

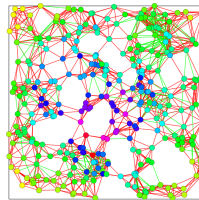
Fundamental Research on Renewable Energy Systems

at the interface between engineering + mathematics + physics

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greiner@eng.au.dk

(1) 100% Renewable Energy Systems

(2) Complex Networks

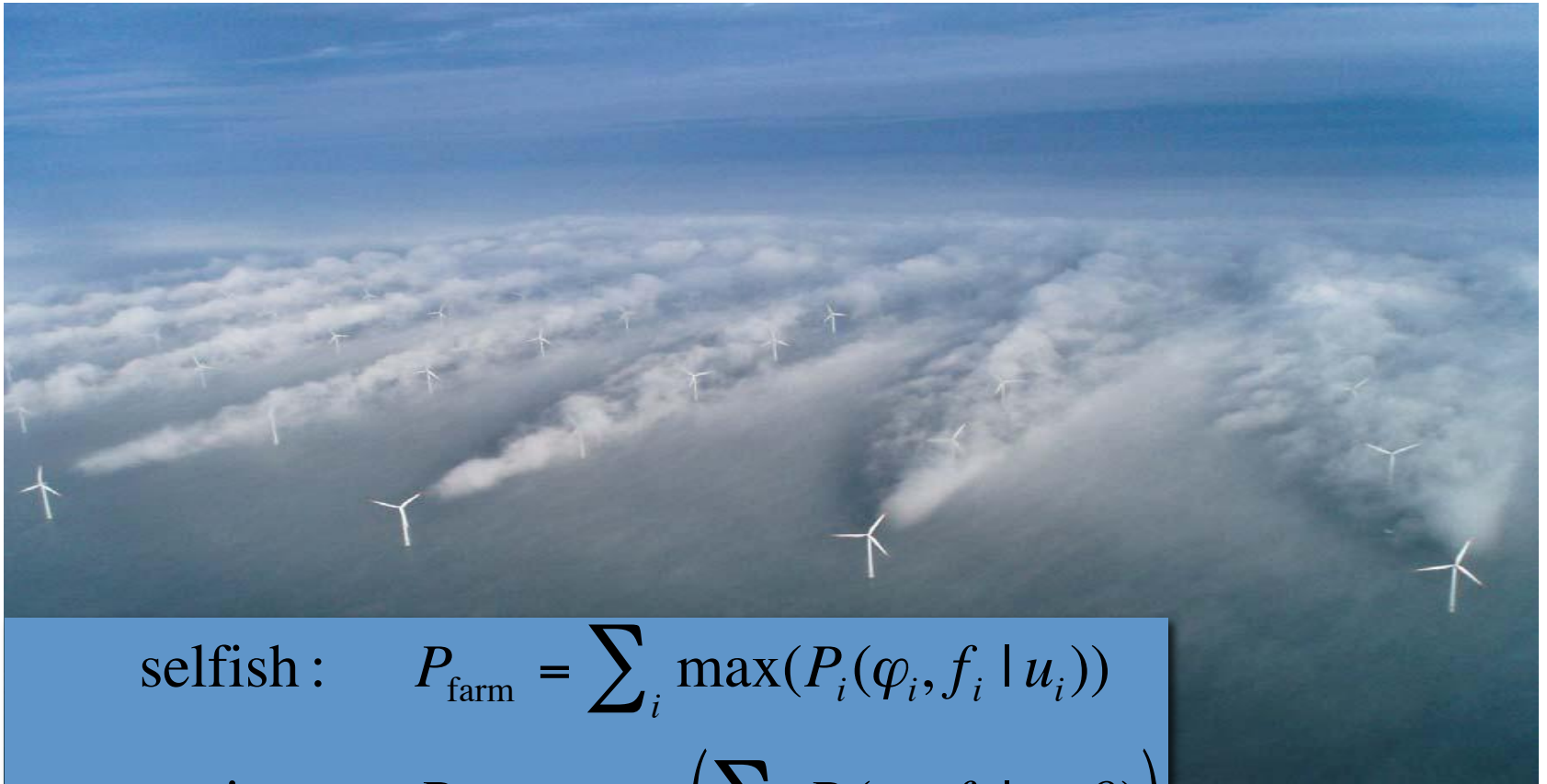


(3) Wind-farm Modeling + Optimization



G Andresen	(PostDoc)
R Rodriguez	(PhD)
B Sairanen	(Master)
A Thomsen	(Master)
M Dahl	(Master)
B Tranberg	(Master)
S Becker	(FIAS PhD)
T Jensen	(DTU PhD)
J Herp	(SDU PhD)
U Poulsen	(Assist Prof)
M Rasmussen	(PostDoc)
D Heide	(PhD)
A Søndergaard	(Master)
T Zeyer	(Master)

