2: NRG BASICS



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# IMPLEMENTATION

## SNEG + NRG LJUBLJANA

---

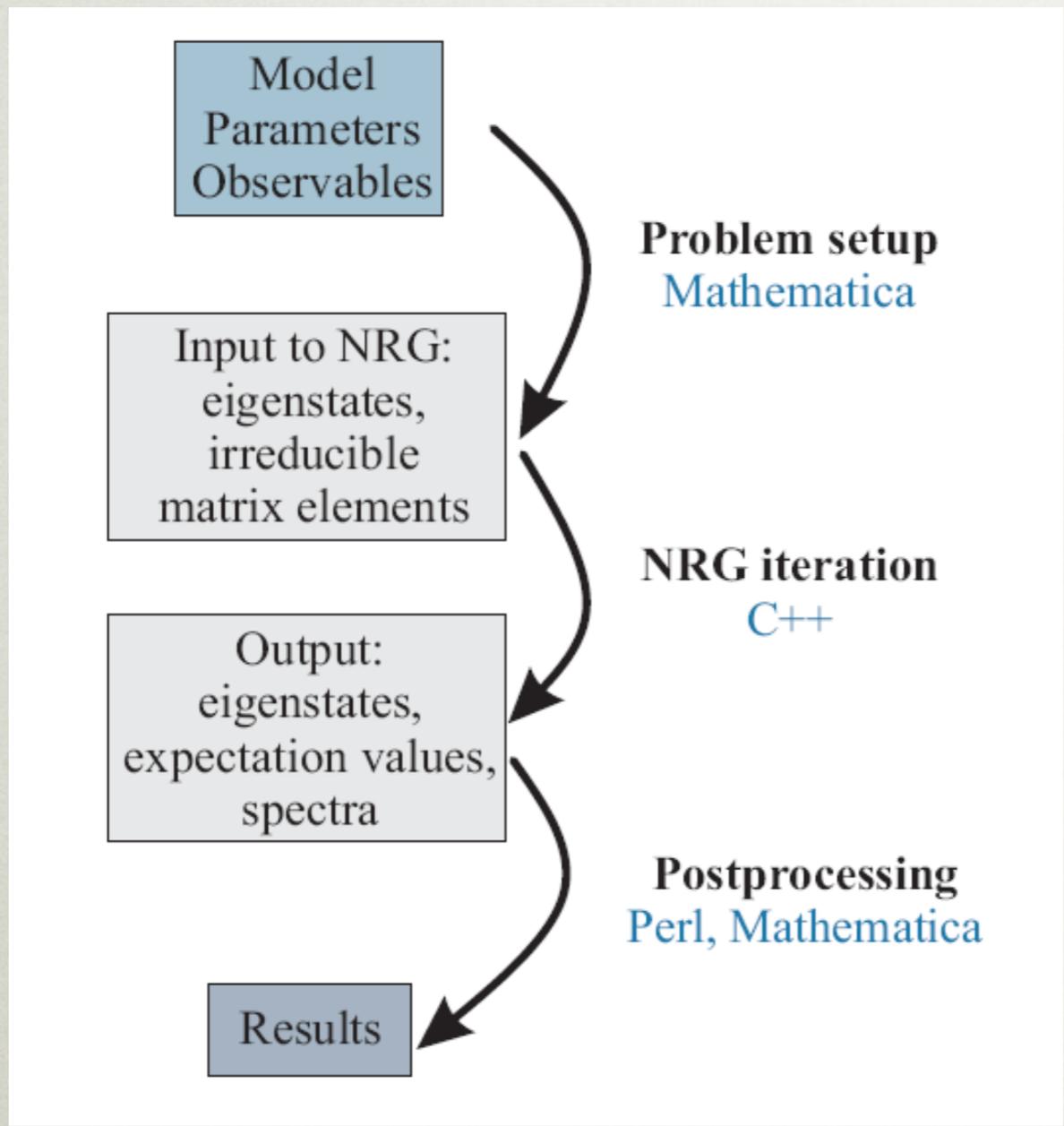
Add-on package for the  
computer algebra system  
Mathematica for performing  
calculations involving  
**non-commuting operators**



Efficient general purpose  
numerical renormalization group code

- flexible and adaptable
- highly optimized (partially parallelized)
- easy to use

<http://nrgljubljana.ijs.si/>



`nrginit`

`nrgun/nrg`

`various scripts`

# ALTERNATIVE VERSION: NRGLJUBLJANA\_INTERFACE

[https://triqs.github.io/nrgljubljana\\_interface/latest/](https://triqs.github.io/nrgljubljana_interface/latest/)

[Install](#)

[Documentation](#)

[Issues](#)

[About nrgljubljana\\_interface](#)

## nrgljubljana\_interface

NRG Ljubljana -- triqs interface

### nrgljubljana\_interface

nrgljubljana\_interface provides C++ and Python interfaces between TRIQS and the NRG Ljubljana solver.

“NRG Ljubljana” is a general-purpose flexible framework for performing large scale numerical renormalization group (NRG) calculations for quantum impurity problems. It is highly extensible without sacrificing numerical efficiency. It supports a great variety of impurity Hamiltonians and symmetry types. More details can be found on the [project homepage](#), while the code itself is hosted on [Github](#).

Learn how to use nrgljubljana\_interface in the [Documentation](#).

#### nrgljubljana\_interface 3.0.0

This is the homepage of nrgljubljana\_interface v3.0.0. For changes see the [changelog page](#).



SIMONS FOUNDATION

Most useful in the context of DMFT.

# EXAMPLE INPUT FILES

---

## param

```
[extra]
U=0.01
Gamma=0.0007
delta=0

[param]
symtype=QS
discretization=Z
Lambda=2
Tmin=1e-10
keepenergy=10
keep=5000

model=siam.m
```

## siam.m

```
def1ch[1];

H1 = delta (number[d]-1) +
      U/2 pow[number[d]-1, 2];
Hc = gammaPol hop[f[0], d[]];

H = H0 + H1 + Hc;
```

# COMMON SYMTYPE SETTINGS

---

- **QS**: conservation of charge and full invariance in spin space
- **QSZ**: external magnetic field (axial spin symmetry)
- **U1**: no spin symmetry
- **SPSU2, SPU1**: superconducting case (with full and axial spin symmetry)
- **NONE**: no symmetry at all

# COMMON PREDEFINED MODELS

---

- **KONDO:** single-channel Kondo model
- **SIAM:** single impurity Anderson model
- **CLEAN:** no impurity (just a Wilson chain)

# CONTENTS OF PARAM FILE

---

[extra]

spin=1/2

Jkondo=0.2

[param]

symtype=QS

discretization=Z

Lambda=2

Tmin=1e-6

keepenergy=8

keep=5000

model=kondo.m

symmetry type

discretization scheme: Y, C, Z

$\Lambda$

controls the length of chain

truncation parameters

# CONTENTS OF DATA FILE

---

```
# Input file for NRG Ljubljana, Rok Zitko, rok.zitko@ijs.si, 2005-2015
# symtype      QS
# Using sneg version    1.250
#!8
# Number of channels, impurities, chain sites, subspaces:
1      0      39      4
# SCALE      1.0201394465967895
# Energies (GS energy subtracted, multiplied by 1/SCALE):
-1      2
1
0.1470387215202821
0      1
1
0.
0      3
1
0.19605162869370946
1      2
1
0.1470387215202821
# Irreducible matrix elements for Wilson chains:
f 0 0
4
1      2      0      3
1.224744871391589
1      2      0      1
0.7071067811865475
0      3      -1      2
1.
0      1      -1      2
-1.
# GS energy in absolute units:
e
-0.15000000000000002
# Irreducible matrix elements for other operators:
# Discretization tables:
z
39
0.54528747084262258072
0.41550946829175445321
0.32189917767609217007
0.24026940945817134999
```

# CONTENTS OF TD

---

#	T	$\langle Sz^2 \rangle$	$\langle Q \rangle$	$\langle Q^2 \rangle$	$\langle E \rangle$	$\langle E^2 \rangle$	C	F	S
	1.02014	0.362367	0	0.49907	0.143255	0.0244887	0.00396666	-1.93426	2.07752
	0.721348	0.451726	1.19233e-17	0.868445	0.965006	1.43272	0.501484	-2.23124	3.19624
	0.51007	0.518769	-6.18407e-18	1.15429	1.22576	2.69395	1.19145	-2.88775	4.11352
	0.360674	0.555072	4.43533e-17	1.31488	1.86786	5.57957	2.09068	-2.84544	4.71329
	0.255035	0.568245	-4.70206e-16	1.37861	1.85672	6.27727	2.82986	-3.14618	5.0029
	0.180337	0.570338	-3.17518e-15	1.39344	2.14041	7.74478	3.1634	-2.94699	5.0874
	0.127517	0.569747	-5.90117e-15	1.39626	1.93828	6.96775	3.21083	-3.16169	5.09997
	0.0901684	0.568831	-9.71756e-15	1.3971	2.14611	7.82173	3.21593	-2.95621	5.10233
	0.0637587	0.567669	-1.3782e-14	1.39783	1.94892	7.01101	3.21272	-3.15444	5.10337
	0.0450842	0.566435	-1.66035e-14	1.39796	2.14515	7.81767	3.21598	-2.9585	5.10366
	0.0318794	0.56499	-1.77274e-14	1.39833	1.96067	7.05806	3.21384	-3.1431	5.10377
	0.0225421	0.563485	-1.92049e-14	1.39826	2.14416	7.81382	3.21641	-2.95913	5.10329
	0.0159397	0.561755	-2.05475e-14	1.39852	1.97403	7.1106	3.2138	-3.12879	5.10283
	0.0112711	0.559947	-2.23771e-14	1.39838	2.14287	7.8091	3.21722	-2.95919	5.10205
	0.00796984	0.557866	-2.34782e-14	1.39852	1.98954	7.17093	3.21265	-3.11135	5.10089

magnetization

heat capacity

entropy

free energy

# PLOTTING WITH GNU PLOT

---

```
#!/bin/bash
gnuplot --persist <<EOF
set termoption enh
set title "Kondo model"
set logscale x
set format x '10^{%L}'
set xlabel 'Temperature'
set xrange [1e-8:1e-1]
set ylabel 'S(T)/k_B'
plot 'td-S.dat' with lp title 'impurity entropy', log(2)
EOF
```

