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# PG5295 – Muitos Corpos

1 – Electronic Transport in  
Quantum dots

2 – Kondo effect: Intro/theory.

3 – Kondo effect in nanostructures

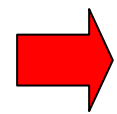
Prof. Luis Gregório Dias – DFMT

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1 – Electronic Transport in  
Quantum dots



2 – Kondo effect: Intro/theory.

3 – Kondo effect in nanostructures

Prof. Luis Gregório Dias – DFMT

Basic references for today's lecture:

A.C. Hewson, *The Kondo Problem to Heavy Fermions*, Cambridge Press, 1993.

R. Bulla, T. Costi, Prushcke, *Rev. Mod. Phys* (in press) arXiv 0701105.

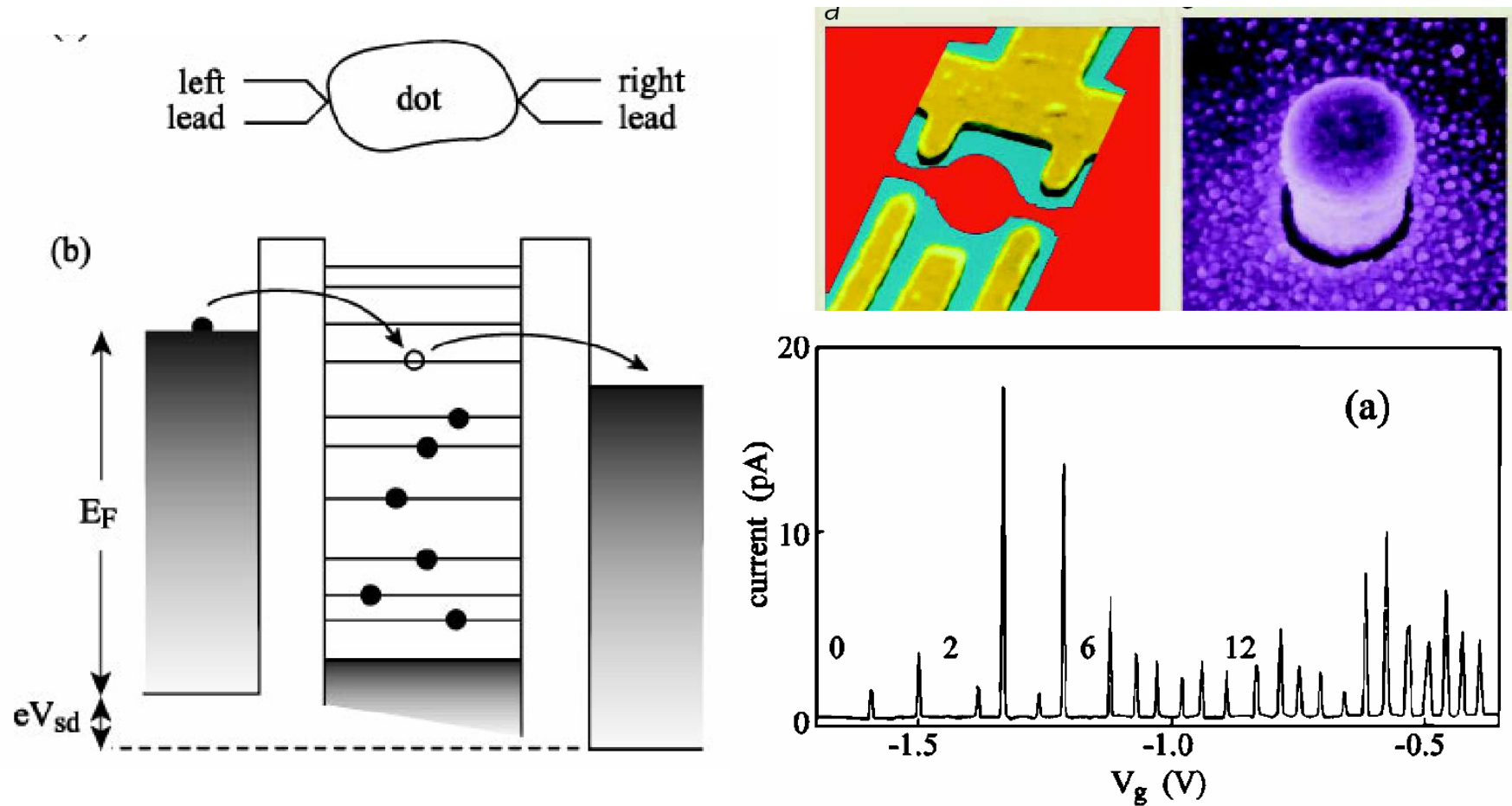
K.G. Wilson, *Rev. Mod. Phys.* **47** 773 (1975).

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# Lecture 2: Outline

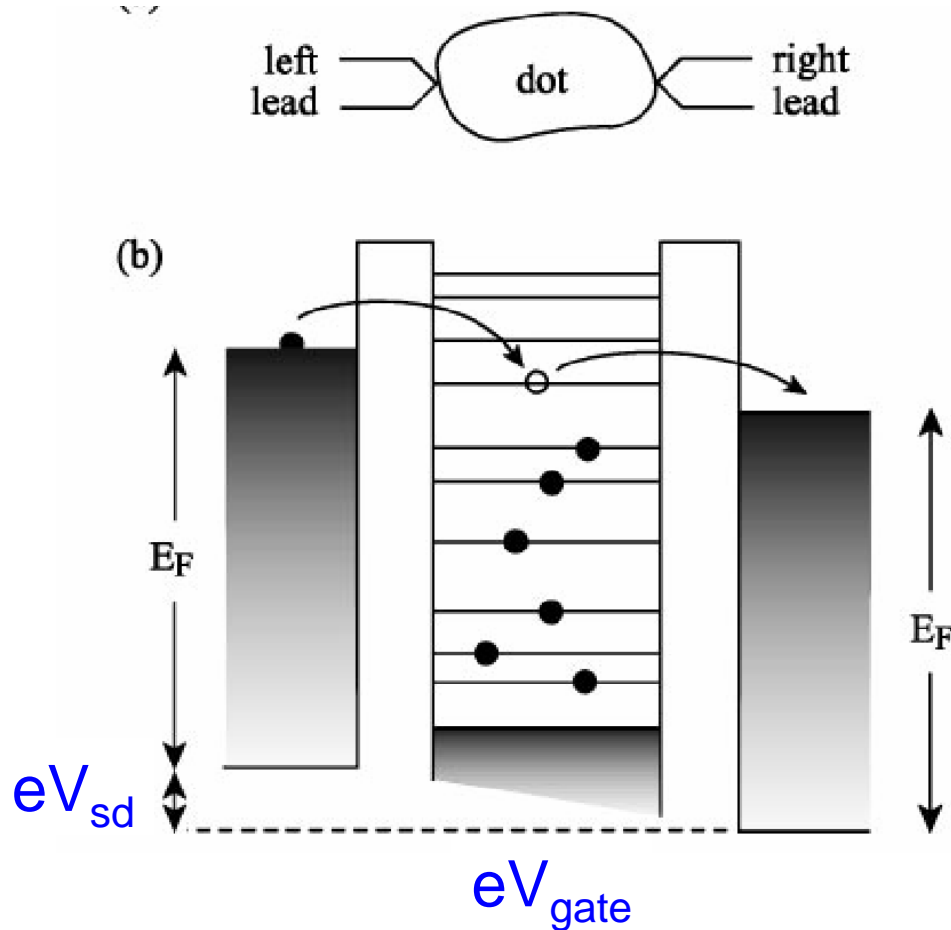
- Kondo effect: Intro.
  - Kondo's original idea: Perturbation theory.
  - Numerical Renormalization Group (NRG).
  - s-d and Anderson models.
  - NRG results for the local density of states.
-

# Coulomb Blockade in Quantum Dots

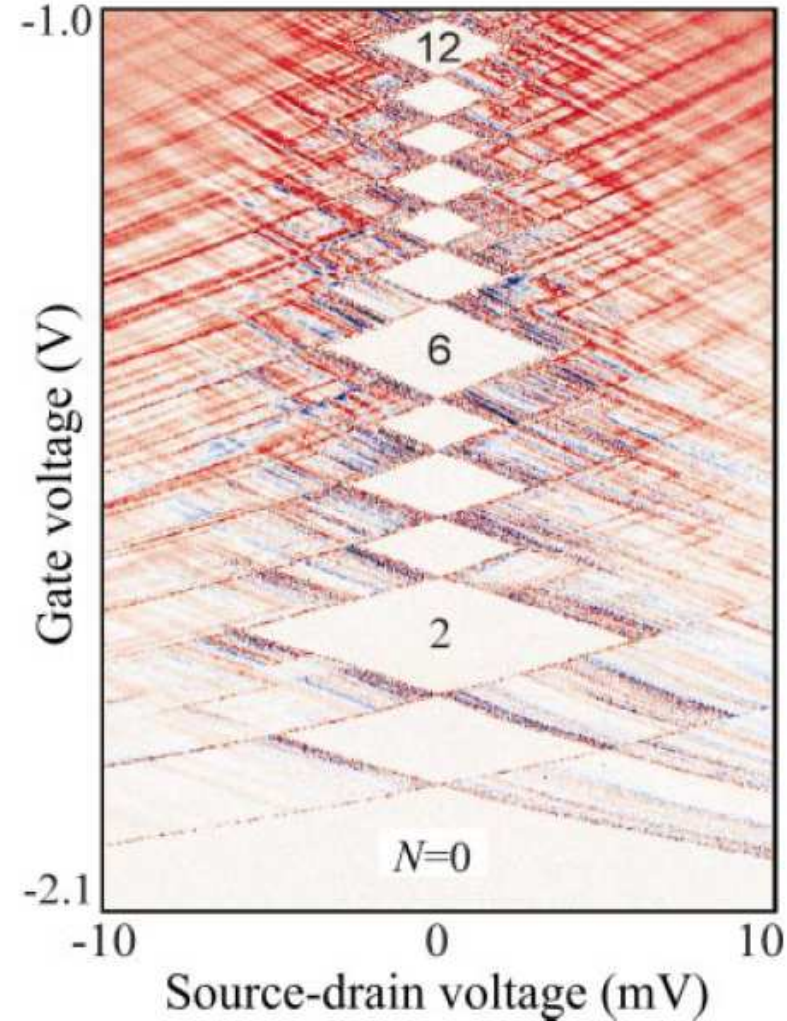


Coulomb Blockade in Quantum Dots: “dot spectroscopy”

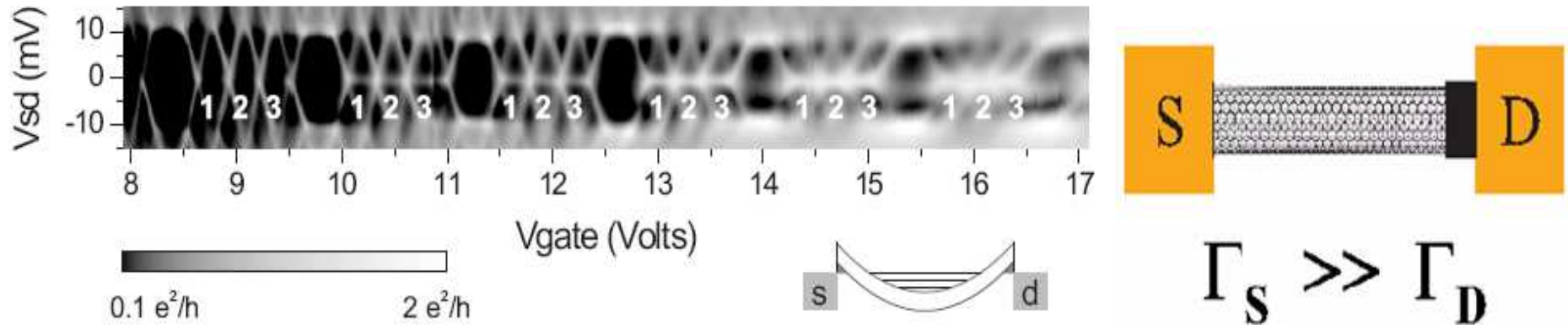
# “Coulomb Diamonds” (Stability Diagram)



Coulomb Blockade in Quantum Dots

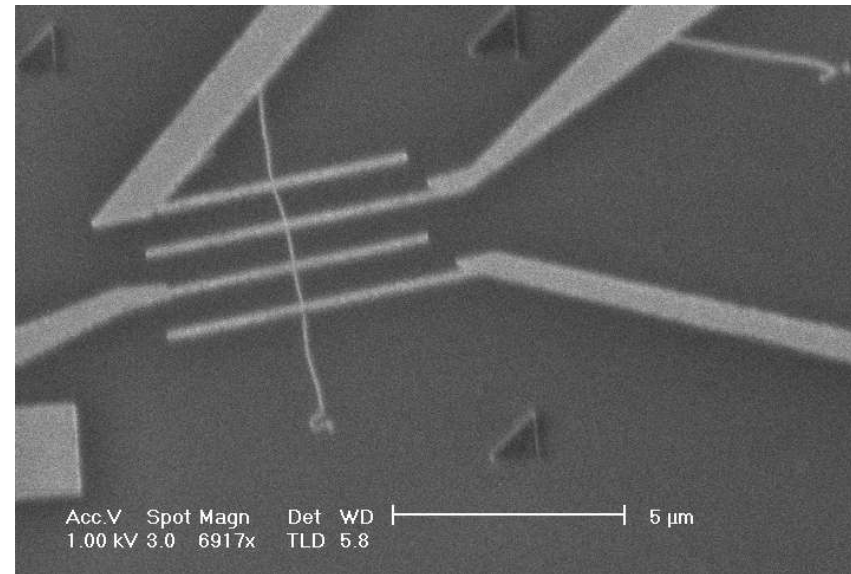


# “Carbon nanotube Quantum dots”.



Makarovski, Zhukov, Liu, Filkenstein *PRB* **75** 241407R (2007).

- Carbon nanotubes deposited on top of metallic electrodes.
- Quantum dots defined *within* the carbon nanotubes.
- More structure than in quantum dots: “shell structure” due to *orbital* degeneracy.



Gleb Filkenstein's webpage: <http://www.phy.duke.edu/~gleb/>

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# Lecture 2 (coming up...)

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# “More is Different”



“ The behavior of large and complex aggregates of elementary particles, it turns out, is not to be understood in terms of simple extrapolation of the properties of a few particles.