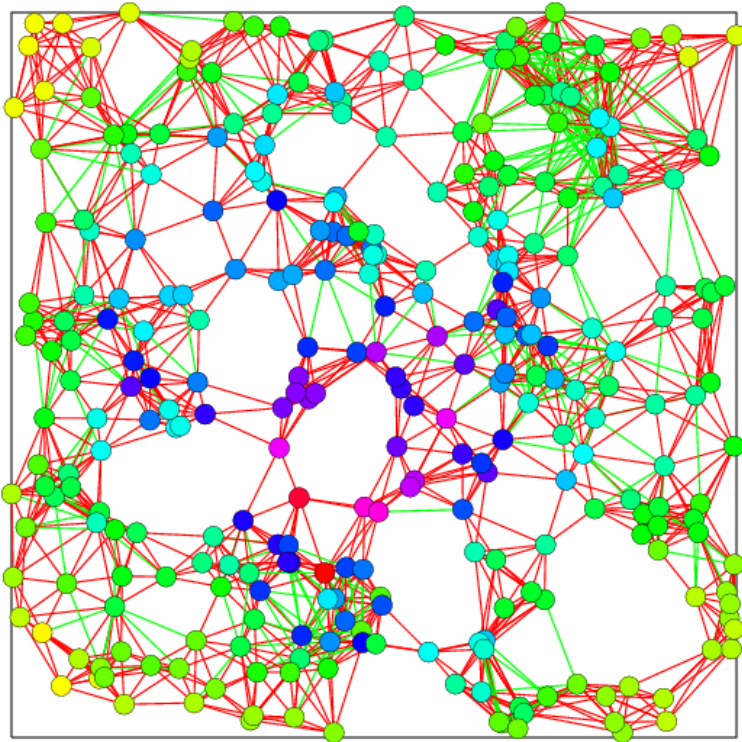
Wind-farm modeling + optimization + control



selfish : $P_{\text{farm}} = \sum_i \max(P_i(\varphi_i, f_i | u_i))$

cooperative : $P_{\text{farm}} = \max\left(\sum_i P_i(\varphi_i, f_i | u_i, \theta)\right)$