# PLOTTING WITH MATPLOTLIB

---

```
#!/bin/sh
python <<EOF
# -*- coding: utf-8 -*-

import matplotlib as mpl
mpl.use('agg')
import matplotlib.pyplot as plt
import numpy as np

f = plt.figure()

plt.title("Kondo model", fontsize=12)
plt.xlabel(r'\$T/D\$ ', fontsize=12)
plt.ylabel(r'\$S(T)\ [k_B]\$', fontsize=12)
plt.xlim(1e-8, 1e-1)
plt.xscale('log')
plt.ylim(bottom=0)
plt.tick_params(labelsize=12)

plt.tight_layout()

x1, y1 = np.loadtxt('td-S.dat', unpack=True)
l1, = plt.plot(x1, y1, color='black', label='Impurity entropy')

plt.legend()
plt.show()
plt.savefig('entropy.pdf')

EOF
```

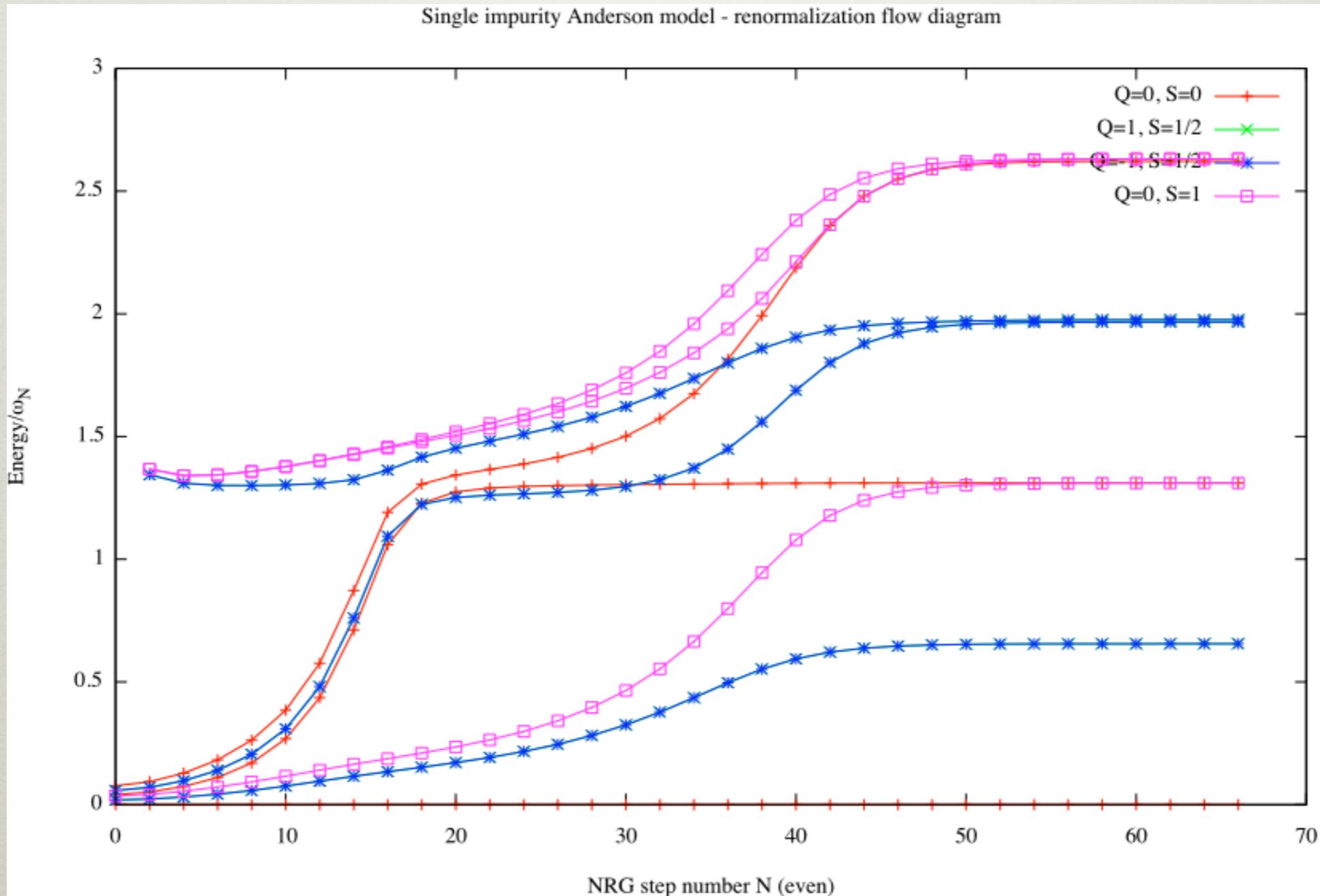
# ANALYSIS

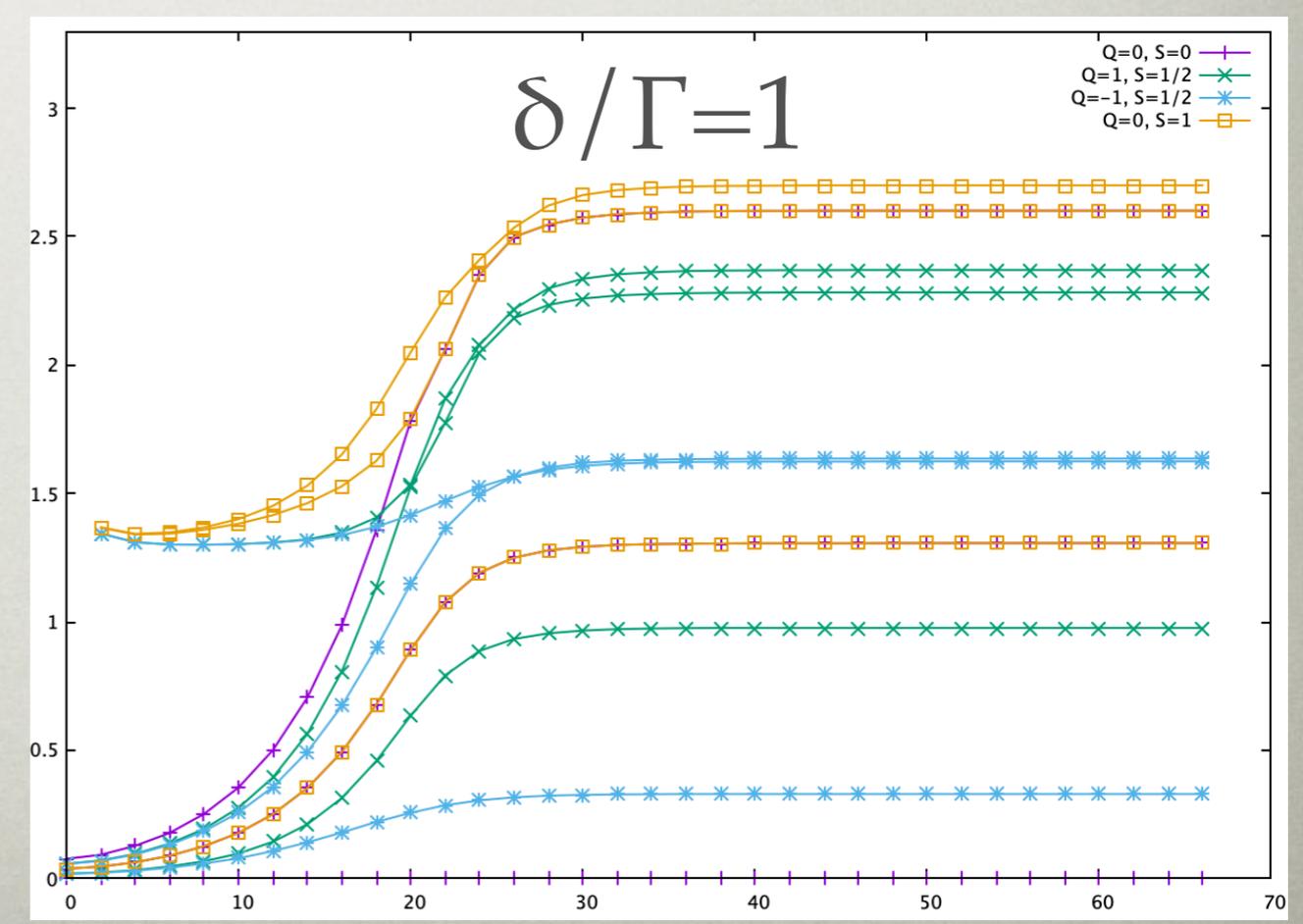
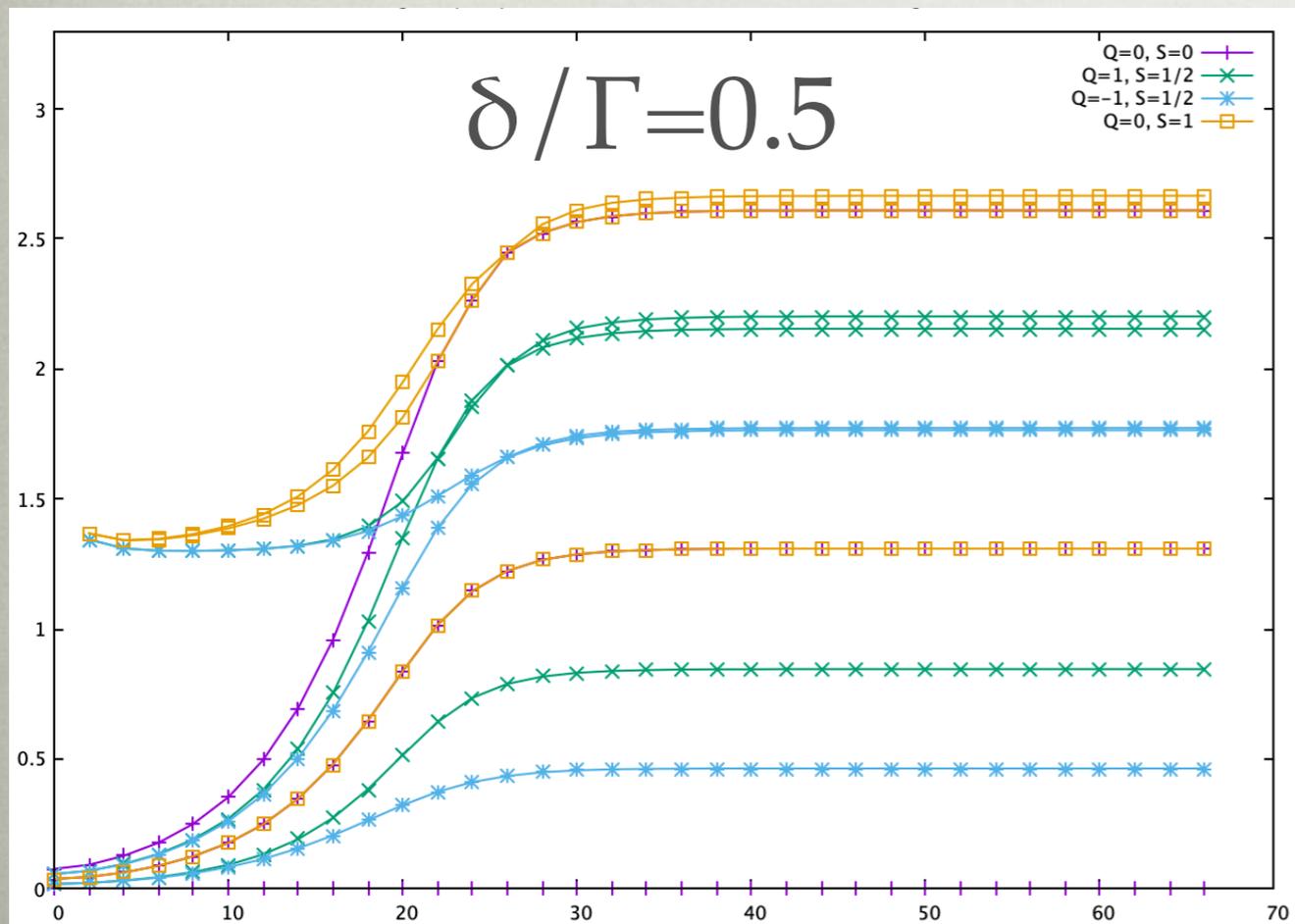
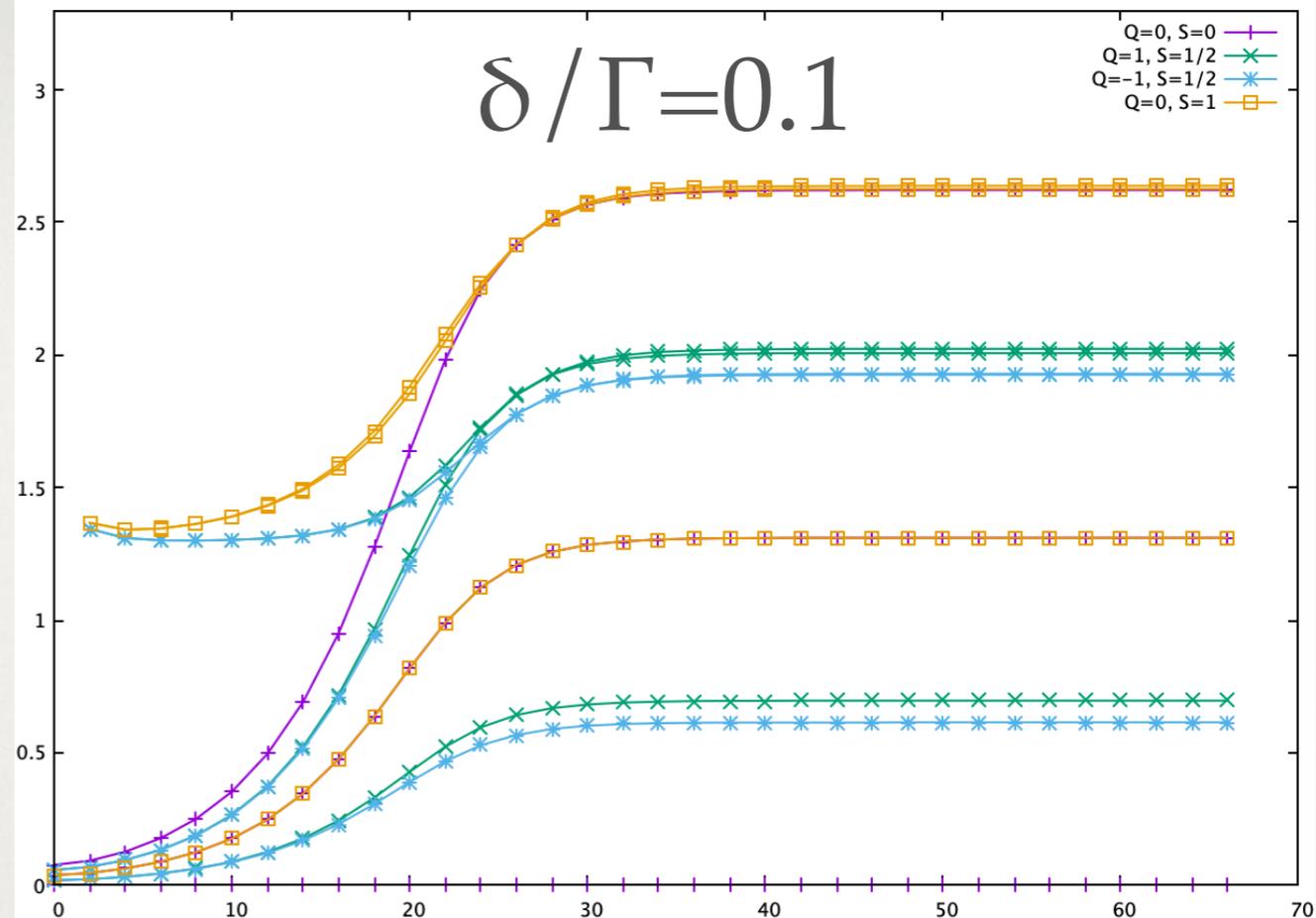
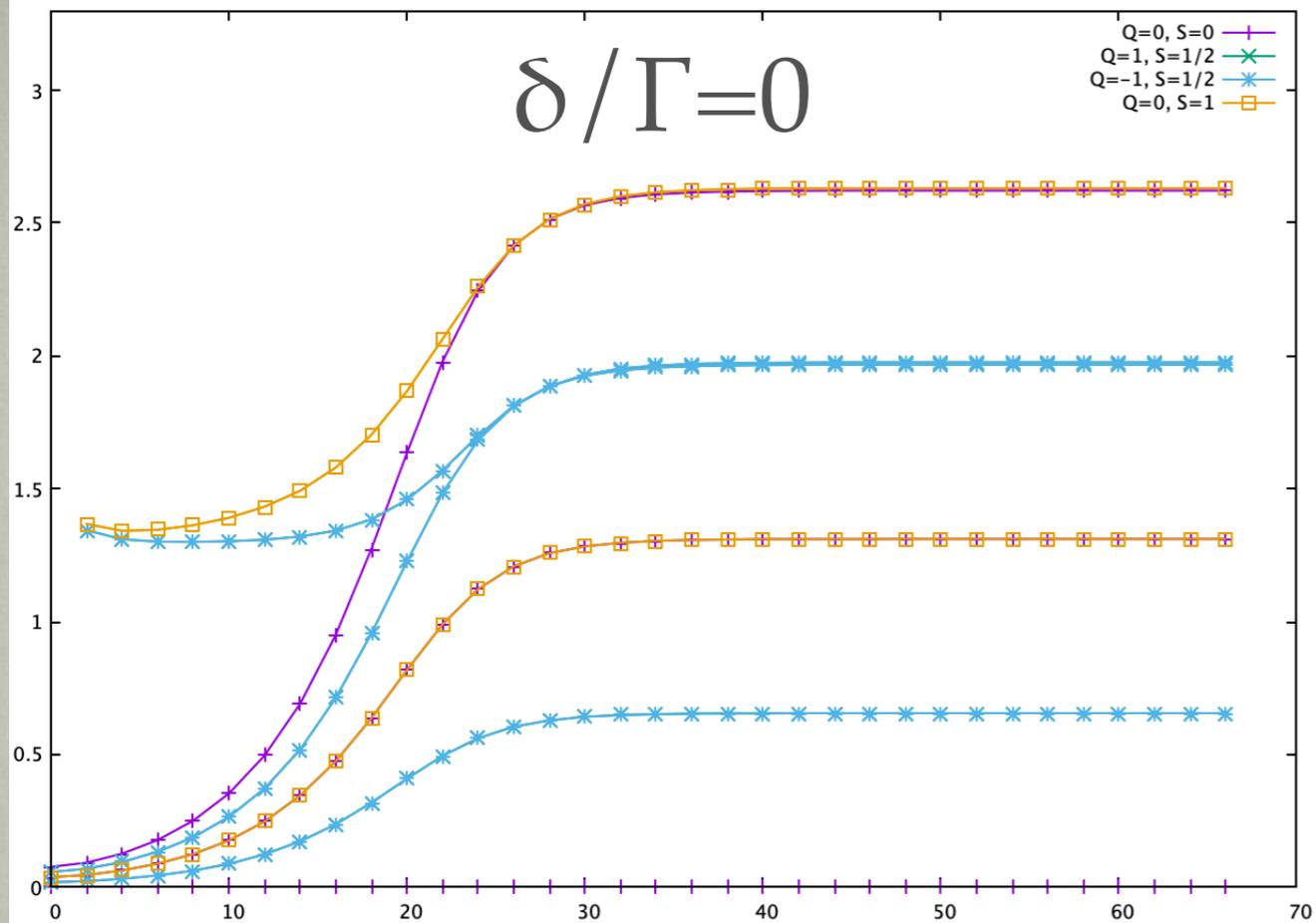