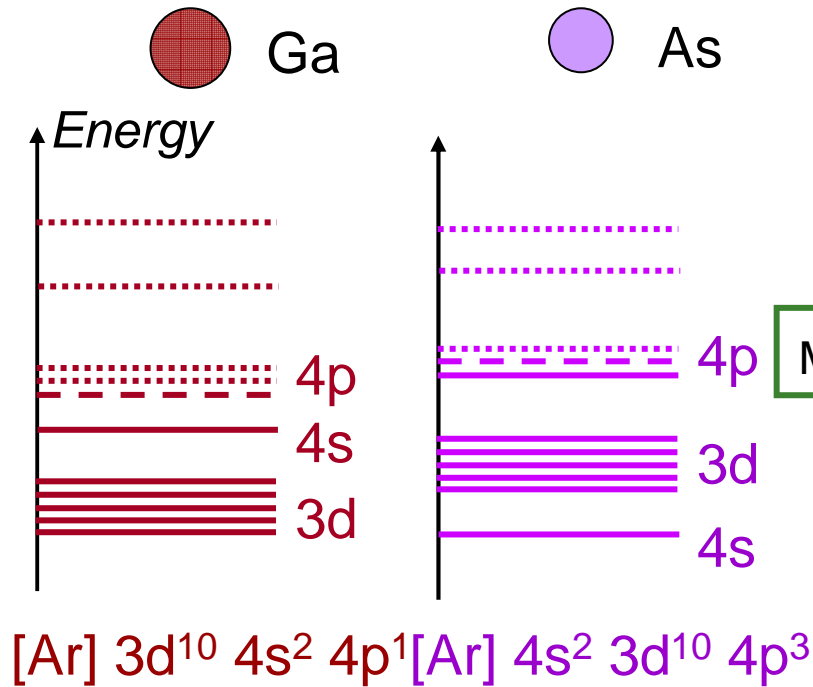
Instead, at each level of complexity entirely new properties appear and the understanding of the new behaviors requires research which I think is as fundamental in its nature as any other.“

Phillip W. Anderson, “More is Different”,  
*Science* **177** 393 (1972)

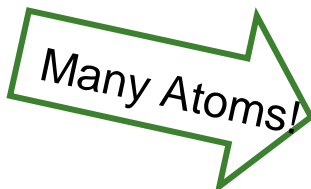
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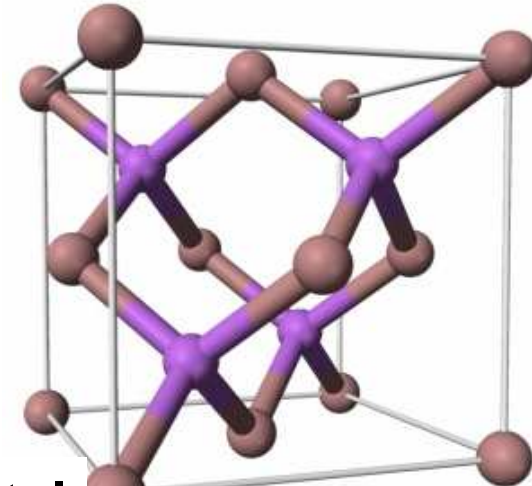
# Can you make “atoms” out of atoms?



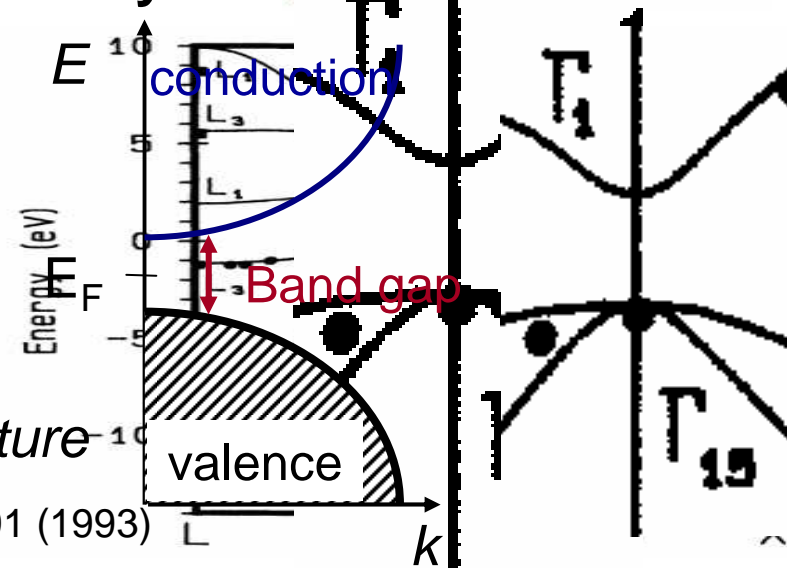
Atomic Energy levels



Band structure

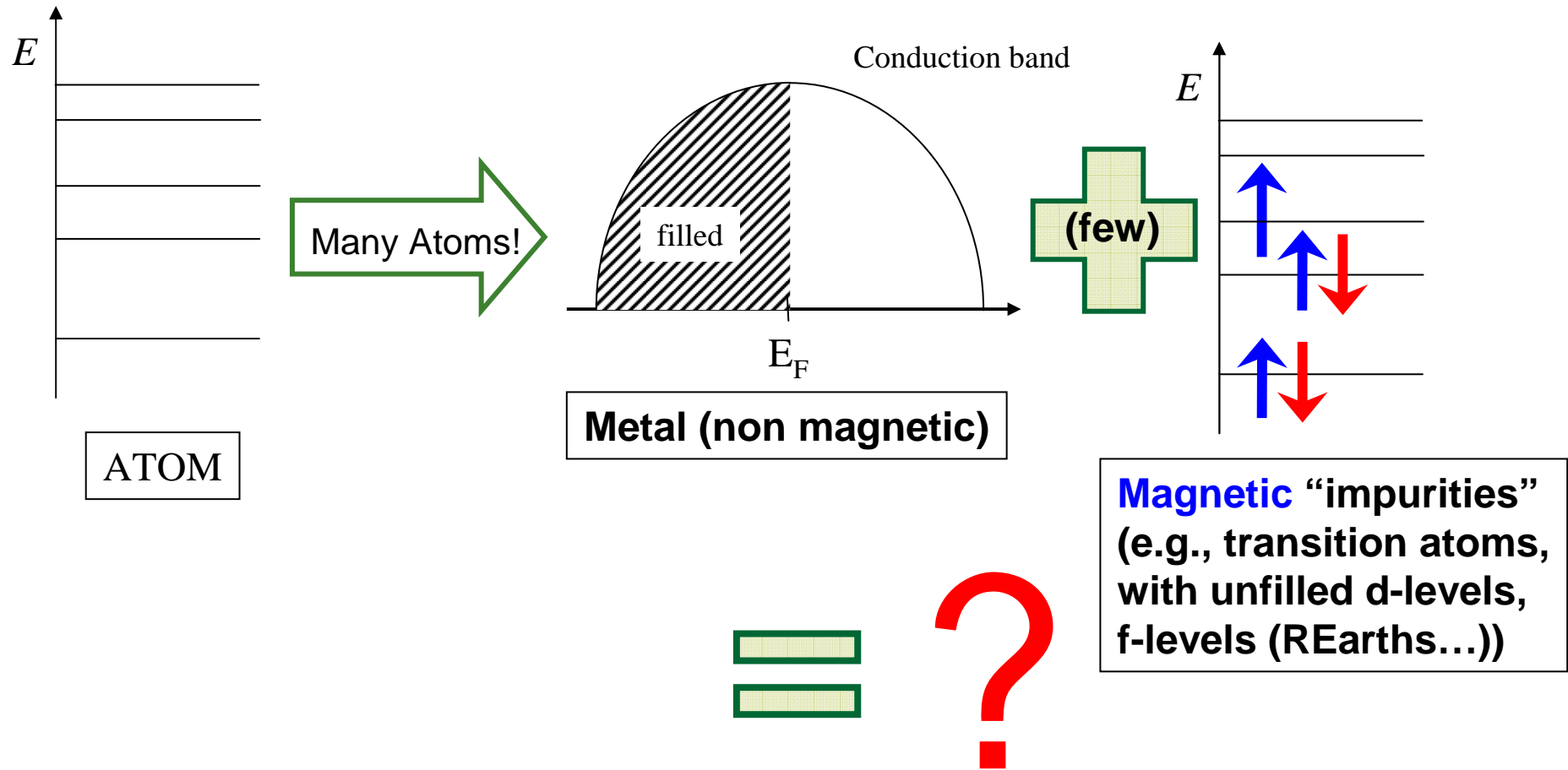


GaAs crystal



M. Rohlfing et al. PRB **48** 17791 (1993)

# From atoms to metals, plus atoms...



Is the resulting compound still a metal ?

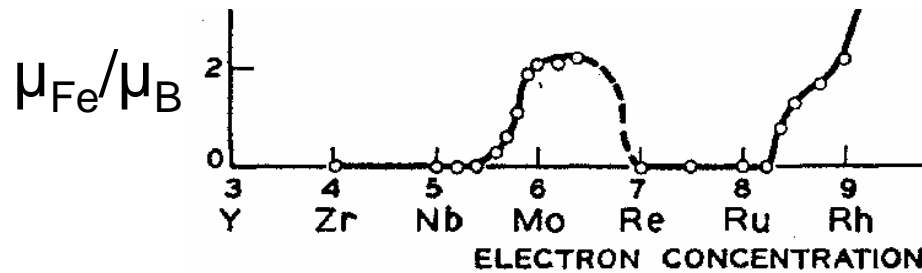
# Kondo effect

- Magnetic impurity in a metal.

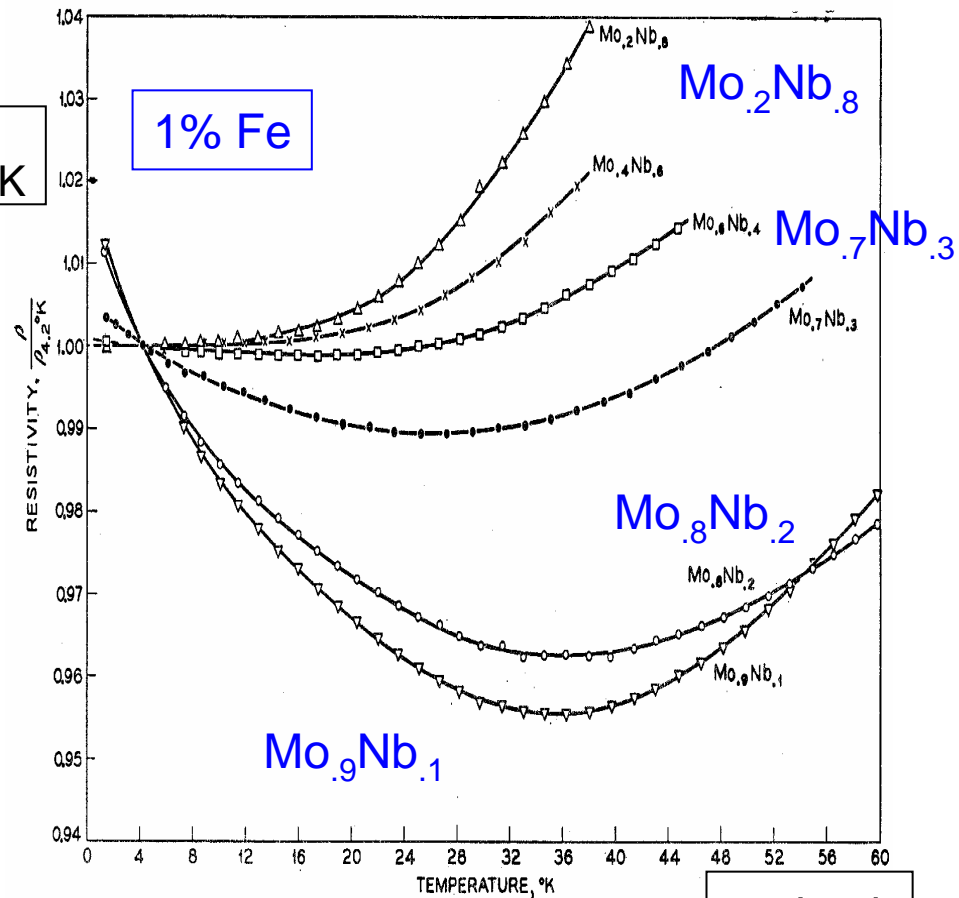
- 30's - Resistivity measurements: **minimum in  $\rho(T)$** ;

$T_{\min}$  depends on  $c_{\text{imp}}$ .

- 60's - Correlation between the existence of a Curie-Weiss component in the susceptibility (**magnetic moment**) and resistance minimum.



$$\rho/\rho_{4.2\text{K}}$$

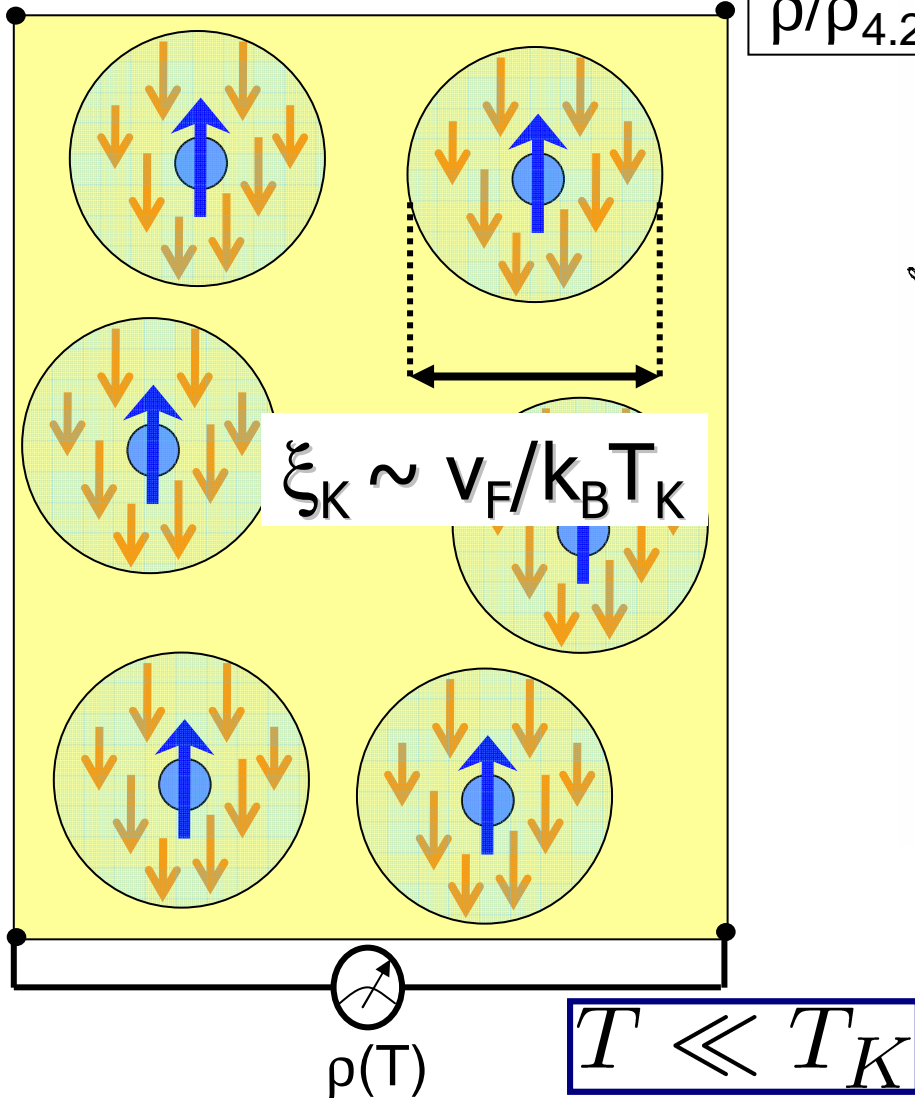


T (°K)