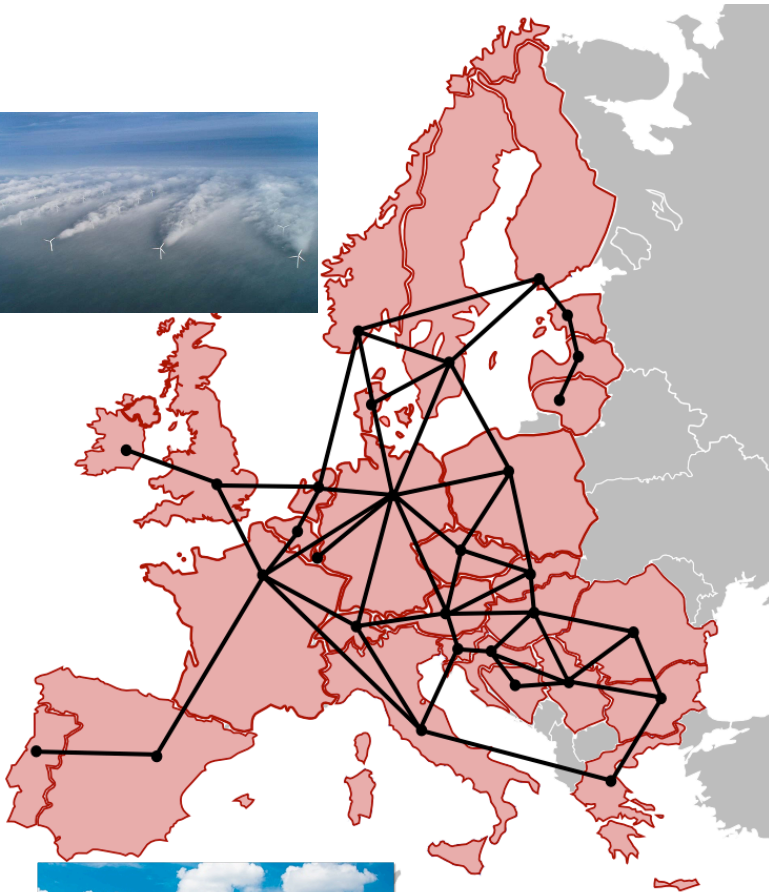
Physics of Complex Networks



**Communication networks (Internet),
Biological networks (gene interactions),
Social network engineering,
Electricity networks, ...**

**Structure, Dynamics, Function,
Robustness, Reliability,
Self-organization.**

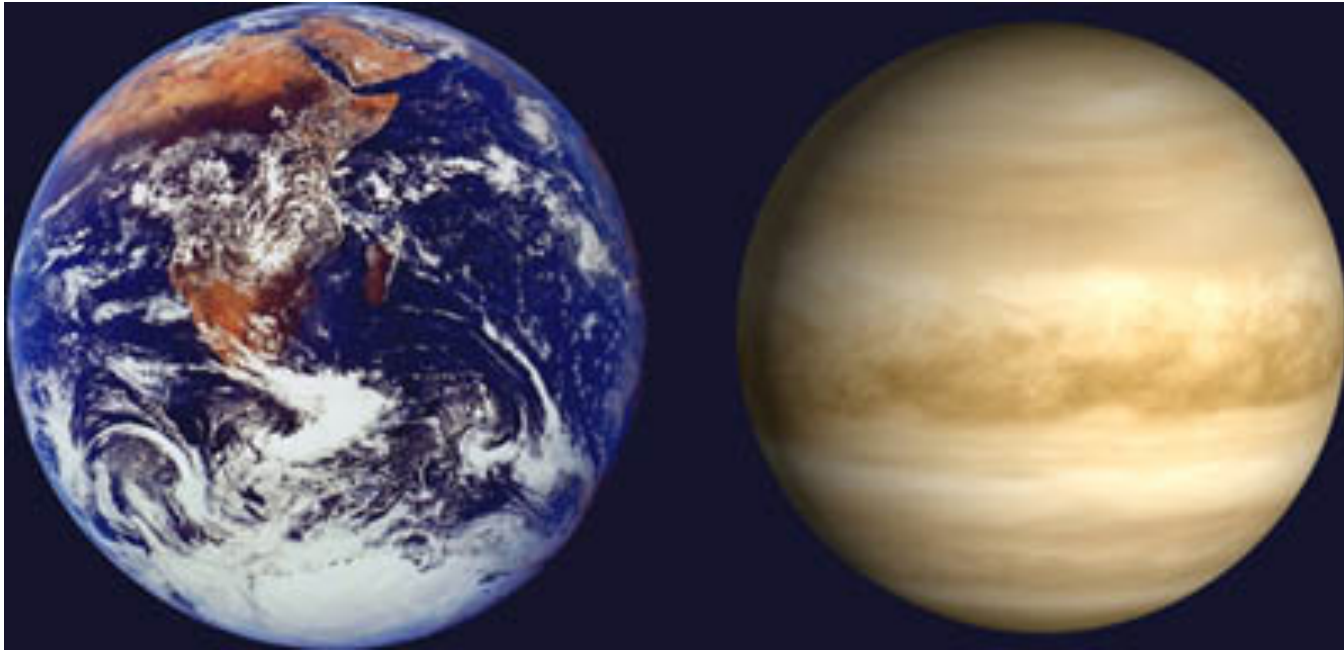
Design of a highly renewable pan-European energy system



Challenges for:
system engineering,
applied mathematics, and
physics of complex networks

**„Mehr als die Vergangenheit
interessiert mich die Zukunft,
denn in ihr gedenke ich zu leben.“**

(Albert Einstein)