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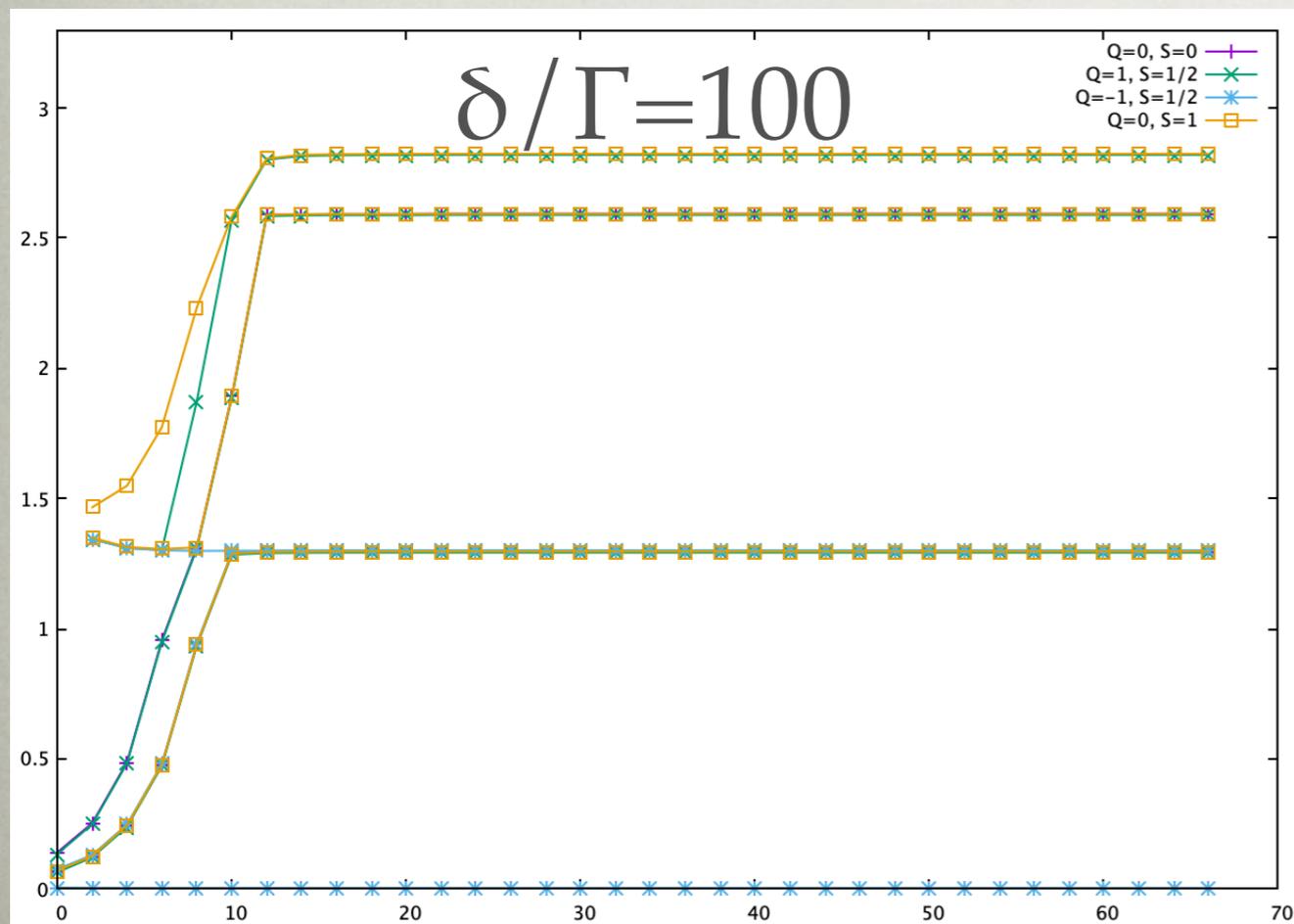
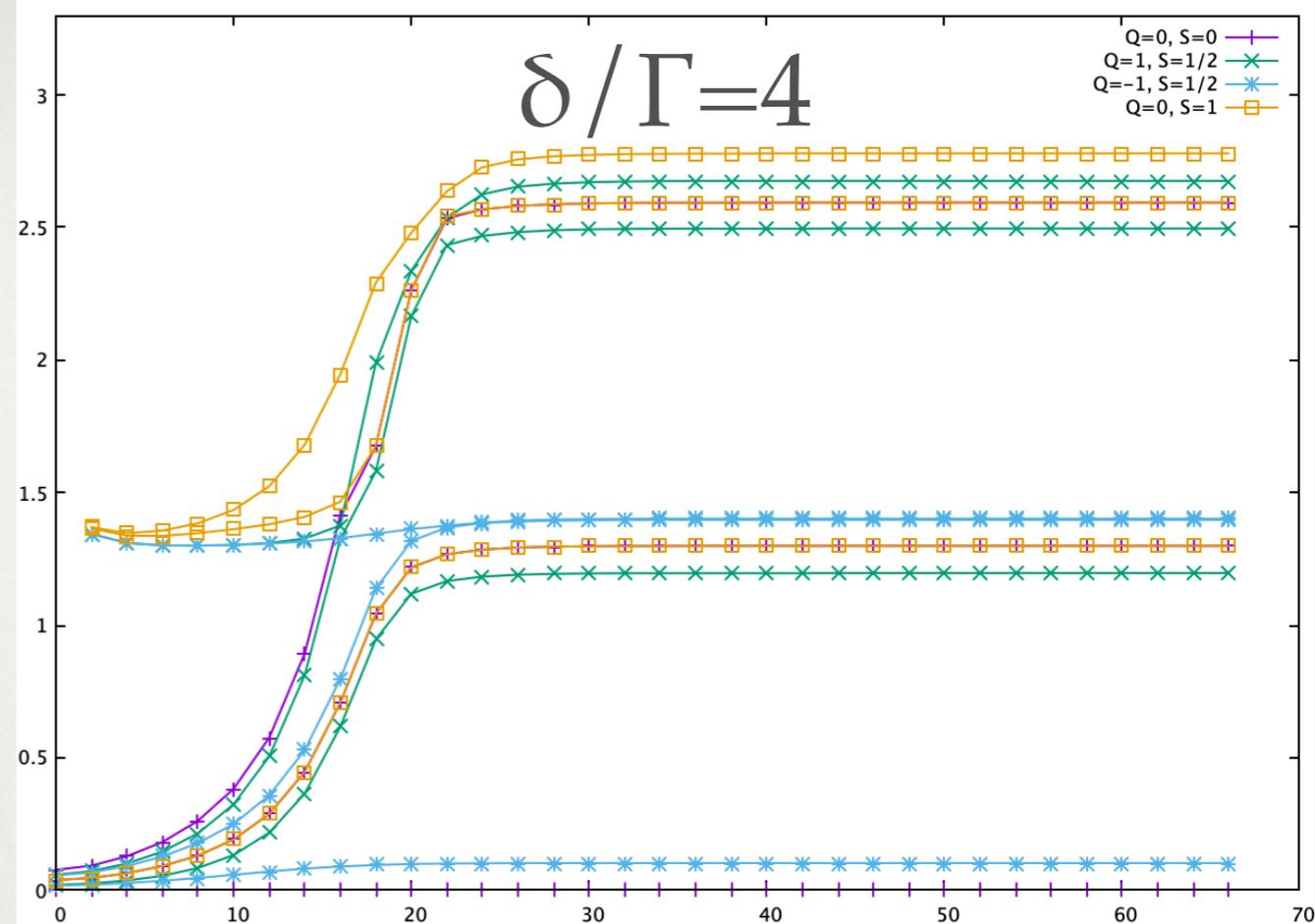
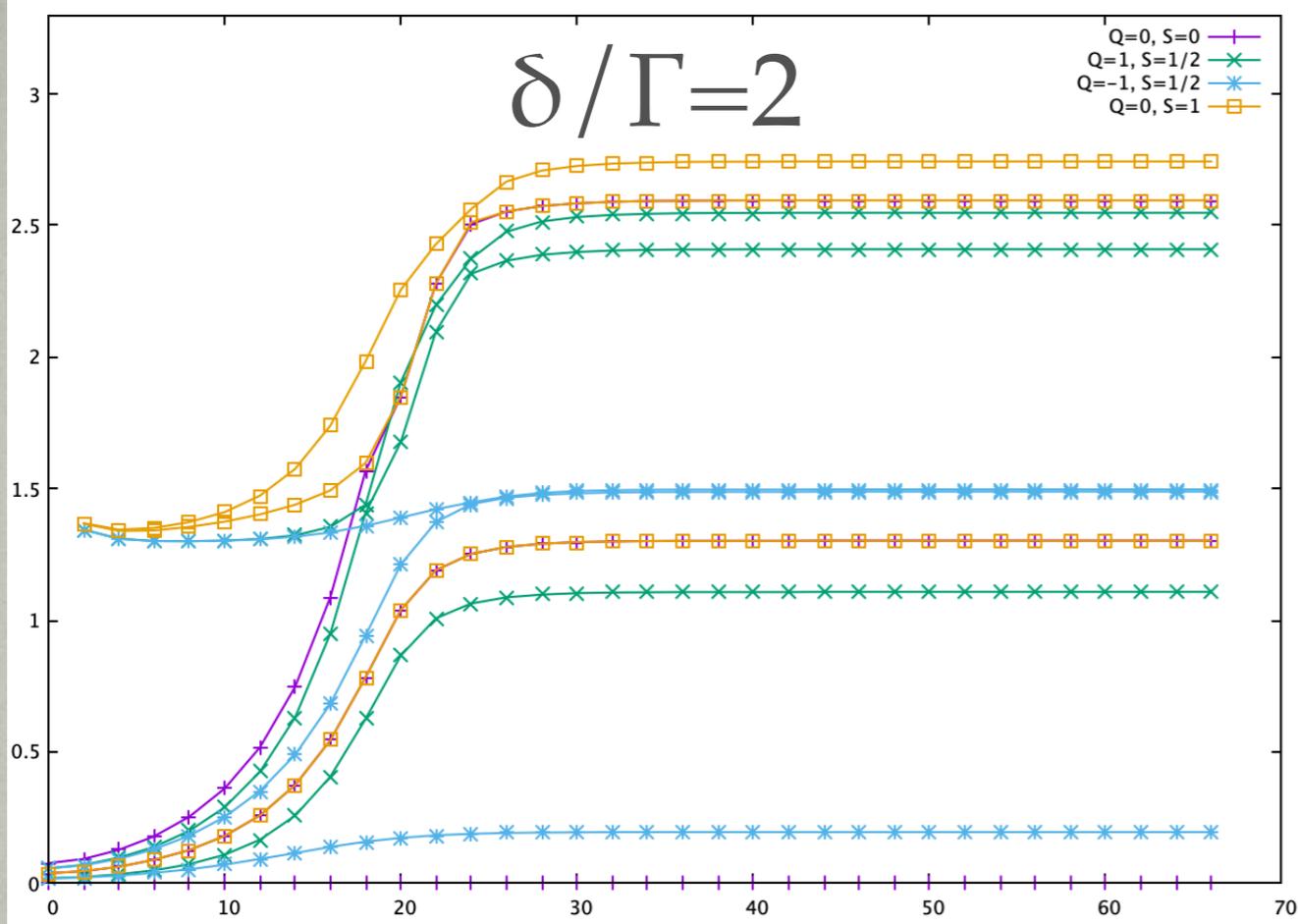
- Renormalization flow & analysis of fixed points and operators
- Thermodynamics properties
- Static quantities (expectation values)
- Dynamics properties (spectra, susceptibilities)
- Real-time evolution