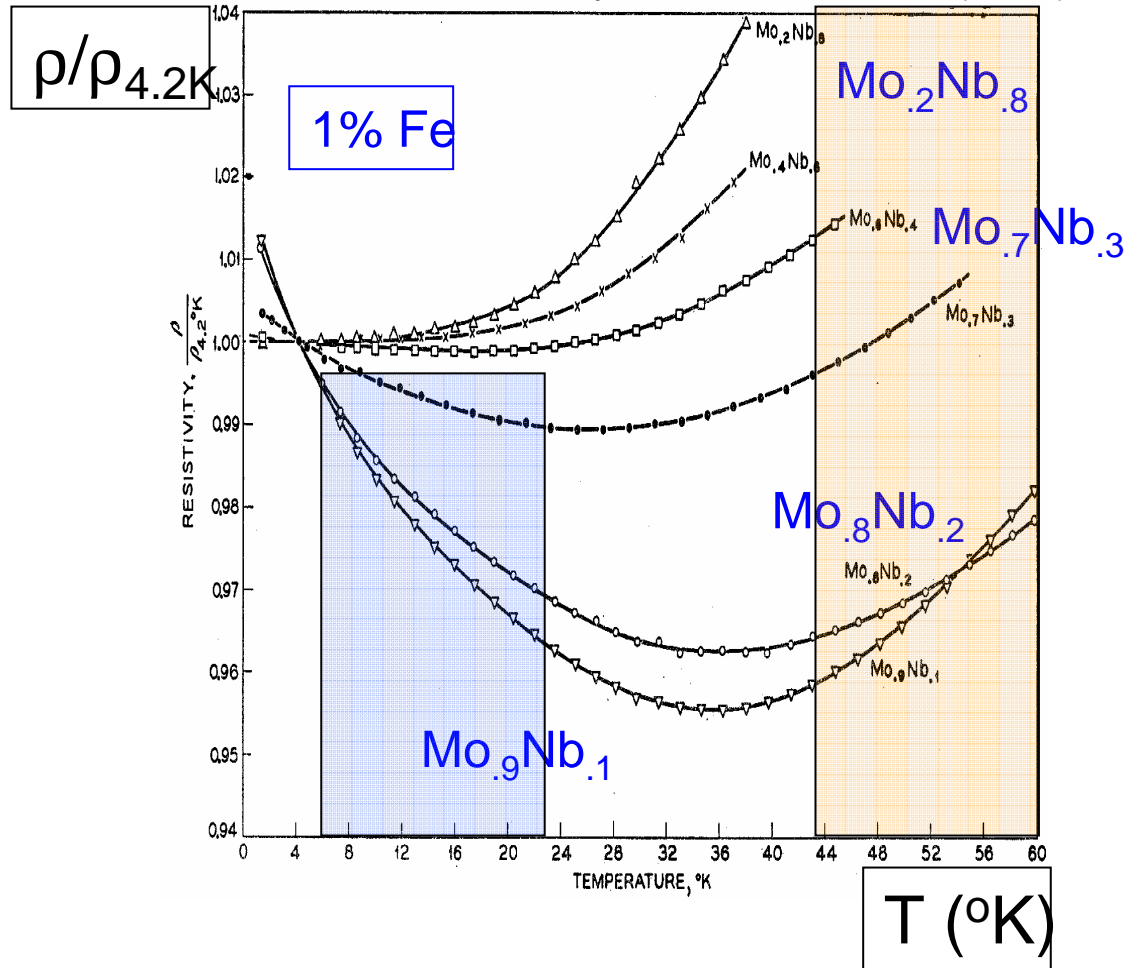
Top: A.M. Clogston *et al* Phys. Rev. **125** 541(1962).

Bottom: M.P. Sarachik *et al* Phys. Rev. **135** A1041 (1964).

# Kondo effect



M.P. Sarachik *et al* Phys. Rev. **135** A1041 (1964).

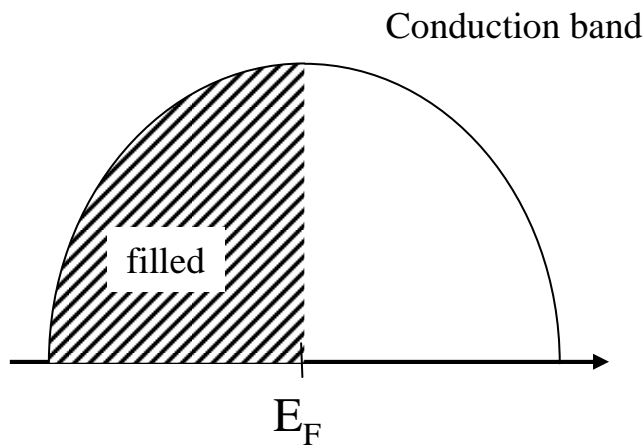


Resistivity increases with decreasing  $T$  (Kondo effect): the Kondo effect

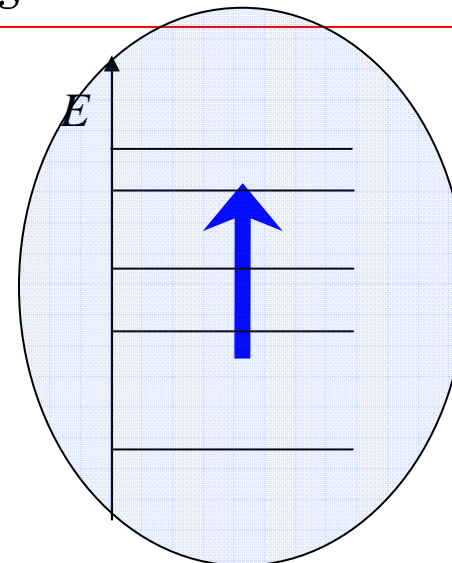
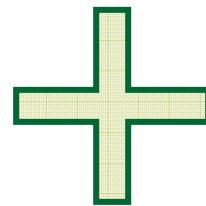
# Kondo problem: s-d Hamiltonian

- Kondo problem: s-wave coupling with spin impurity (s-d model):

$$H_K = \sum_{\mathbf{k}s} \epsilon_{\mathbf{k}s} \hat{n}_{\mathbf{k}s} + J \sum_{\mathbf{k}s; \mathbf{k}'s'} c_{\mathbf{k}s}^\dagger (\mathbf{S} \cdot \vec{\sigma})_{ss'} c_{\mathbf{k}'s'}$$



**Metal (non magnetic, s-band)**



**Magnetic impurity (unfilled d-level)**

# Kondo's explanation for $T_{\min}$ (1964)

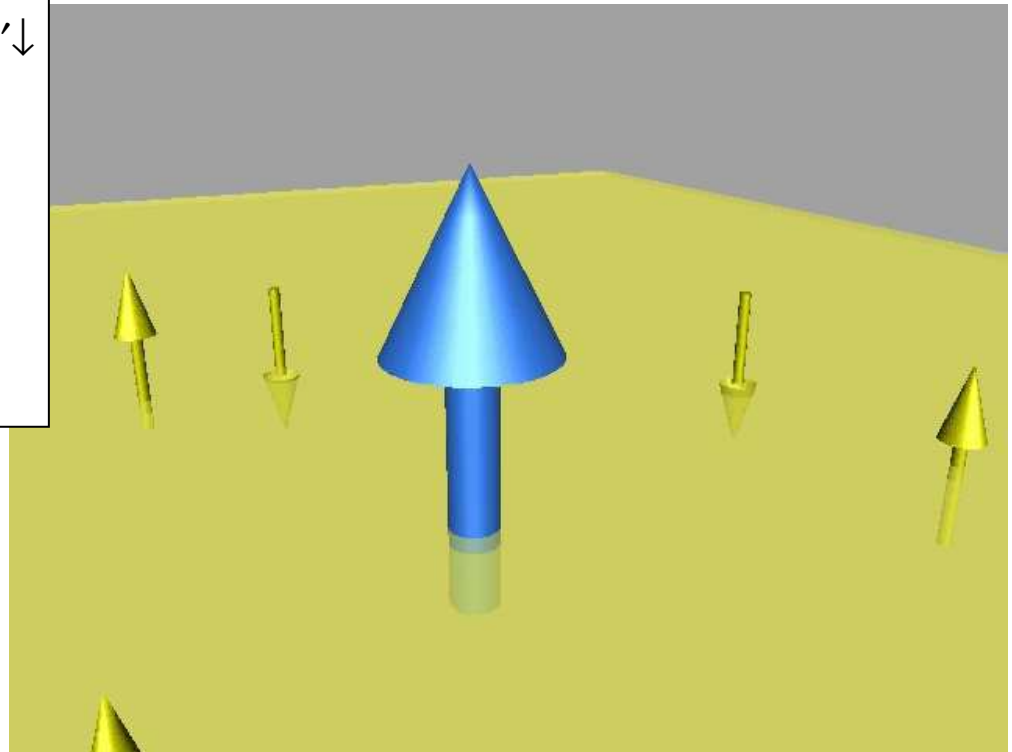
$$H_{s-d} = J \sum_{k,k'} S^+ c_{k\downarrow}^\dagger c_{k'\uparrow} + S^- c_{k\uparrow}^\dagger c_{k'\downarrow}$$

**Spin:  $J > 0$  AFM**

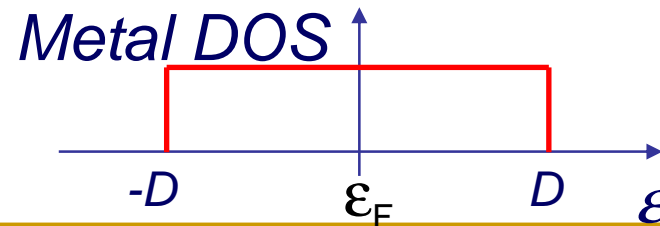
$$+ S_z (c_{k\uparrow}^\dagger c_{k'\uparrow} - c_{k\downarrow}^\dagger c_{k'\downarrow})$$

$$+ \sum_k e_k c_{k\sigma}^\dagger c_{k\sigma}$$

**Metal: Free waves**

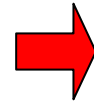


- **Many-body** effect: virtual bound state near the Fermi energy.
- AFM coupling ( $J > 0$ ) → “spin-flip” scattering
- Kondo problem: s-wave coupling with spin impurity (**s-d model**):



# Kondo's explanation for $T_{\min}$ (1964)

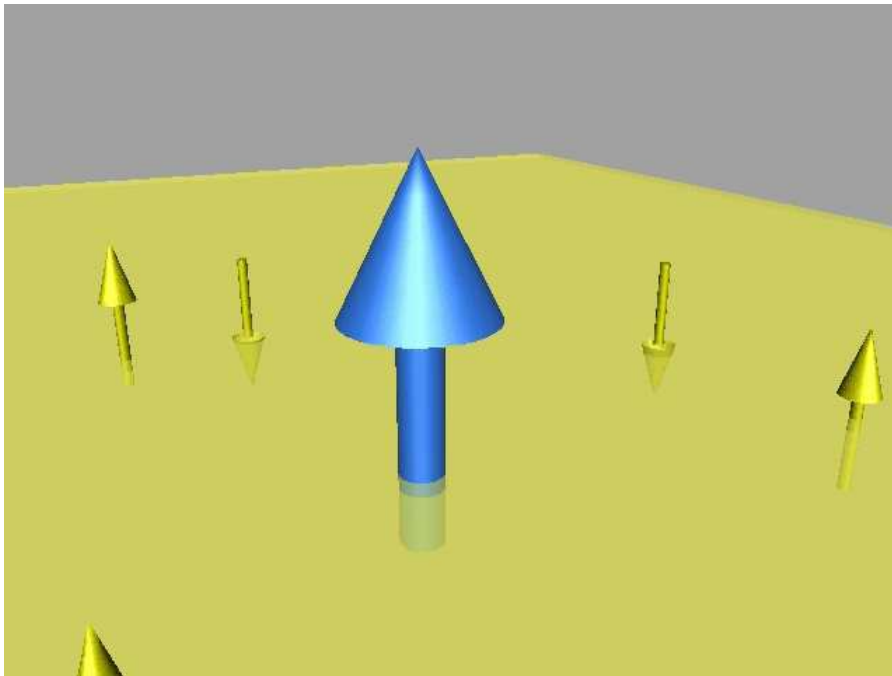
- Perturbation theory in  $J^3$ :
  - Kondo calculated the conductivity in the linear response regime



$$R_{\text{imp}}^{\text{spin}} \propto J^2 \left[ 1 - 4J\rho_0 \log\left(\frac{k_B T}{D}\right) \right]$$

$$R_{\text{tot}}(T) = aT^5 - c_{\text{imp}} R_{\text{imp}} \log\left(\frac{k_B T}{D}\right)$$

$$T_{\min} = \left( \frac{R_{\text{imp}} D}{5ak_B} \right)^{1/5} c_{\text{imp}}^{1/5}$$

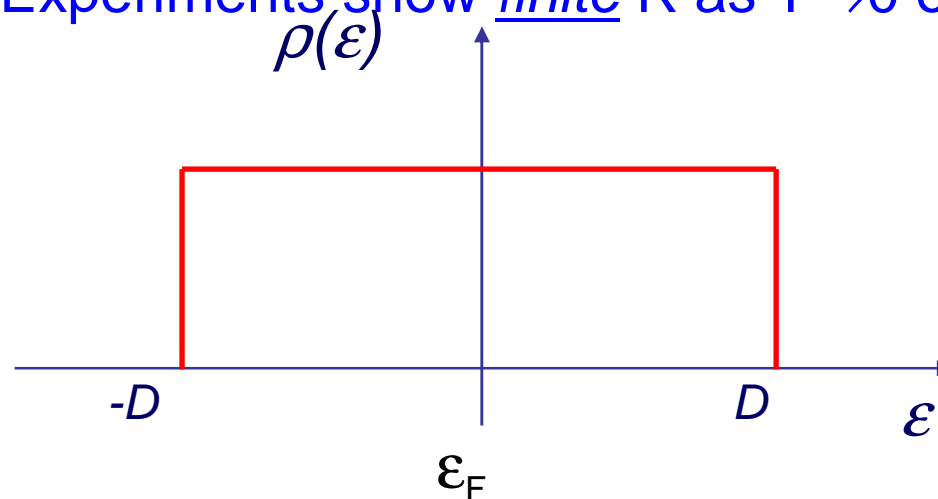


- Only one free parameter: the Kondo temperature  $T_K$ 
  - Temperature at which the perturbative expansion **diverges.**  $k_B T_K \sim D e^{-1/2J\rho_0}$

# Kondo's explanation for $T_{\min}$ (1964)

$$R_{\text{tot}}(T) = aT^5 - c_{\text{imp}} R_{\text{imp}} \log\left(\frac{k_B T}{D}\right)$$

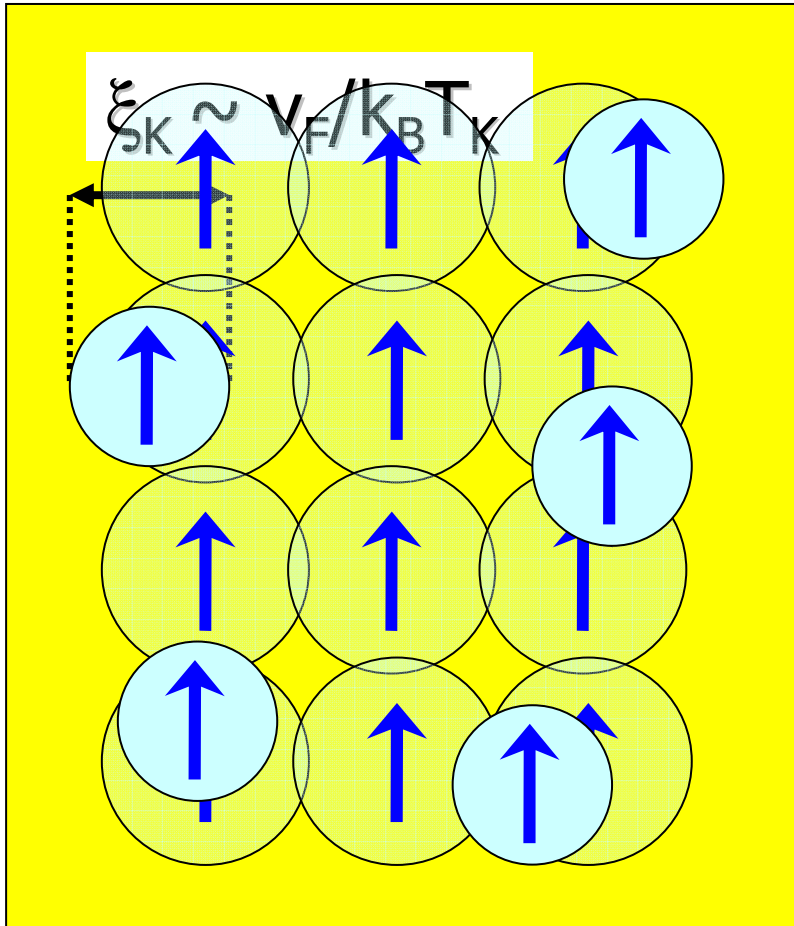
- What is going on? {
- Theory diverges logarithmically for  $T \rightarrow 0$  or  $D \rightarrow \infty$ .  
( $T < T_K \rightarrow$  perturbation expansion no longer holds)
  - Experiments show finite  $R$  as  $T \rightarrow 0$  or  $D \rightarrow \infty$ .