Venus to Earth: „My friend, you look really sick.“

Earth: „This fever is getting worse and worse.“

Venus: „Have you caught a virus?“

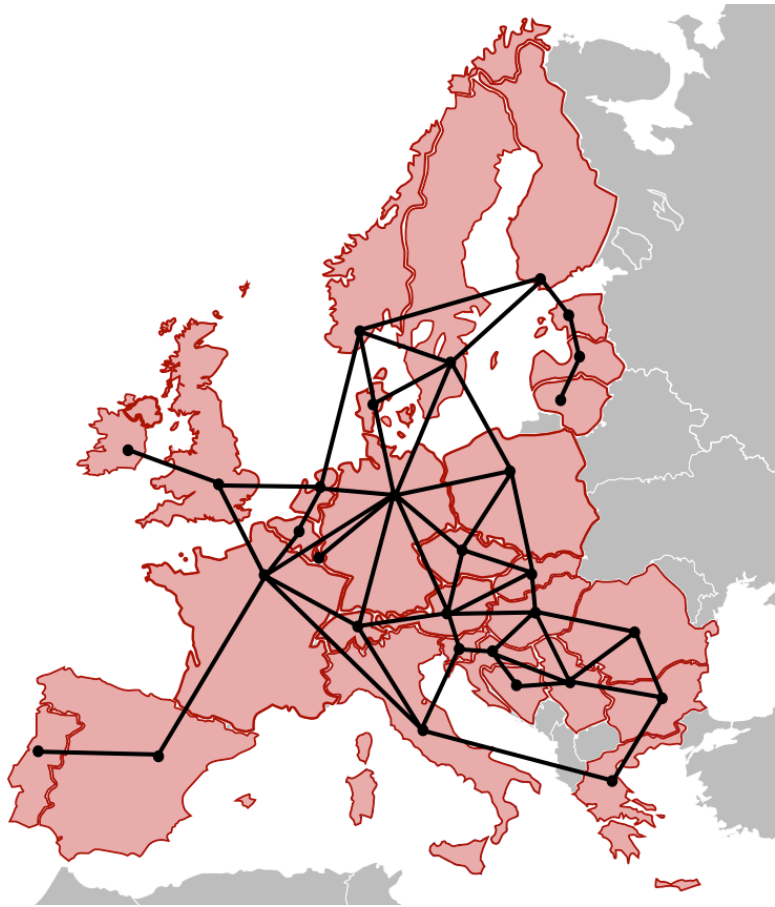
Earth: „My doctor says, I have Homo Sapiens.“

Venus: „Hmmmm ... don't worry, this vanishes.“

**More + more + ... renewables:
what is the end of the story?**

**Think backwards!
2050→2020**

Let the weather decide!



Let the weather decide!

$$G_n^W(t) + G_n^S(t) + B_n(t) + \sum_{ngb(n)} F_{\rightarrow n} + S_n^-$$

$$= L_n(t) + C_n(t) + \sum_{ngb(n)} F_{n\rightarrow} + S_n^+$$

$$\langle G_n^W + G_n^S \rangle = \gamma_n \langle L_n \rangle$$

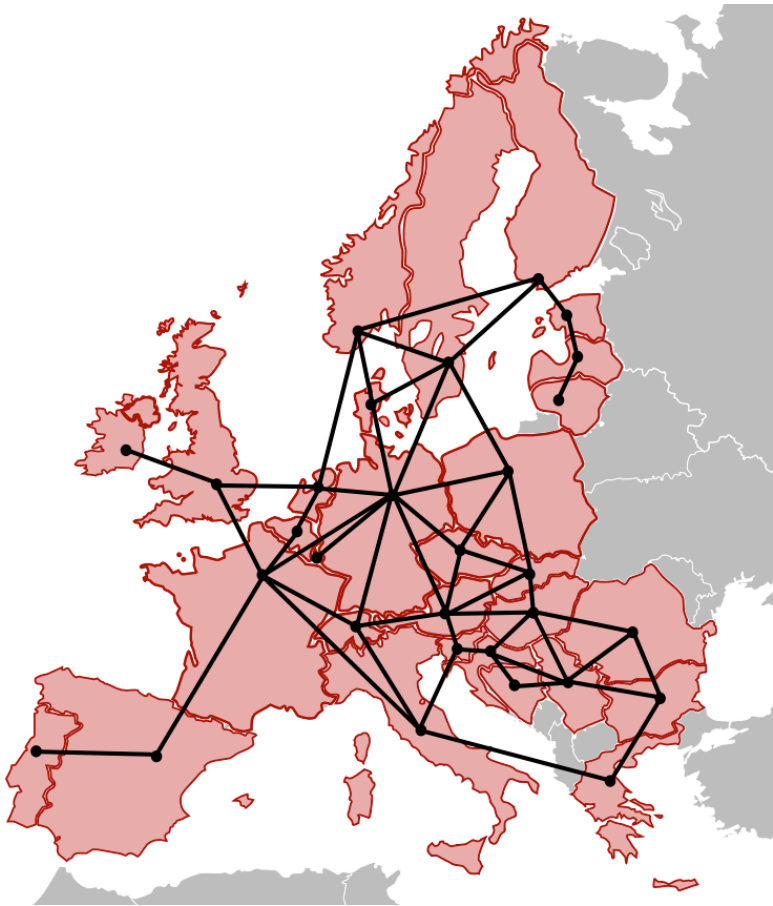
$$\langle G_n^W \rangle = \alpha_n \gamma_n \langle L_n \rangle$$