# ANALYSIS

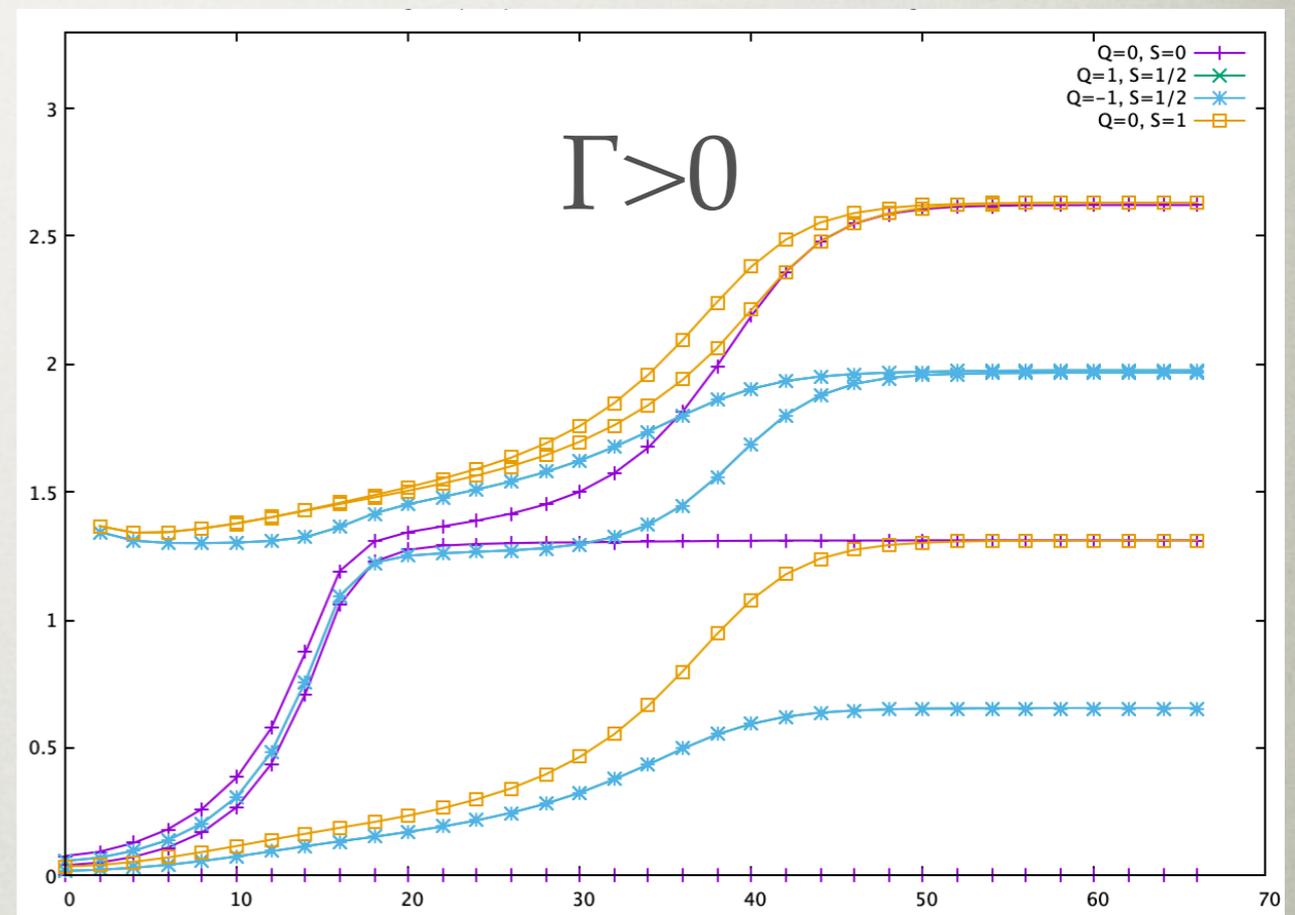
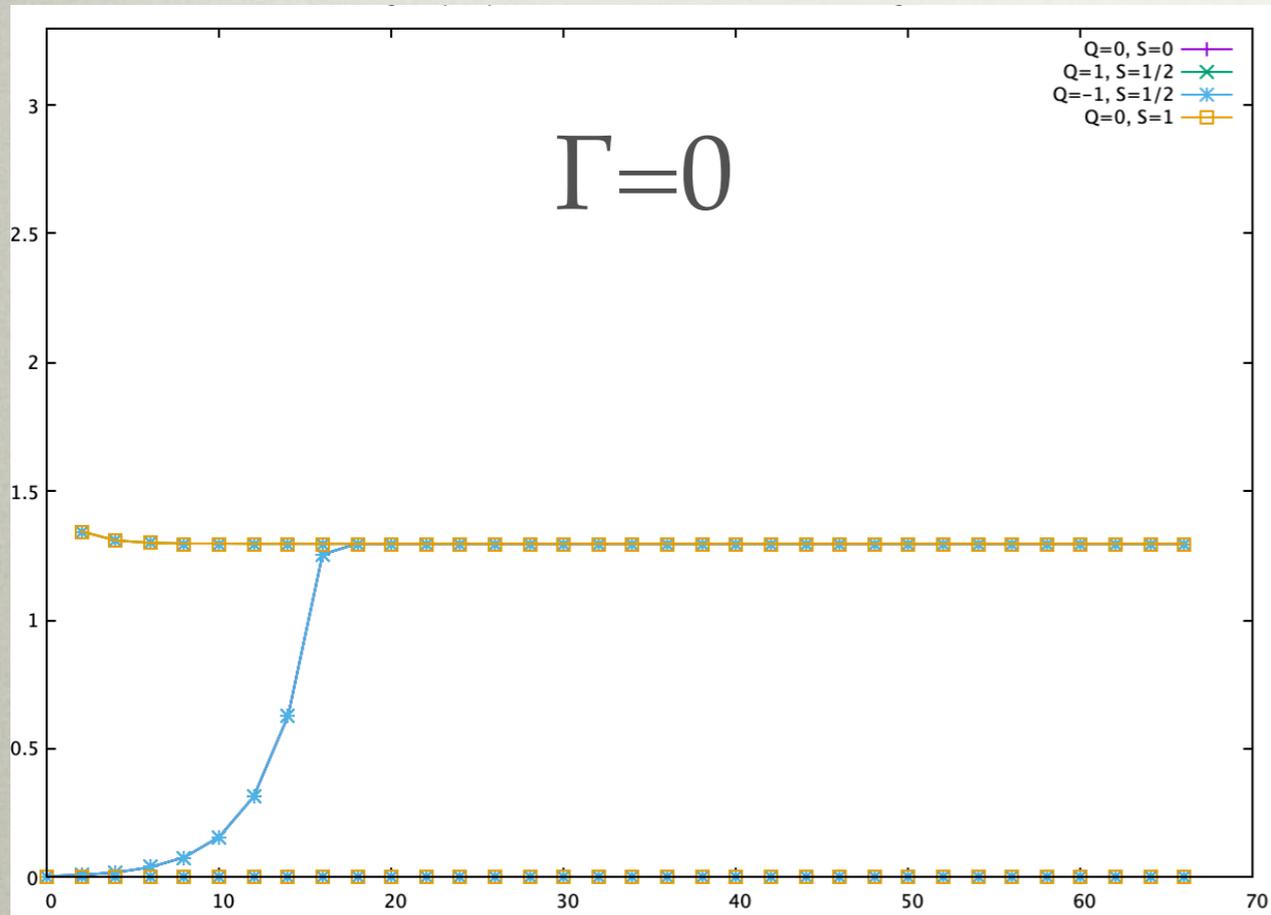
## RG FLOW DIAGRAMS (SPAGHETTI PLOTS)