# Kondo Impurity and Lattice models

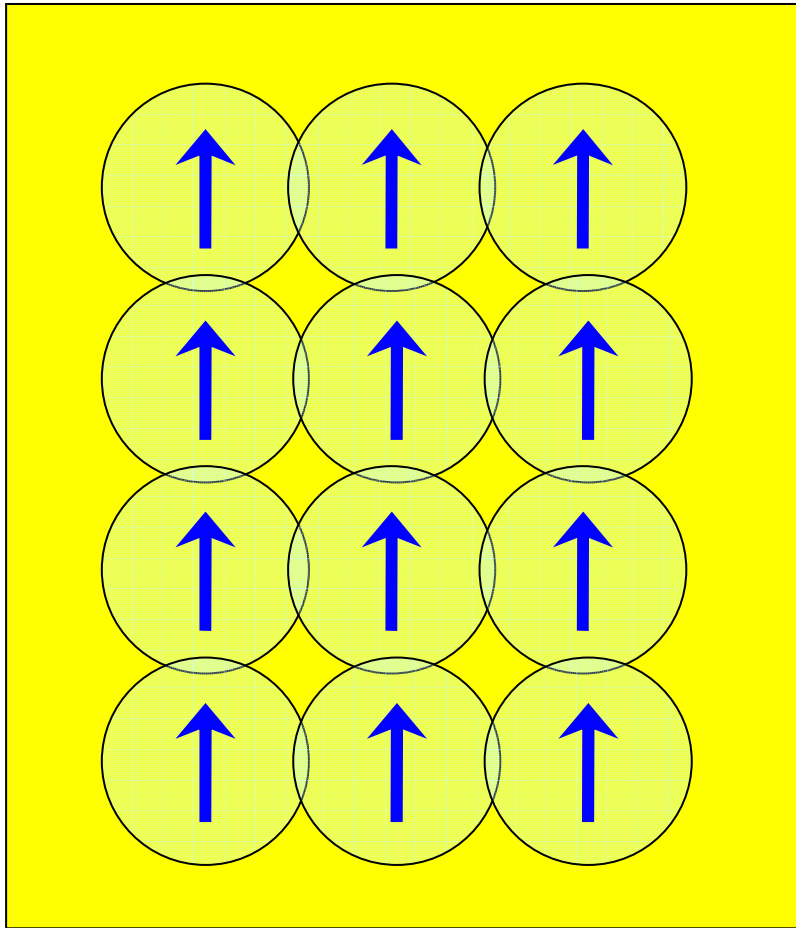
“Concentrated” case: Kondo Lattice (e.g., some heavy-Fermion materials)  
Diluted case (Kondo Impurity model)



- Kondo impurity model suitable for diluted impurities in metals.
- Some rare-earth compounds (localized 4f or 5f shells) can be described as “Kondo lattices”.
- This includes so called “heavy fermion” materials (e.g. Cerium and Uranium-based compounds:  $\text{CeCu}_2\text{Si}_2$  ;  $\text{URu}_2\text{Si}_2$  ; etc).

# Kondo Lattice models

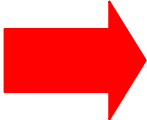
“Concentrated” case: Kondo Lattice (e.g., some heavy-Fermion materials)



- Kondo impurity model suitable for diluted impurities in metals.
- Some rare-earth compounds (localized 4f or 5f shells) can be described as “Kondo lattices”.
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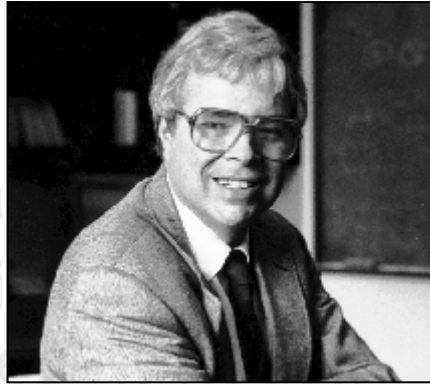
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## A little bit of Kondo history:

- Early '30s : Resistance minimum in some metals
  - Early '50s : theoretical work on impurities in metals  
“Virtual Bound States” (Friedel)
  - 1961: Anderson model for magnetic impurities in metals
  -  1964: s-d model and Kondo solution (PT)
  - 1970: Anderson “Poor’s man scaling”
  - 1974-75: Wilson’s Numerical Renormalization Group (non PT)
  - 1980 : Andrei and Wiegmann’s exact solution
-

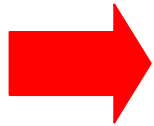
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## A little bit of Kondo history:



Kenneth G. Wilson – Physics Nobel Prize in 1982  
"for his theory for critical phenomena in connection  
with phase transitions"

- Early '30s : Resistance in some metals
- Early '50s : theoretical impurities in metals  
"Virtual Bound States"
- 1961: Anderson in metals
- 1964: s-d model and Kondo solution (PT)
- 1970: Anderson "Poor's man scaling"
- ➔ 1974-75: Wilson's Numerical Renormalization Group (non PT)
- 1980 : Andrei and Wiegmann's exact solution



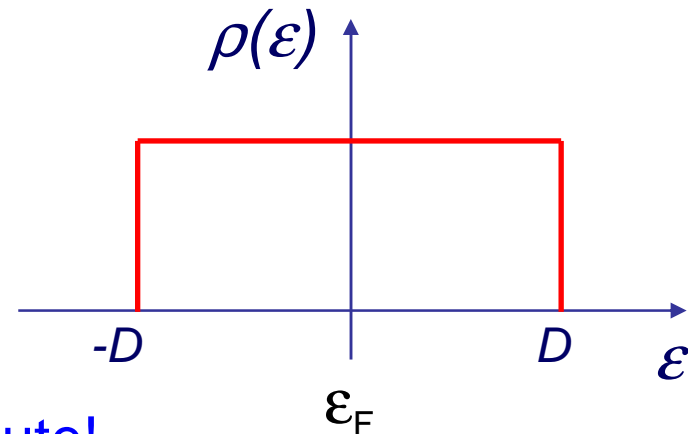
# Kondo's explanation for $T_{\min}$ (1964)

$$R_{\text{tot}}(T) = aT^5 - c_{\text{imp}} R_{\text{imp}} \log\left(\frac{k_B T}{D}\right)$$

What is going on?

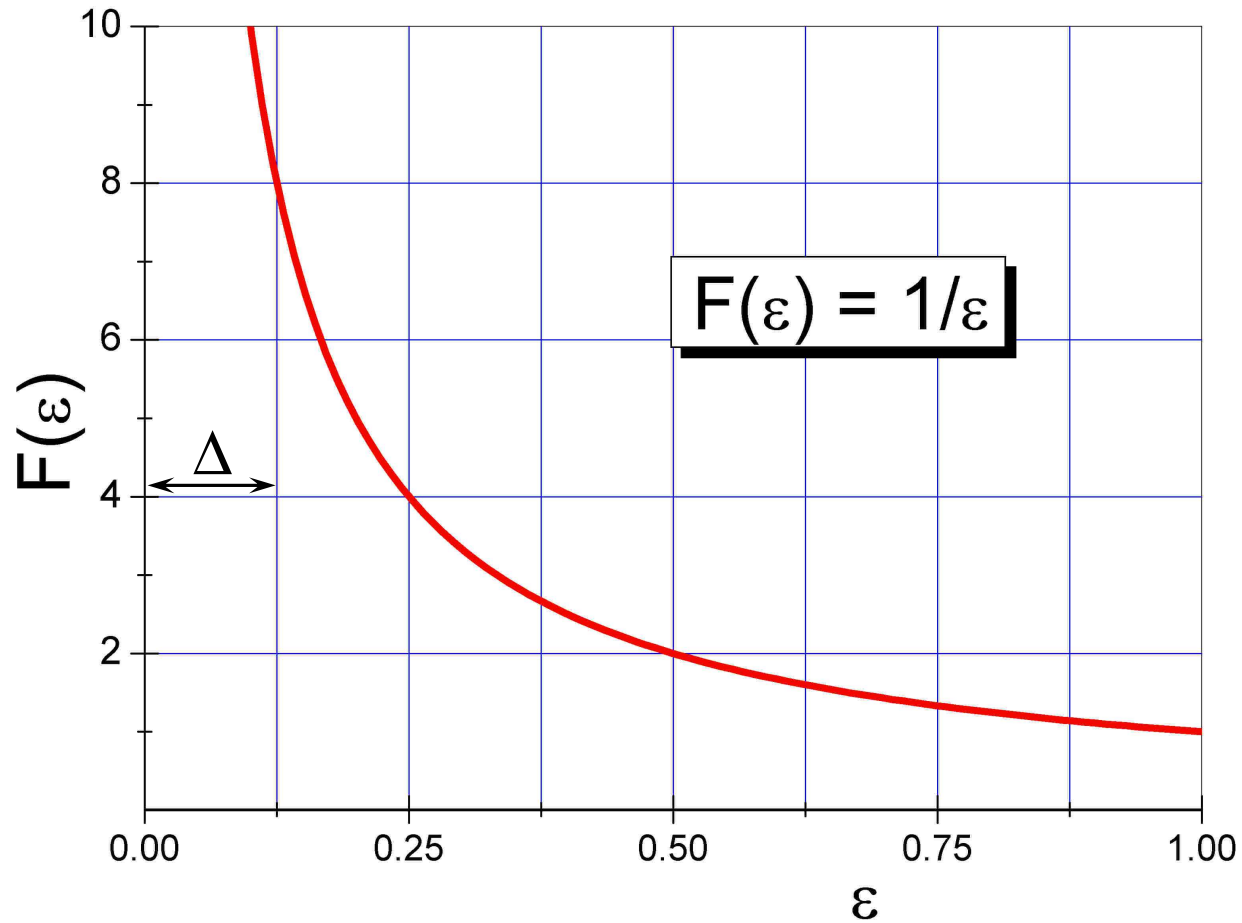
- Diverges logarithmically for  $T \rightarrow 0$  or  $D \rightarrow \infty$ .  
( $T < T_K \rightarrow$  perturbation expansion no longer holds)
- Experiments show finite  $R$  as  $T \rightarrow 0$  or  $D \rightarrow \infty$ .
- The log comes from something like:

$$\int_{k_B T/D}^1 \frac{d\varepsilon}{\varepsilon} = -\log\left(\frac{k_B T}{D}\right)$$



- All energy scales contribute!

# “Perturbative” Discretization of CB

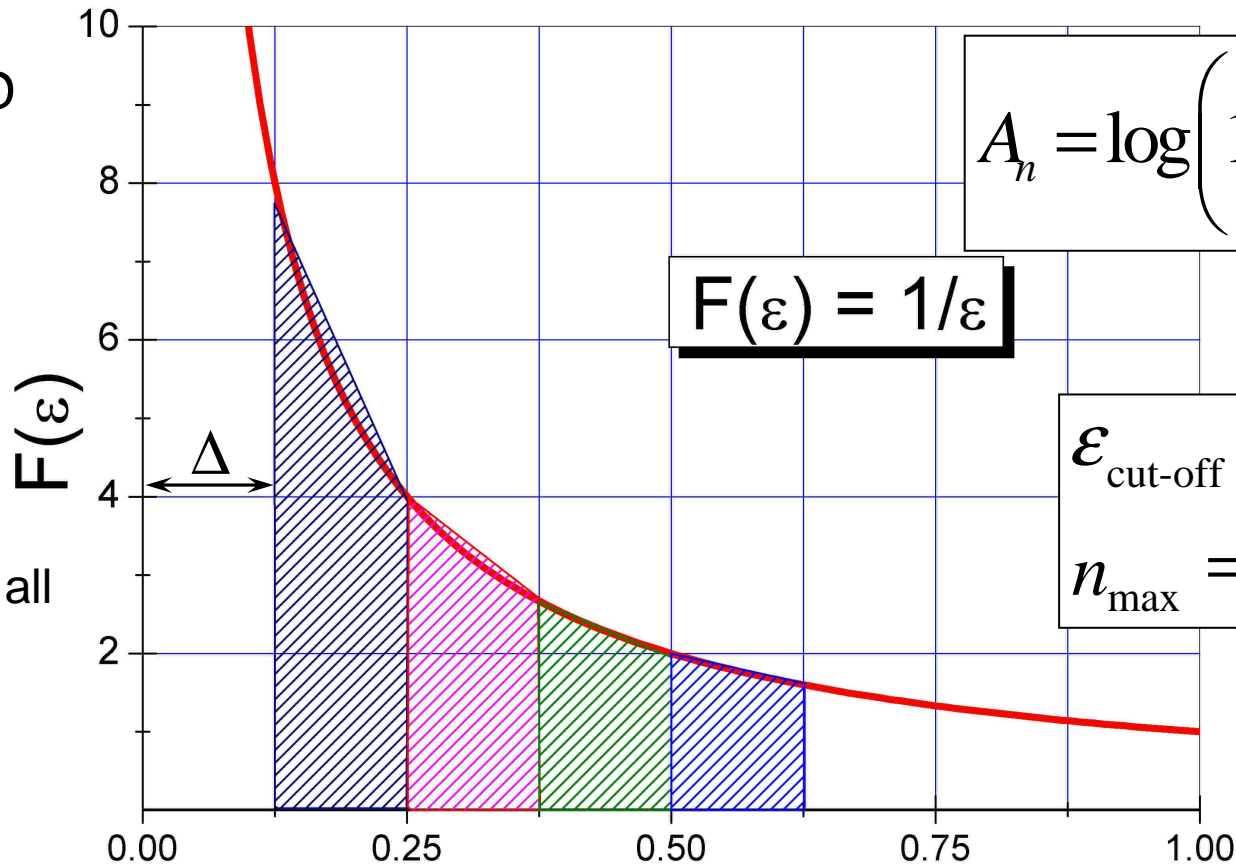


$$\varepsilon = (E - E_F)/D$$

$$\Delta = (\Delta E)/D$$

# “Perturbative” Discretization of CB

$$\Delta = (\Delta E)/D$$



$$A_n = \log \left( 1 - \frac{\Delta}{1 - n\Delta} \right)$$

$$F(\varepsilon) = 1/\varepsilon$$

$$\varepsilon_{\text{cut-off}} = \Delta$$

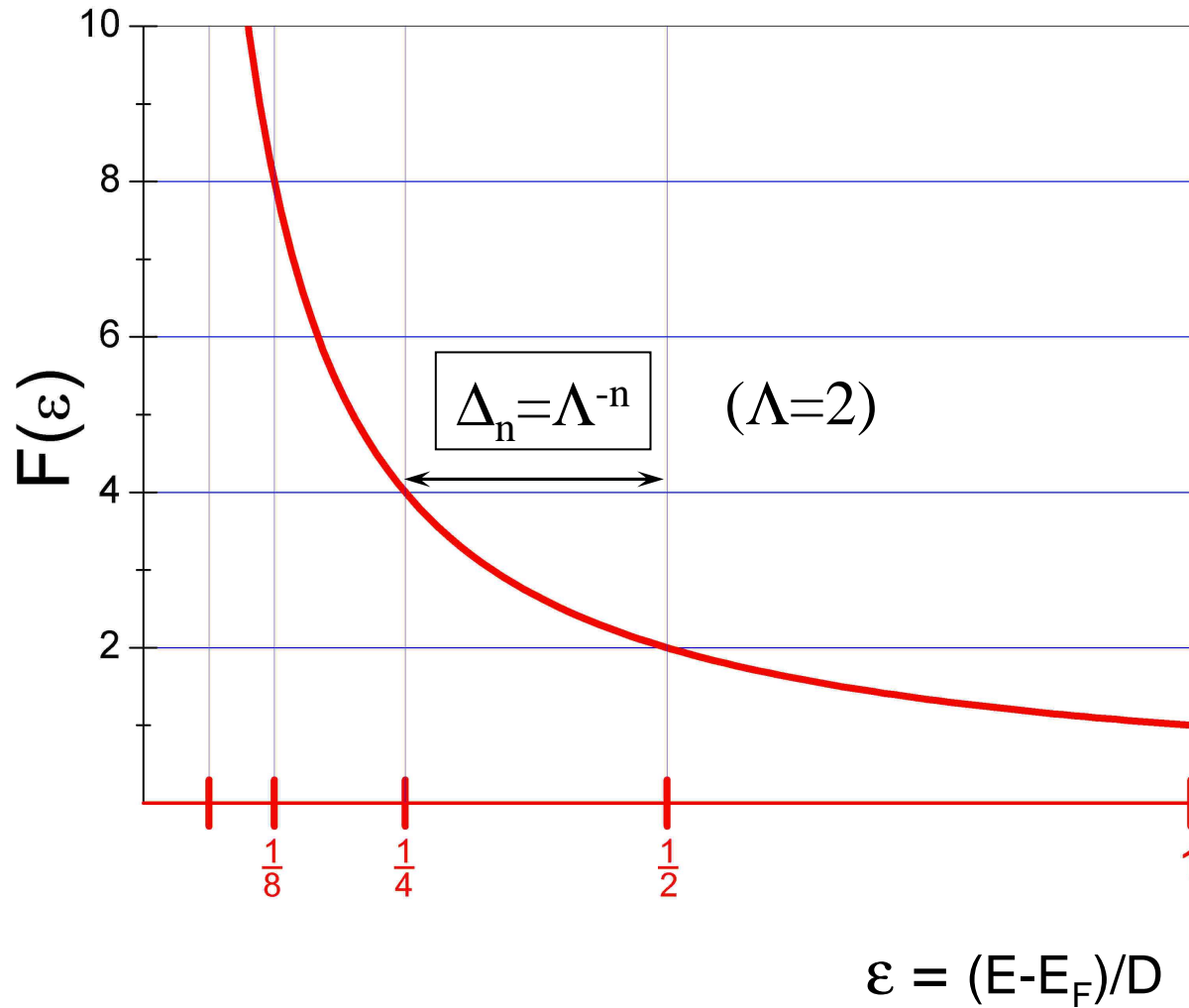
$$n_{\text{max}} = \Delta^{-1} - 1$$

Want to keep all contributions for  $D \rightarrow \infty$ ?

$$A_7 > A_6 > A_5 > A_4 > A_3 > A_2 > A_1$$

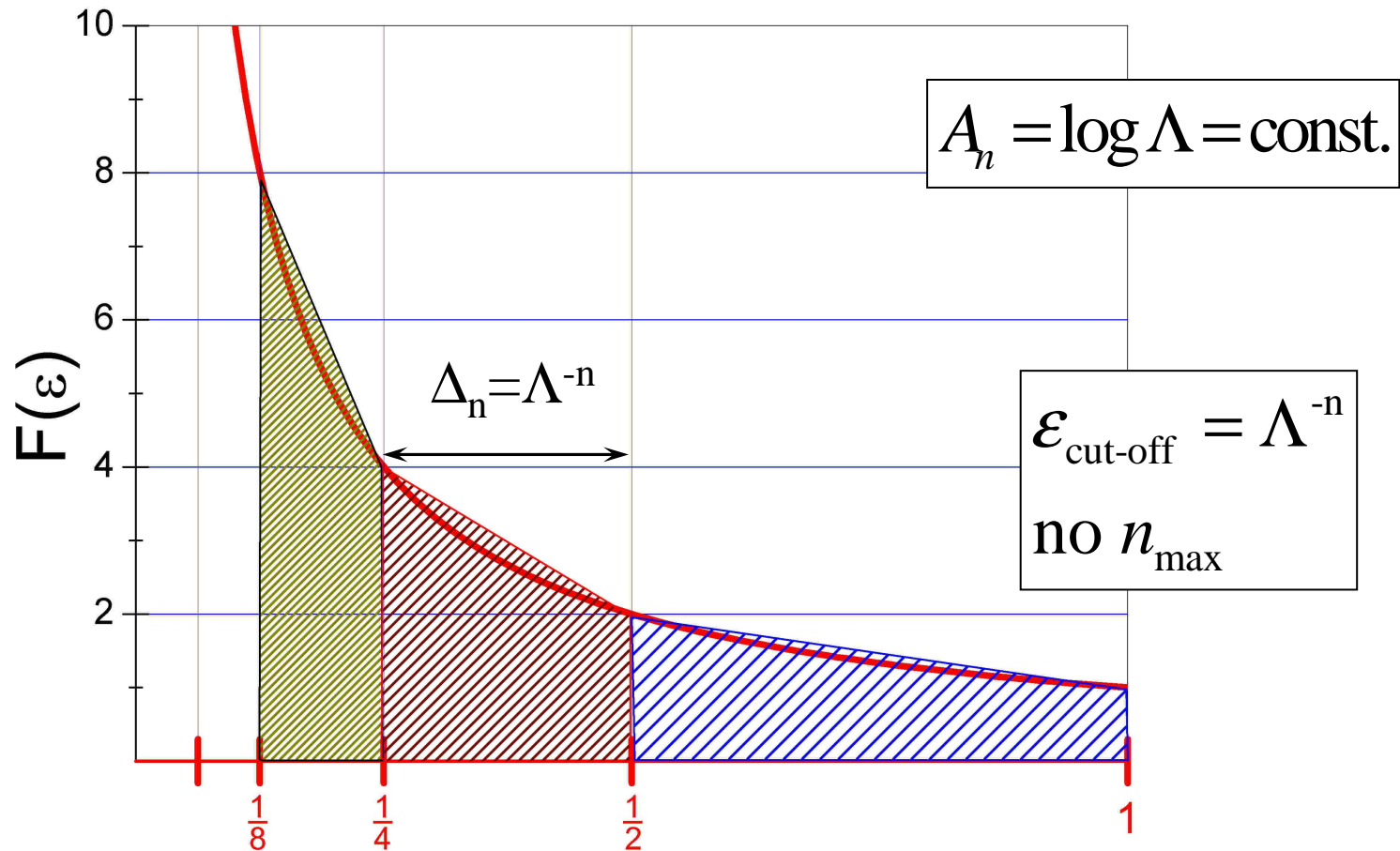
*Not a good approach!*

# Wilson's CB Logarithmic Discretization





# Wilson's CB Logarithmic Discretization



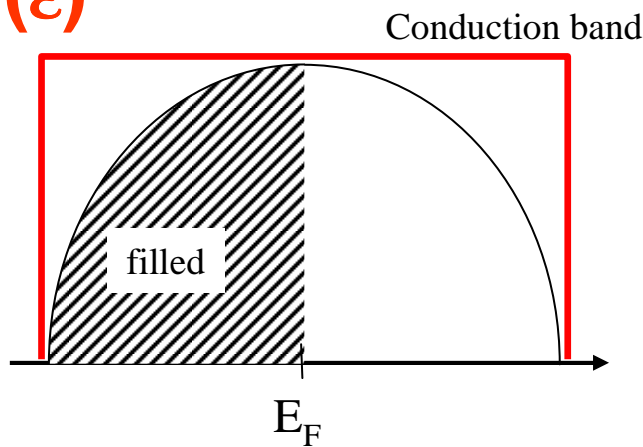
Now you're ok!   $A_3 = A_2 = A_1$  ( $\Lambda=2$ )

# Kondo problem: s-d Hamiltonian

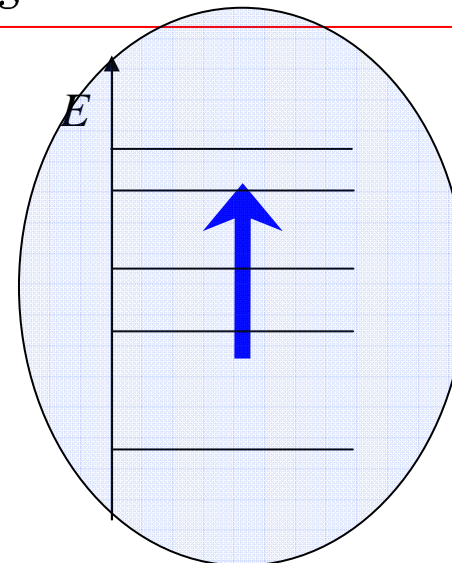
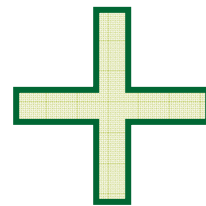
- Kondo problem: s-wave coupling with spin impurity (s-d model):

$$H_K = \sum_{\mathbf{k}s} \epsilon_{\mathbf{k}s} \hat{n}_{\mathbf{k}s} + J \sum_{\mathbf{k}s; \mathbf{k}'s'} c_{\mathbf{k}s}^\dagger (\mathbf{S} \cdot \vec{\sigma})_{ss'} c_{\mathbf{k}'s'}$$

$\rho(\epsilon)$



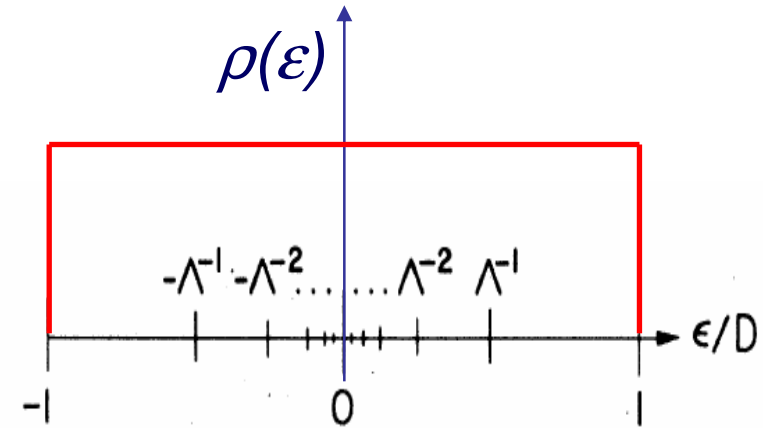
**Metal (non magnetic, s-band)**



**Magnetic impurity (unfilled d-level)**

# Kondo s-d Hamiltonian

$$\begin{aligned}
 H_{s-d} = & J \sum_{k,k'} S^+ c_{k\downarrow}^\dagger c_{k'\uparrow} + S^- c_{k\uparrow}^\dagger c_{k'\downarrow} \\
 & + S_z (c_{k\uparrow}^\dagger c_{k'\uparrow} - c_{k\downarrow}^\dagger c_{k'\downarrow}) \\
 & + \sum_k e_k c_{k\sigma}^\dagger c_{k\sigma}
 \end{aligned}$$

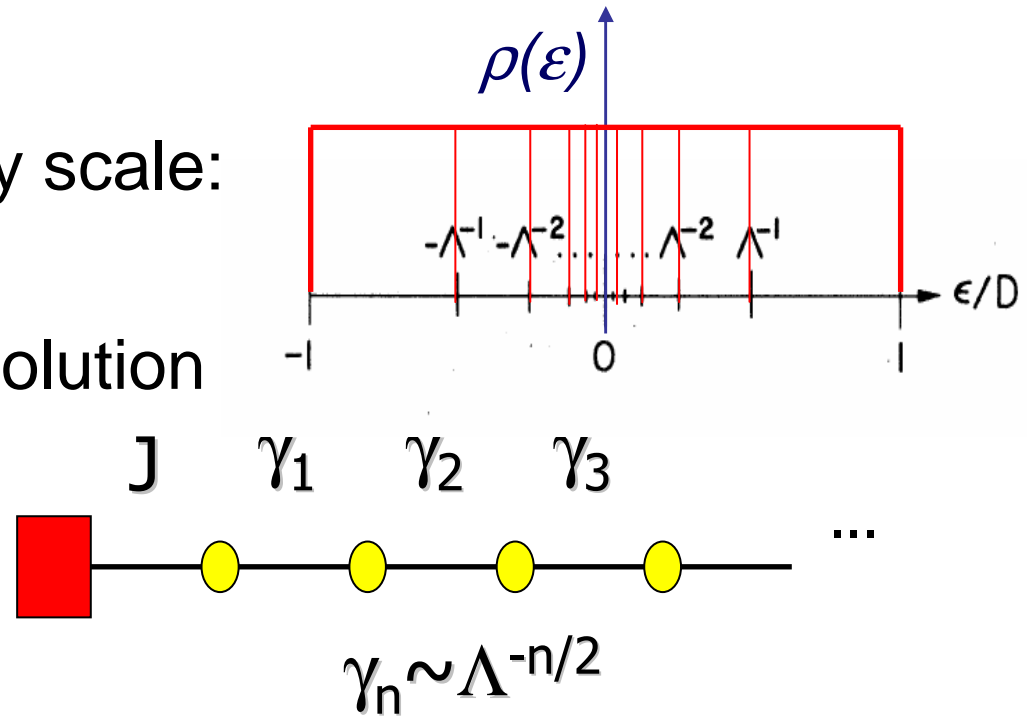


- From continuum  $k$  to a *discretized* band.
- Transform  $H_{s-d}$  into a linear chain form (exact, as long as the chain is infinite):

$$H_K = \sum_{n=0}^{\infty} \epsilon_n (f_n^+ f_{n+1} + f_{n+1}^+ f_n) - 2J f_0^+ \boldsymbol{\sigma} f_0 \cdot \boldsymbol{\tau},$$