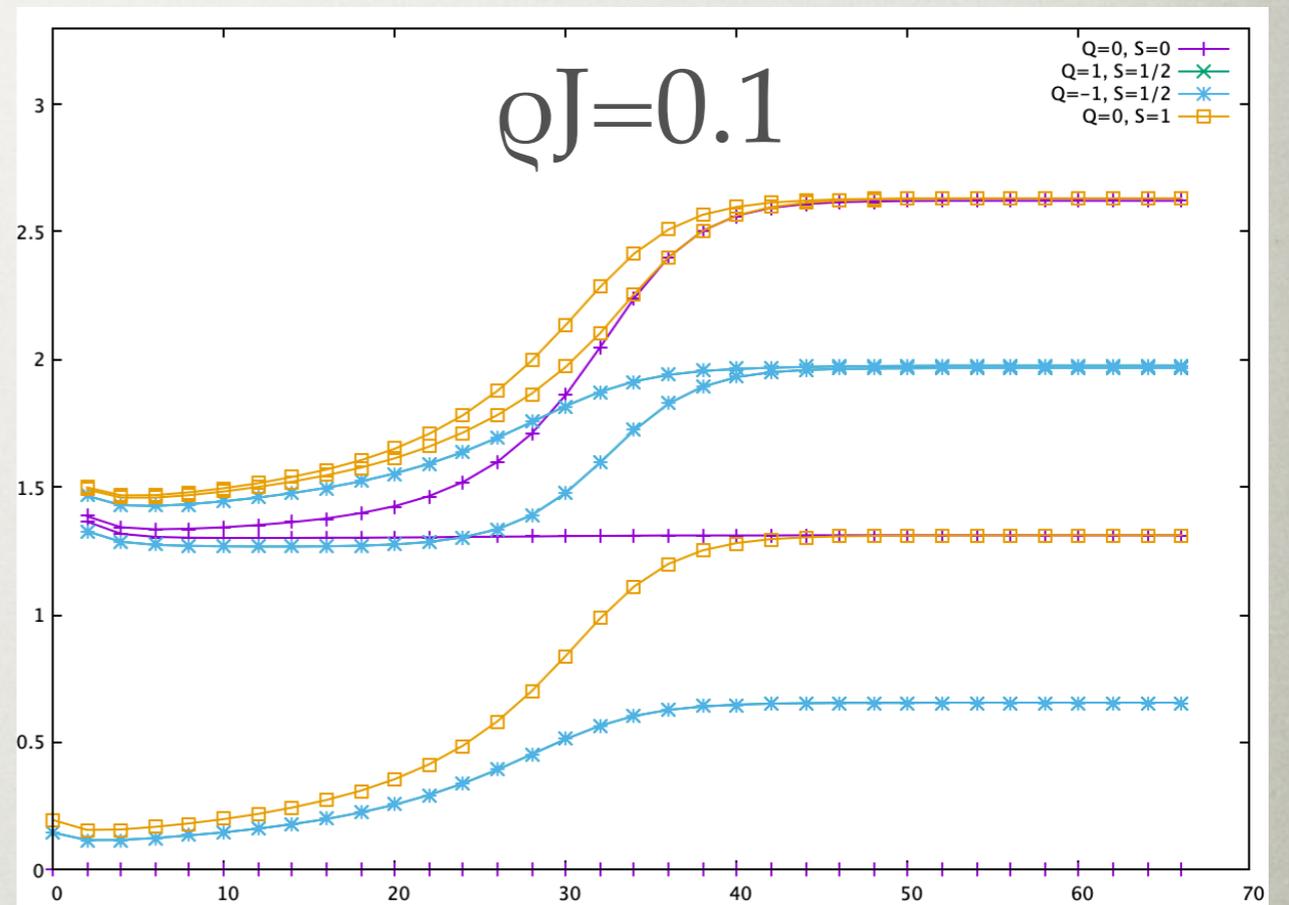
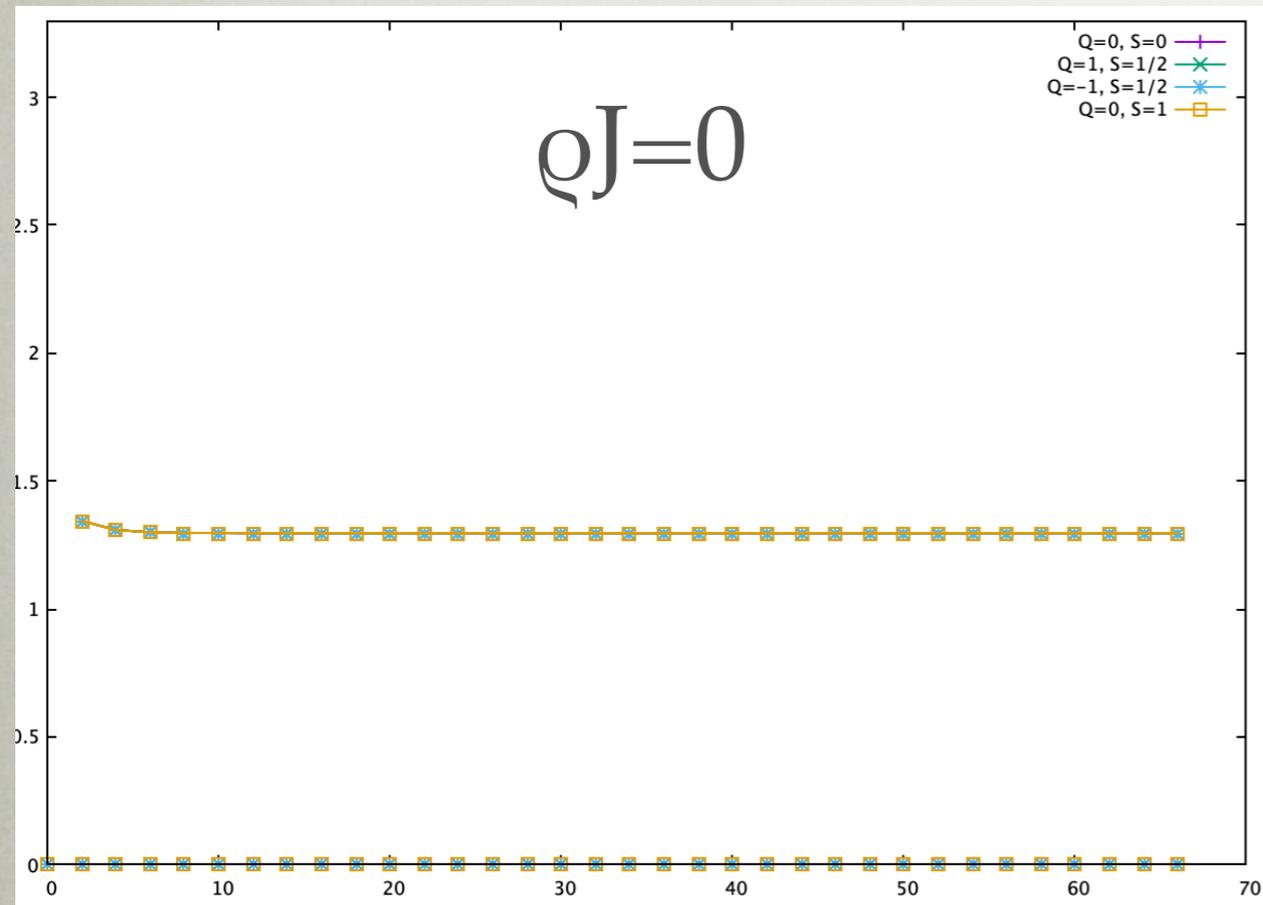




# SIAM



# Kondo model



# CALCULATION OF THERMODYNAMIC QUANTITIES

---

$$\rho = \frac{1}{Z} e^{-\beta H} \quad Z = \text{Tr}[e^{-\beta H}]$$

$$E = \langle H \rangle = \text{Tr}[\rho H] = \frac{\text{Tr}[H e^{-\beta H}]}{\text{Tr}[e^{-\beta H}]}$$

$$F = -k_B T \ln Z$$

$$S = -\frac{\partial F}{\partial T} \quad C = \frac{\partial E}{\partial T}$$

Trick: avoid numerical differentiation!