# “New” Hamiltonian (Wilson’s RG method)

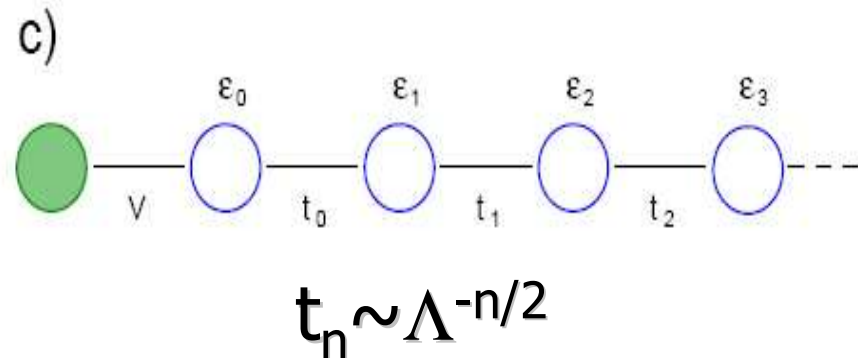
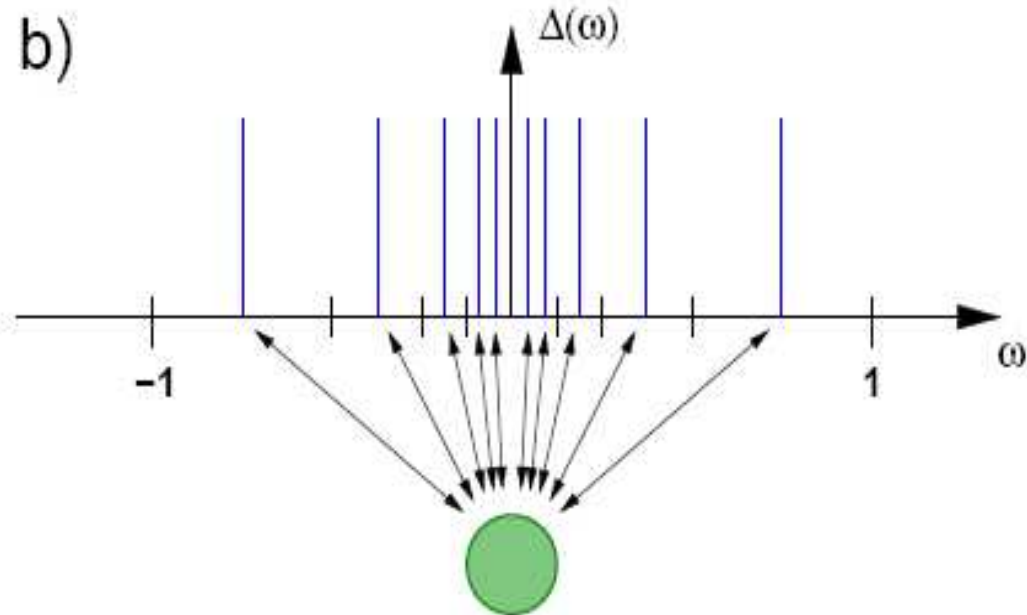
- Logarithmic CB discretization is the key to avoid divergences!
- Map: conduction band  $\rightarrow$  Linear Chain
  - Lanczos algorithm.
  - Site  $n \rightarrow$  new energy scale:
    - $D\Lambda^{-(n+1)} < |\epsilon_k - \epsilon_F| < D\Lambda^{-n}$
  - Iterative numerical solution



# Logarithmic Discretization.

Steps:

1. Slice the conduction band in intervals in a log scale (parameter  $\Lambda$ )
2. Continuum spectrum approximated by a single state
3. Mapping into a tight binding chain: sites correspond to different energy scales.



# Wilson's CB Logarithmic Discretization

- Logarithmic Discretization (in space):

$\Lambda > 1$

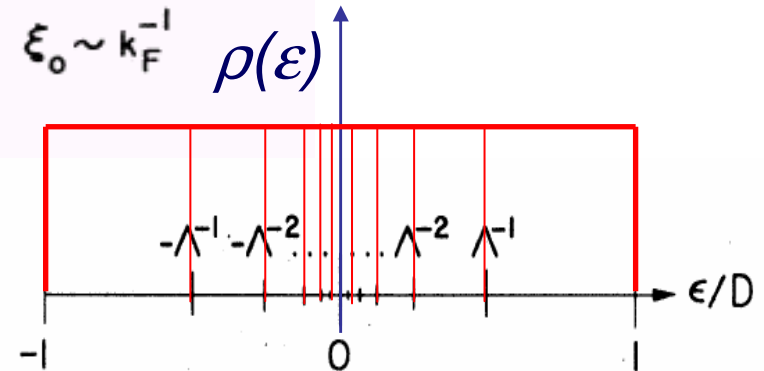
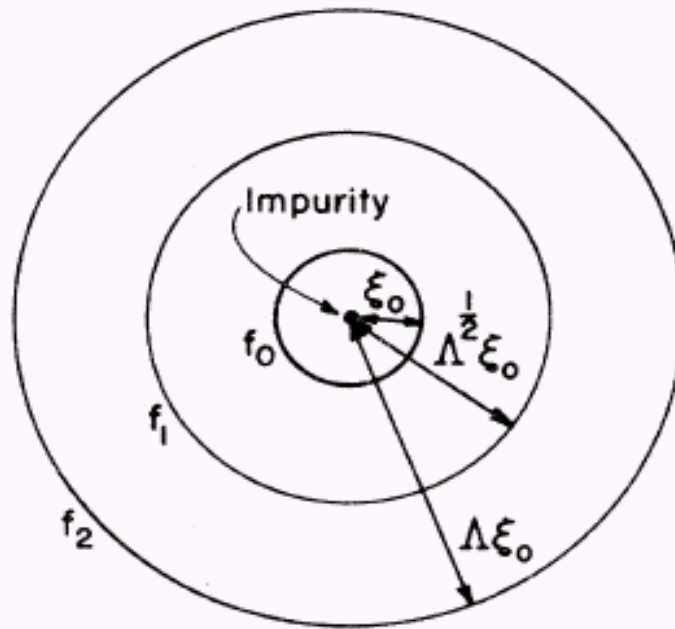


FIG. 4. Spherical shells in  $r$  space depicting the extents of the wave functions of  $f_n$ . Within their shells, every wave function has oscillations so that they are mutually orthogonal. Alternately one can show that, in the wave-vector space,

# Wilson's CB Logarithmic Discretization

- Logarithmic Discretization (in energy):

$\Lambda > 1$

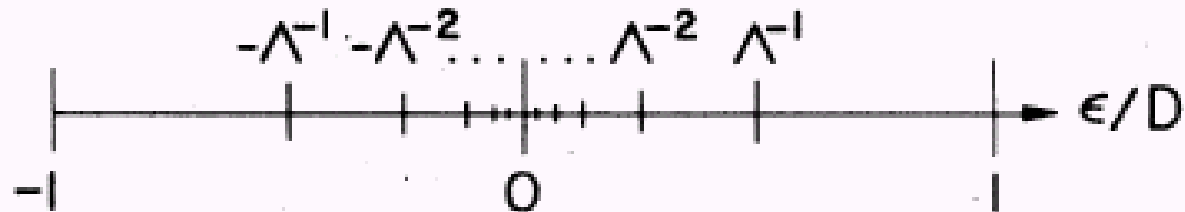
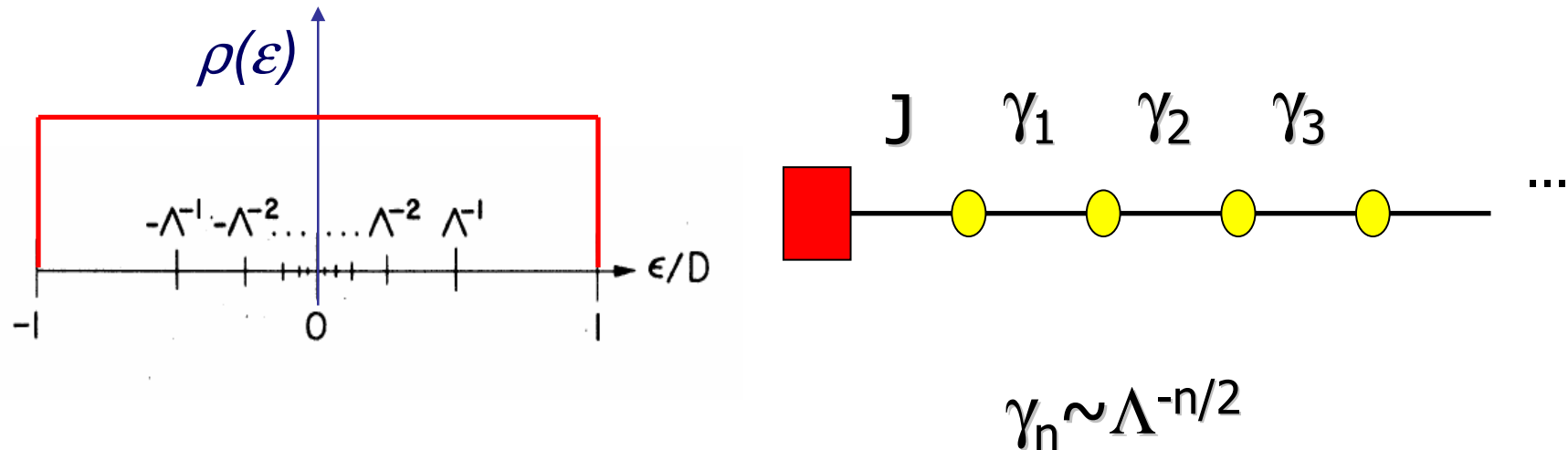


FIG. 1. Logarithmic discretization of the conduction band. The Fermi energy is at zero and the top and bottom of the conduction band at  $k \equiv \epsilon/D = +1$  and  $-1$ , respectively.

# “New” Hamiltonian (Wilson)

- Recurrence relation (Renormalization procedure).

$$H_{N+1} = \sqrt{\Lambda} H_N + \xi_N \sum_{\sigma} f_{N+1\sigma}^{\dagger} f_{N\sigma} + f_{N\sigma}^{\dagger} f_{N+1\sigma}$$





# “New” Hamiltonian (Wilson)

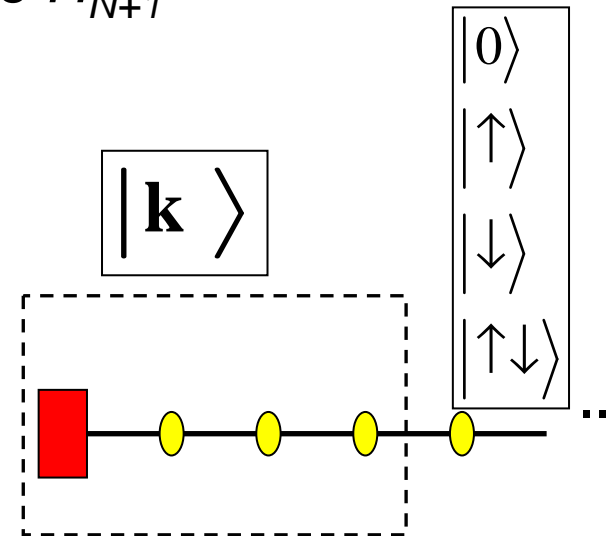
- Suppose you diagonalize  $H_N$  getting  $E_k$  and  $|k\rangle$  and you want to diagonalize  $H_{N+1}$  using this basis.
- First, you expand your basis:

$$|\Omega; k\rangle = |k\rangle,$$

$$|\frac{1}{2}; k\rangle = f_{N+1, \frac{1}{2}}^+ |k\rangle,$$

$$|-\frac{1}{2}; k\rangle = f_{N+1, -\frac{1}{2}}^+ |k\rangle,$$

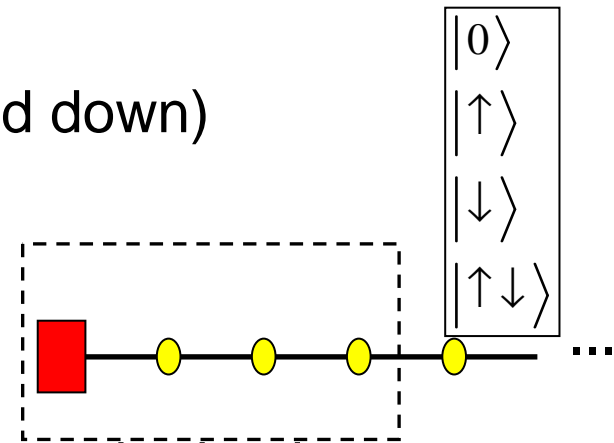
$$|\frac{1}{2}, -\frac{1}{2}; k\rangle = f_{N+1, \frac{1}{2}}^+ f_{N+1, -\frac{1}{2}}^+ |k\rangle.$$



- Then you calculate  $\langle k, a | f_N^+ | k', a' \rangle$ ,  $\langle k, a | f_N | k', a' \rangle$  and you have the matrix elements for  $H_{N+1}$  (sounds easy, right?)

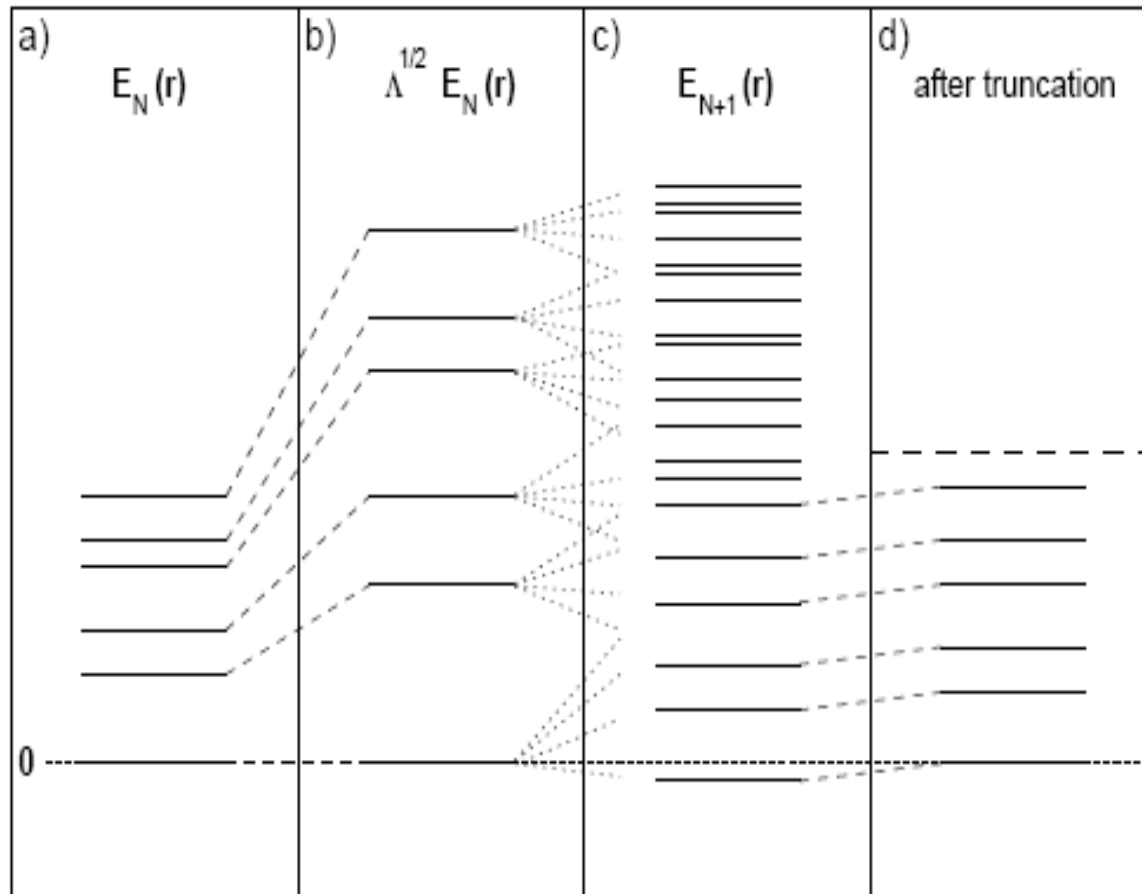
# Intrinsic Difficulty

- You run into problems when  $N \sim 5$ . The basis is too large! (grows as  $2^{(2N+1)}$ )
  - $N=0$ ; (just the impurity); 2 states (up and down)
  - $N=1$ ; 8 states
  - $N=2$ ; 32 states
  - $N=5$ ; 2048 states
  - (...)  $N=20$ ;  $2.199 \times 10^{12}$  states:
    - 1 byte per state  $\rightarrow$  20 HDs just to store the basis.
  - And we might go up to  $N=180$ ;  $1.88 \times 10^{109}$  states.
    - Can we store this basis?  
(Hint: The number of atoms in the universe is  $\sim 10^{80}$ )
- Cut-off the basis  $\rightarrow$  lowest  $\sim 1500$  or so in the next round (Even then, you end up having to diagonalize a  $4000 \times 4000$  matrix... ).

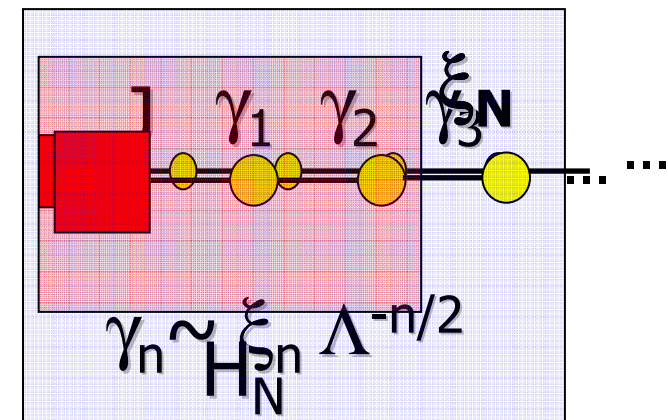


# Renormalization Procedure

$$H_{N+1} = \sqrt{\Lambda} H_N + \xi_N \sum_{\sigma} f_{N+1\sigma}^{\dagger} f_{N\sigma} + f_{N\sigma}^{\dagger} f_{N+1\sigma}$$



- Iterative numerical solution.
- Renormalize by  $\Lambda^{1/2}$ .
- Keep low energy states.



$H_{N+1}$

# Renormalization Group Transformation

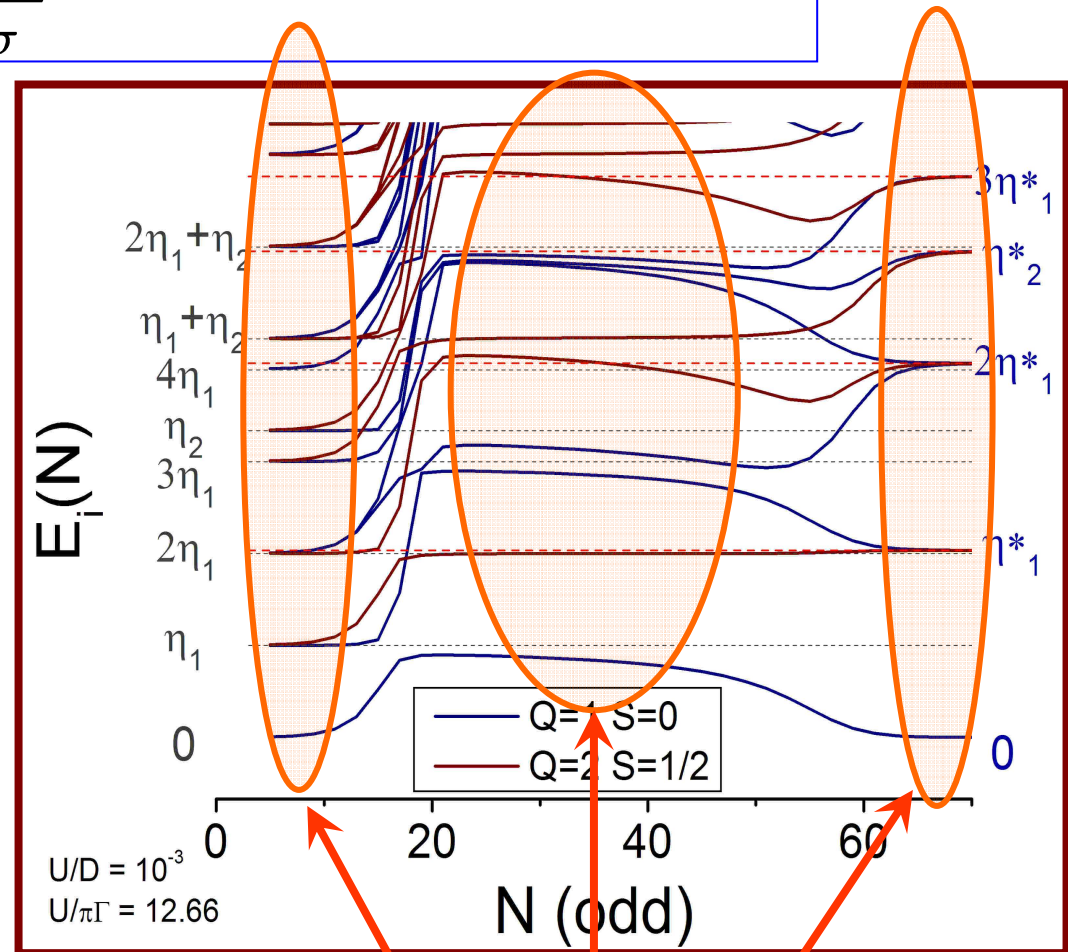
$$H_{N+1} = \sqrt{\Lambda} H_N + \xi_N \sum_{\sigma} f_{N+1\sigma}^{\dagger} f_{N\sigma} + f_{N\sigma}^{\dagger} f_{N+1\sigma}$$

- **Renormalization Group transformation:** (Re-scale energy by  $\Lambda^{1/2}$ ).

$$H_{N+1} = R(H_N)$$

- **Fixed point  $H^*$ :** indicates *scale invariance*.

$$H^* = R^2(H^*)$$



Fixed points

# Spectral function calculation

Local Density of states: Lehmann representation.

$$A_{\sigma}(\omega, T = 0) = \frac{1}{Z(0)} \sum_r |M_{r,0}|^2 \delta(\omega + (E_r - E_0)) \\ + \frac{1}{Z(0)} \sum_{r'} |M_{0,r'}|^2 \delta(\omega - (E_{r'} - E_0)), \quad (6)$$

At each NRG step, you define

$$A_{\sigma}^N(\omega, T = 0) = \frac{1}{Z_N(0)} \sum_r |M_{r,0}^N|^2 \delta(\omega + E_r^N) \\ + \frac{1}{Z_N(0)} \sum_{r'} |M_{0,r'}^N|^2 \delta(\omega - E_{r'}^N). \quad (68)$$

$$H_N |r\rangle_N = E_r^N |r\rangle_N,$$

$$M_{r,r'}^N = {}_N \langle r | f_{\sigma} | r' \rangle_N,$$

# Spectral function

At each NRG step:

$$H_N |r\rangle_N = E_r^N |r\rangle_N,$$

$$M_{r,r'}^N = N \langle r | f_\sigma | r' \rangle_N,$$

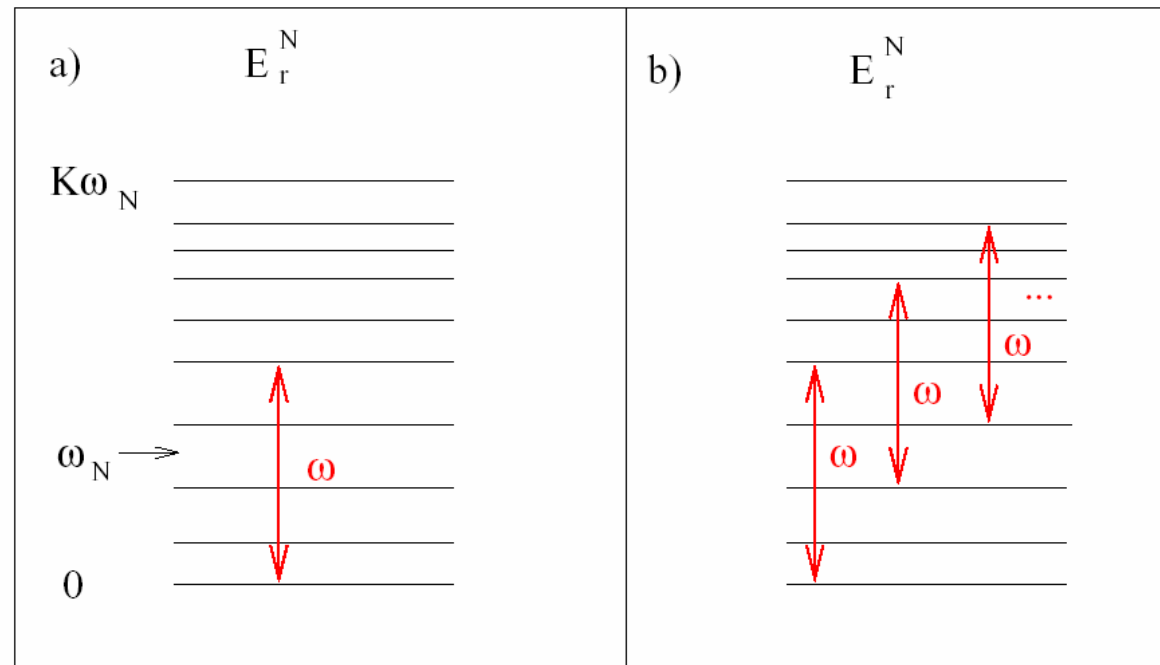


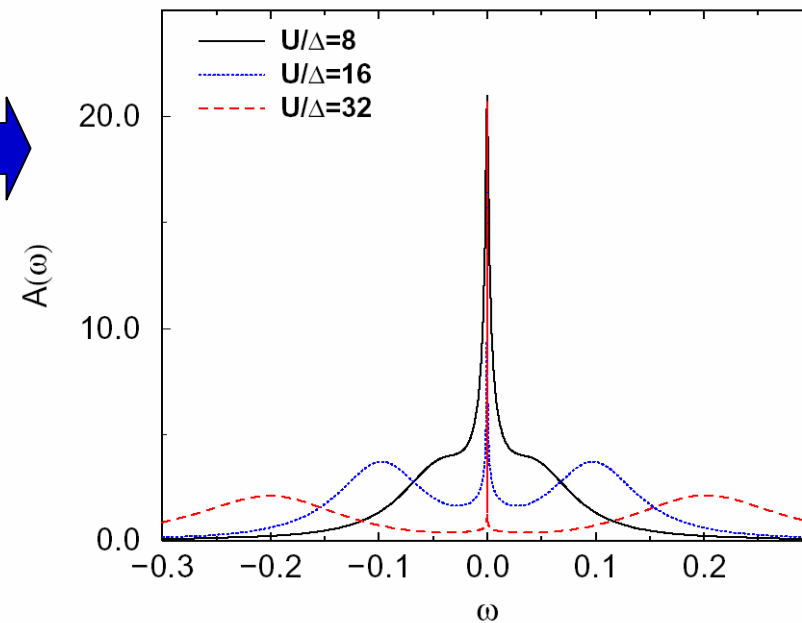
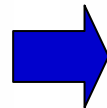
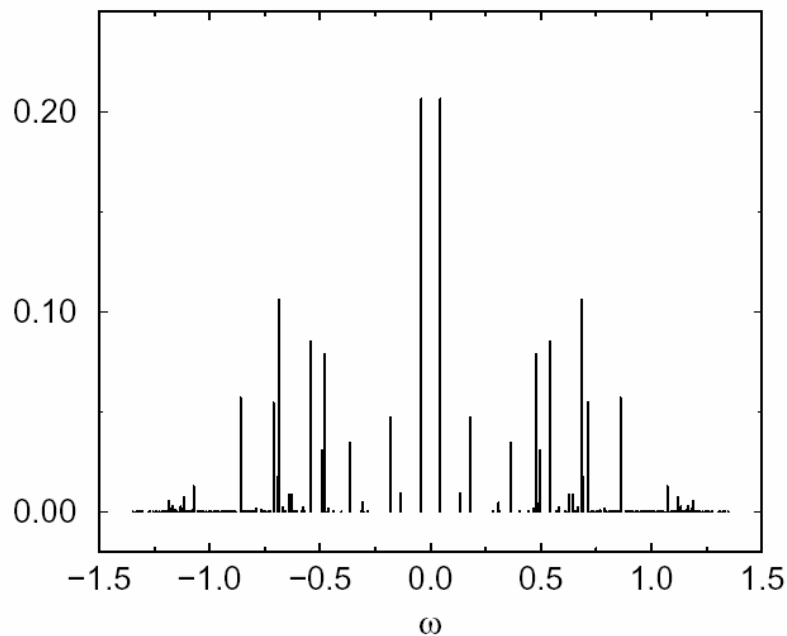
FIG. 9 Excitations of  $H_N$  contributing to the spectral function at frequency  $\omega$  for, (a),  $T = 0$ , and, (b),  $T > 0$ .