# ISOTHERMAL SUSCEPTIBILITY

---

$$H' = BS_z$$

$$\chi(T) = \frac{\partial \langle S_z \rangle}{\partial B}$$

Kubo, linear response theory:

$$\chi(T) = \int_0^\beta d\tau \langle S_z(\tau) S_z \rangle - \beta \langle S_z \rangle^2$$

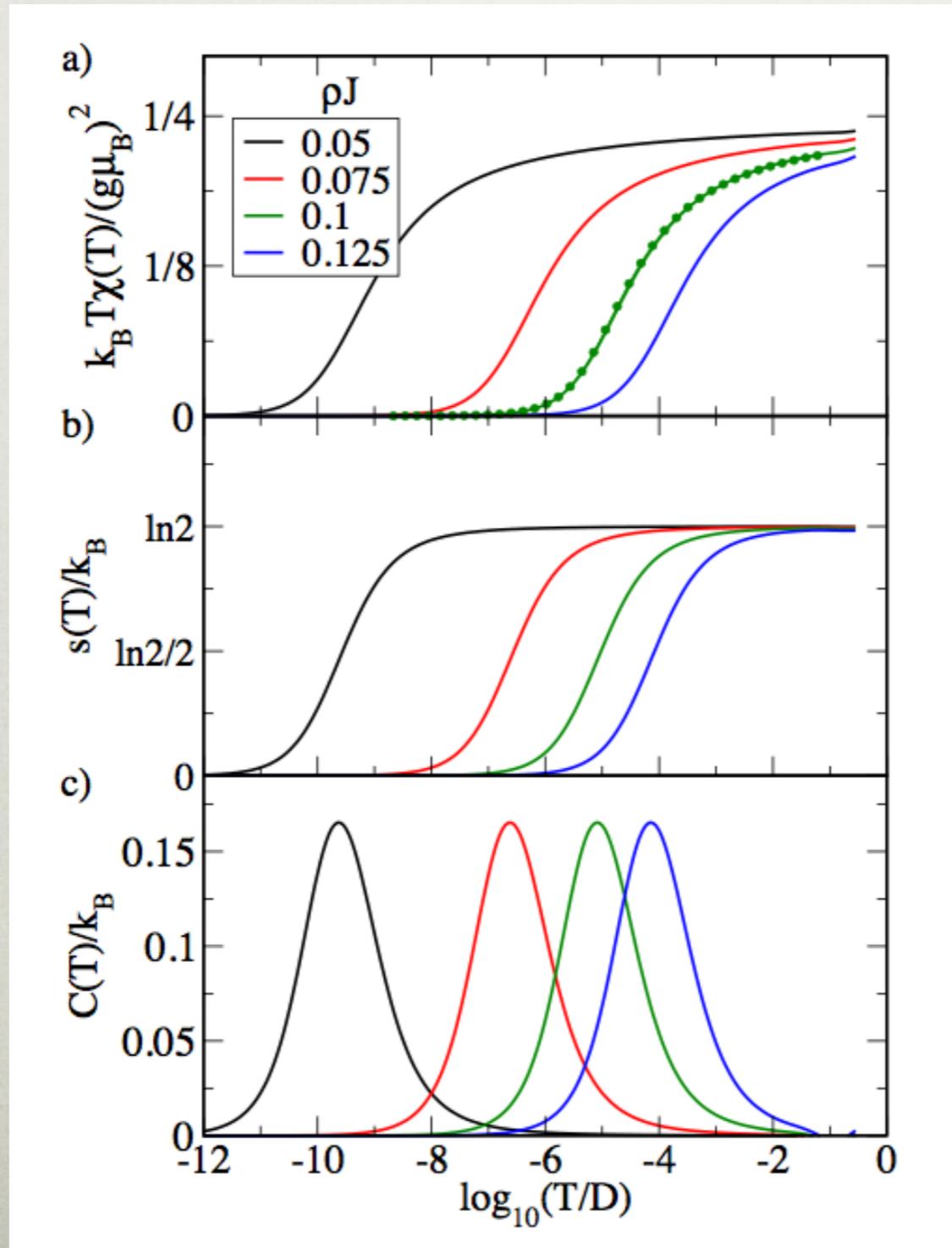
## IMPURITY CONTRIBUTION TO...

---

$$S_{\text{imp}}(T) = \frac{(E - F)}{T} - \frac{(E - F)_0}{T}$$

$$\chi_{\text{imp}}(T) = \frac{(g\mu_B)^2}{k_B T} \left( \langle S_z^2 \rangle - \langle S_z^2 \rangle_0 \right)$$

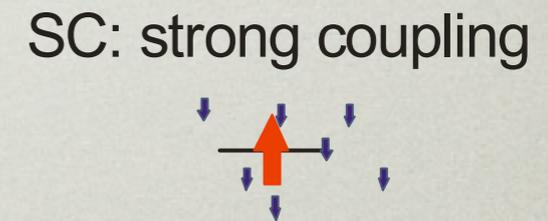
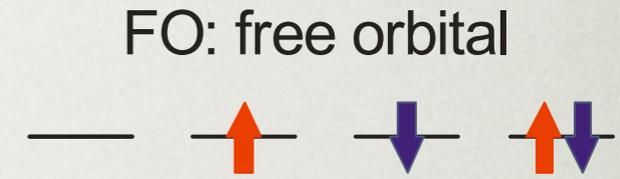
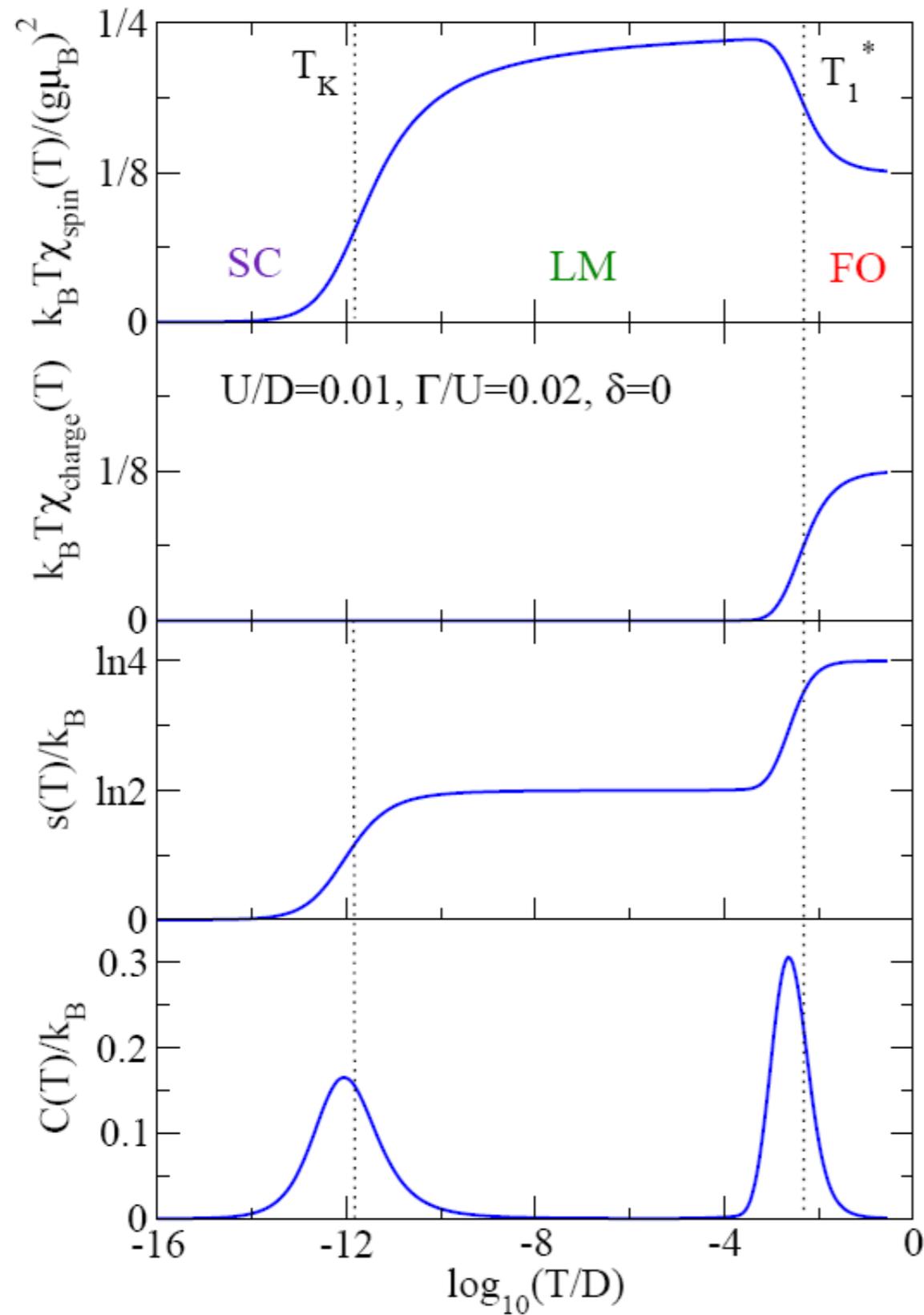
# THERMODYNAMICS OF THE KONDO MODEL

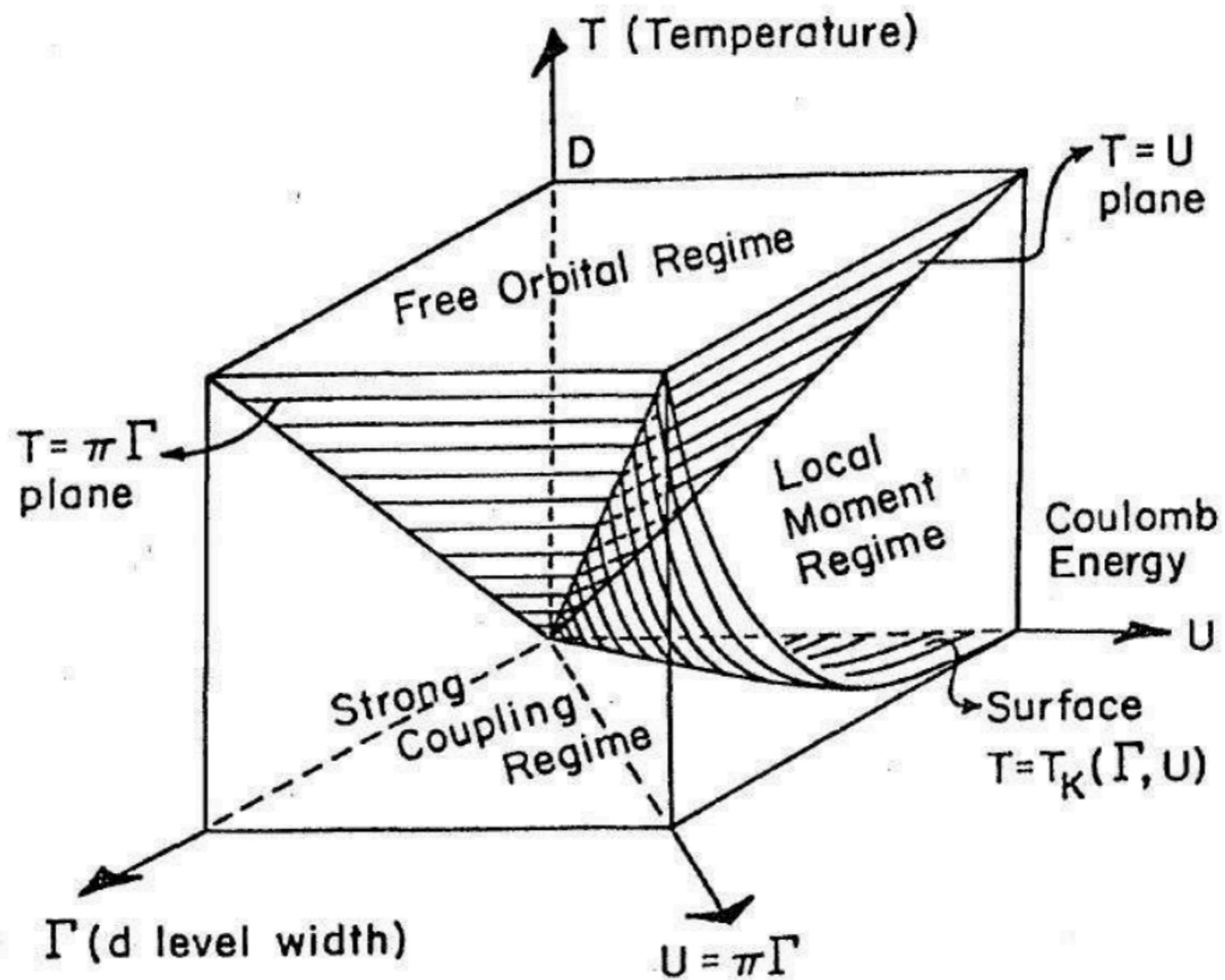


$$T_K \chi(T_K) = 0.07$$

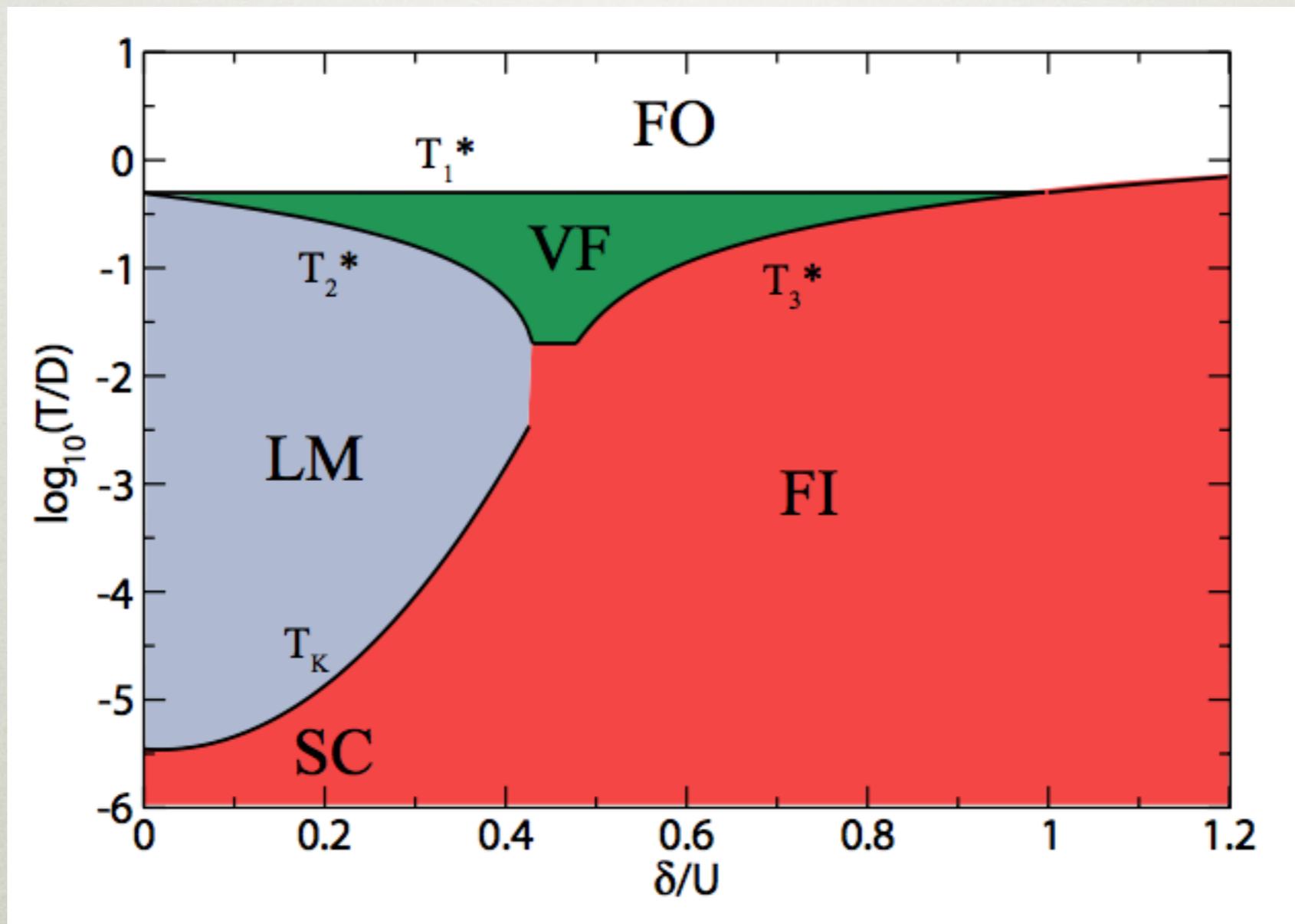
Wilson's definition of  
the Kondo temperature

# SINGLE IMPURITY ANDERSON MODEL





# PHASE DIAGRAM OF SIAM



# PROBLEMS

---

1. Study runtime dependence vs. "keepenergy"
2. Plot the amplitude of oscillations in entropy (between neighbouring T points) vs.  $\Lambda$  for a single-z calculation
3. Plot the thermodynamic properties of SIAM for a range of  $\delta$  from 0 to  $\sim U$ . Follow the evolution of fixed points.
4. Study the thermodynamic properties of SIAM for  $U$  decreasing towards 0. What is happening with the local-moment regime?
5. Verify the scaling of the Kondo temperature,  $\exp(-\pi U / 8 \Gamma)$ , at fixed  $U$  and variable  $\Gamma$ .
6. Analyse a finite-size spectrum in terms of single-particle energies.
7. How do the finite-size spectra (RG flow diagrams) depend on  $\Lambda$ ?
8. Calculate  $S_z$  vs.  $B$  dependence at  $T=0$  for different  $J$  in the Kondo model.