# Spectral function calculation (Costi)

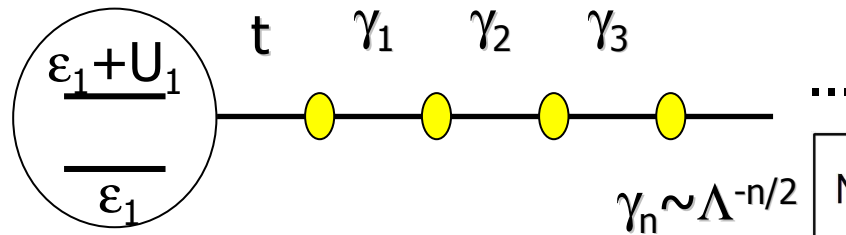
$$A_{\sigma}^N(\omega, T=0) = \frac{1}{Z_N(0)} \sum_r |M_{r,0}^N|^2 \delta(\omega + E_r^N) + \frac{1}{Z_N(0)} \sum_{r'} |M_{0,r'}^N|^2 \delta(\omega - E_{r'}^N).$$

To get a continuous curve,  
need to broaden deltas.  
Best choice: log gaussian

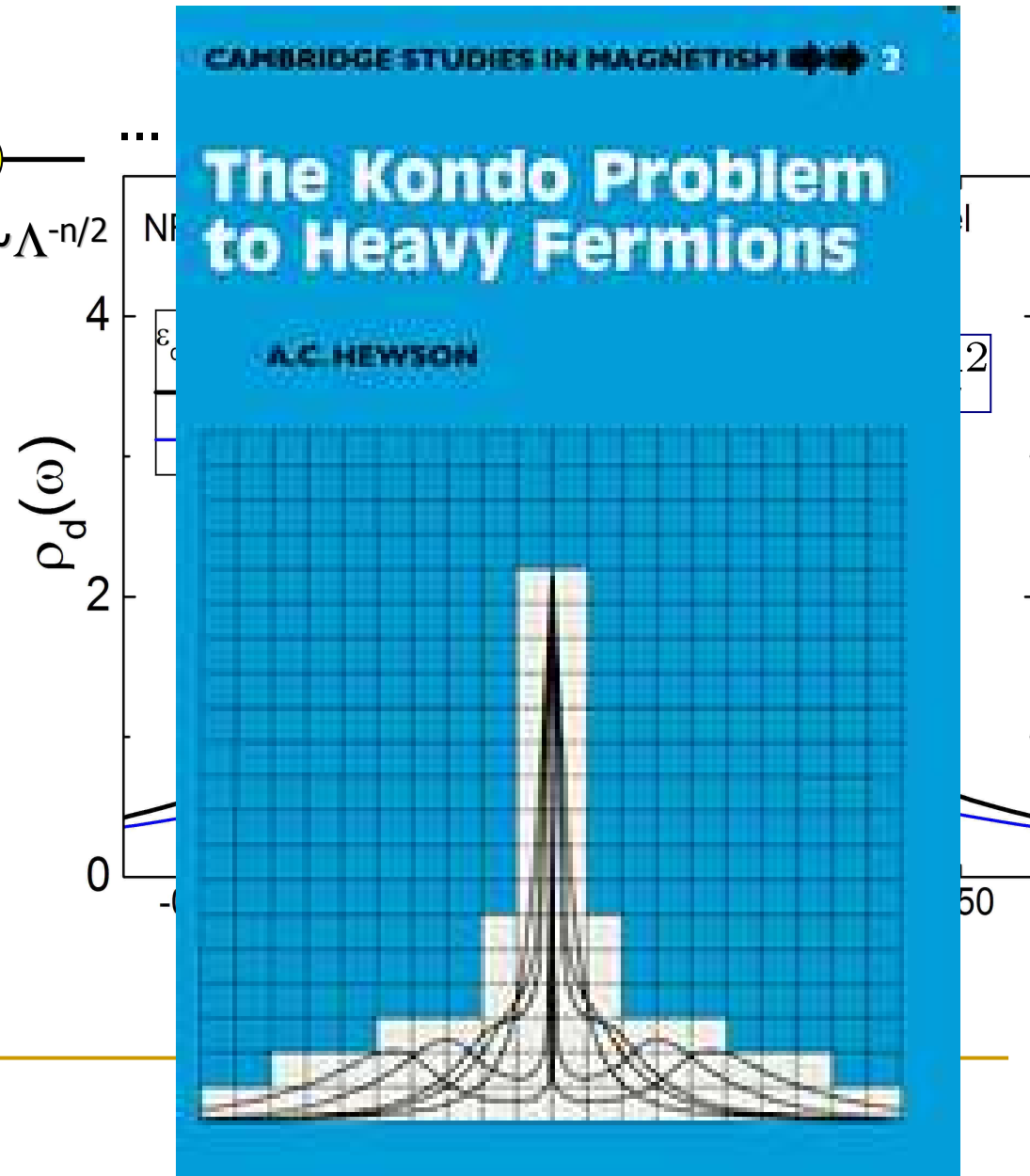
$$\delta(\omega - \omega_n) \rightarrow \frac{e^{-b^2/4}}{b\omega_n\sqrt{\pi}} \exp\left[-\frac{(\ln \omega - \ln \omega_n)^2}{b^2}\right]$$



# NRG on Anderson model: LDOS



- Single-particle peaks at  $\varepsilon_d$  and  $\varepsilon_d + U$ .
- *Many-body* peak at the Fermi energy: **Kondo resonance** (width  $\sim T_K$ ).
- NRG: good resolution at low  $\omega$  (log discretization).

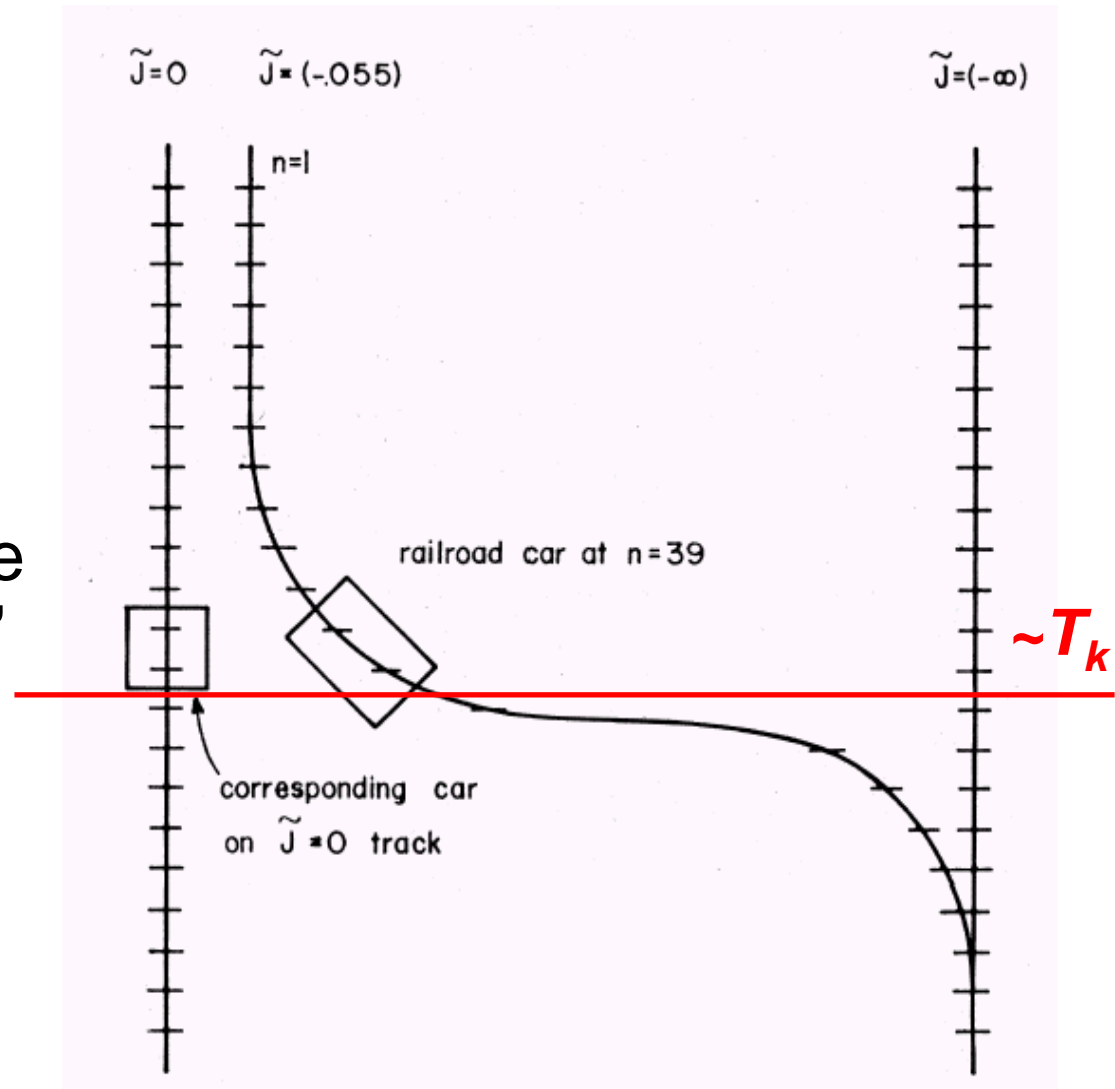




# Numerical Renormalization Group

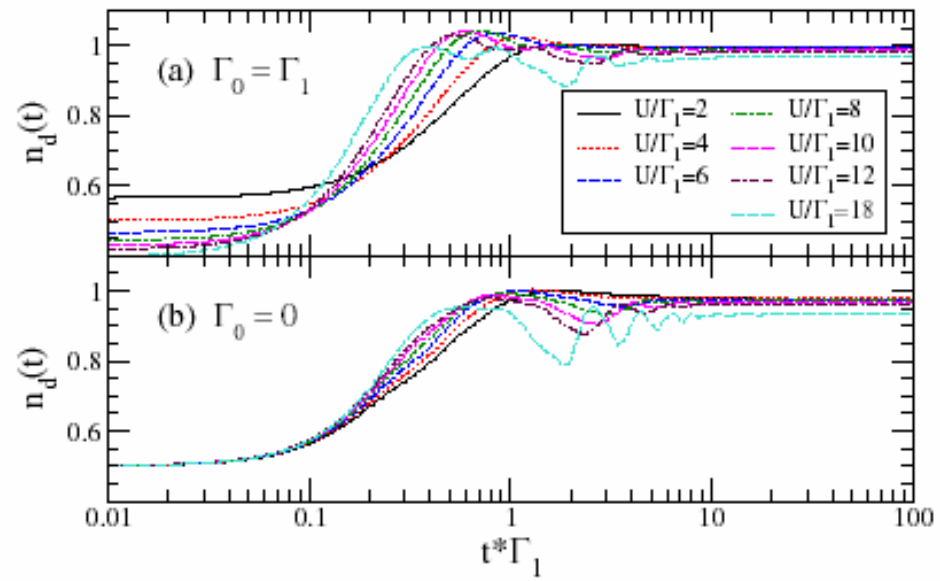
What can you do?

- Describe the physics at different energy scales for arbitrary  $J$ .
- Probe the parameter phase diagram.
- Crossing between the “free” and “screened” magnetic moment regimes.
- Energy scale of the transition is of order  $T_k$



# Recent Developments: TD-NRG

Application: time dependent impurity problems



$$\mathcal{H} = \sum_{k,\sigma} \varepsilon_{k\sigma} c_{k\sigma}^\dagger c_{k\sigma} + \sum_{\sigma=\pm 1} \left[ E_d(t) - \frac{\sigma}{2} H(t) \right] d_\sigma^\dagger d_\sigma$$

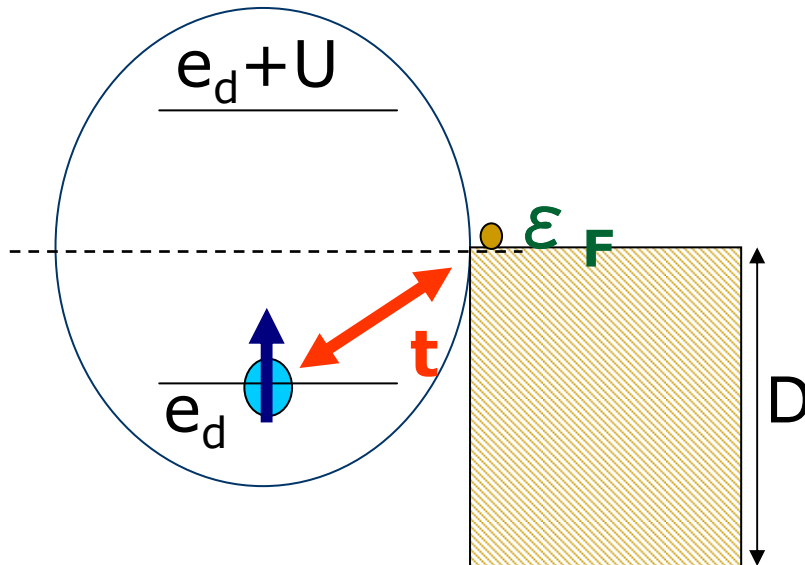
$$+ U \hat{n}_\uparrow^d \hat{n}_\downarrow^d + V(t) \sum_{k,\sigma} \{ d_\sigma^\dagger c_{k\sigma} + c_{k\sigma}^\dagger d_\sigma \}.$$

---

# Summary: NRG overview

- NRG method: designed to handle quantum impurity problems
  - All energy scales treated on the same footing.
  - Non-perturbative: can access transitions between fixed points in the parameter space
  - Calculation of physical properties
-

# Anderson Model



$$H = \epsilon_d \hat{n}_{d\sigma} + U \hat{n}_{d\uparrow} \hat{n}_{d\downarrow} + \sum_k \epsilon_k \hat{n}_{k\sigma} + t \sum_k c_{d\sigma}^\dagger c_{k\sigma} + \text{h.c.}$$

with

$$\hat{n}_{d\sigma} = c_{d\sigma}^\dagger c_{d\sigma}$$

$$\hat{n}_{k\sigma} = c_{k\sigma}^\dagger c_{k\sigma}$$

“Quantum dot language”

- $e_d$ : energy level
- $U$ : Coulomb repulsion
- $e_F$ : Fermi energy in the metal
- $t$ : Hybridization
- $D$ : bandwidth

- $e_d$ : position of the level ( $V_g$ )
- $U$ : Charging energy
- $e_F$ : Fermi energy in the leads
- $t$ : dot-lead tunneling
- $D$ : bandwidth

# Schrieffer- Wolff Transformation

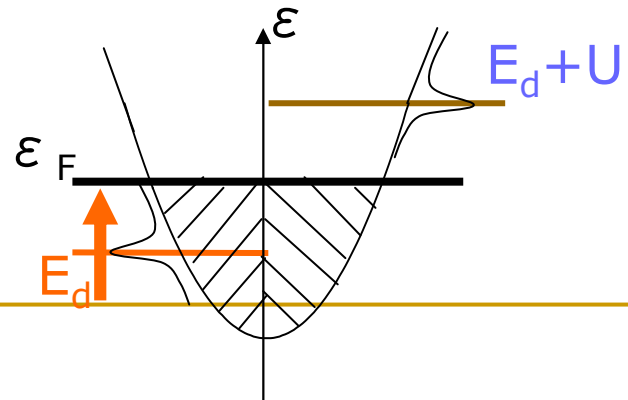
Anderson Model

Existence of  
localized moment

$$\rightarrow |V_{kd}| \ll U$$

Schrieffer-Wolff transformation

s-d Model



# Schrieffer- Wolff Transformation

From: Anderson Model (single occupation)

$$H = \epsilon_d \hat{n}_{d\sigma} + U \hat{n}_{d\uparrow} \hat{n}_{d\downarrow} + \sum_k \epsilon_k \hat{n}_{k\sigma} + t \sum_k c_{d\sigma}^\dagger c_{k\sigma} + \text{h.c.}$$

with

$$\hat{n}_{d\sigma} = c_{d\sigma}^\dagger c_{d\sigma}$$
$$\hat{n}_{k\sigma} = c_{k\sigma}^\dagger c_{k\sigma}$$

$$J = t^2 \sum_{k,k'} \left\{ \frac{1}{U + \epsilon_d - \epsilon'_k} + \frac{1}{\epsilon_k - \epsilon_d} \right\}$$

To: s-d (Kondo) Model

$$H_{\text{s-d}} = J \sum_{kk'} S^+ c_{k\downarrow}^\dagger c_{k'\uparrow} + S^- c_{k\uparrow}^\dagger c_{k'\downarrow} + S_z \left( c_{k\downarrow}^\dagger c_{k'\uparrow} - c_{k\downarrow}^\dagger c_{k'\downarrow} \right) + \sum_k \epsilon_k \hat{n}_{k\sigma}$$

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# History of Kondo Phenomena

- Observed in the '30s
- Explained in the '60s
- Numerically Calculated in the '70s (NRG)
- Exactly solved in the '80s (Bethe-Ansatz)

**So, what's new about it?**

## **Kondo correlations observed in many different set ups:**

- Transport in quantum dots, quantum wires, etc
  - STM measurements of magnetic structures on metallic surfaces (e.g., single atoms, molecules. "Quantum mirage")
  - ...
-