$$\langle G_n^S \rangle = (1 - \alpha_n) \gamma_n \langle L_n \rangle$$

actio = reactio

$$G_n^W(t) + G_n^S(t) - L_n(t) = C_n(t) - B_n(t) + \sum_{ngb(n)} (F_{n\rightarrow} - F_{\rightarrow n}) + (S_n^+ - S_n^-)$$

Let the weather decide!



$$G_n^{RES}(t) = G_n^W(t) + G_n^S(t)$$

$$L_n(t)$$

Renewable Energy Atlas

2000 – 2007: 1h, 45x45km²

1980 – 2010: 1h, 30x30km²

historical
load
(detrended)

$$\langle G_n^W + G_n^S \rangle = \gamma_n \langle L_n \rangle$$

$$\langle G_n^W \rangle = \alpha_n \gamma_n \langle L_n \rangle$$

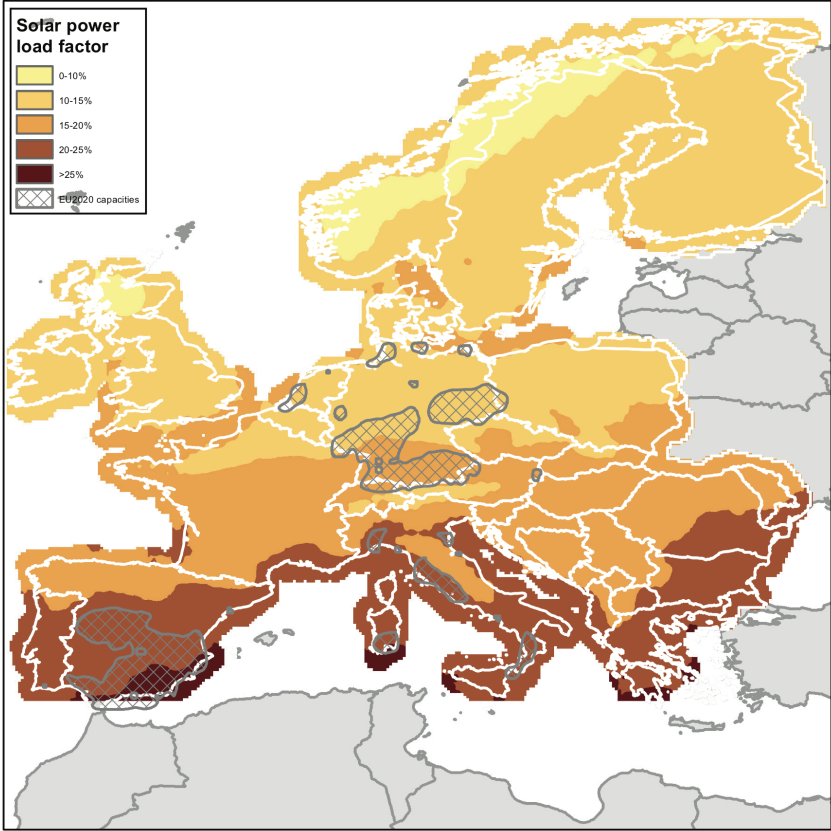
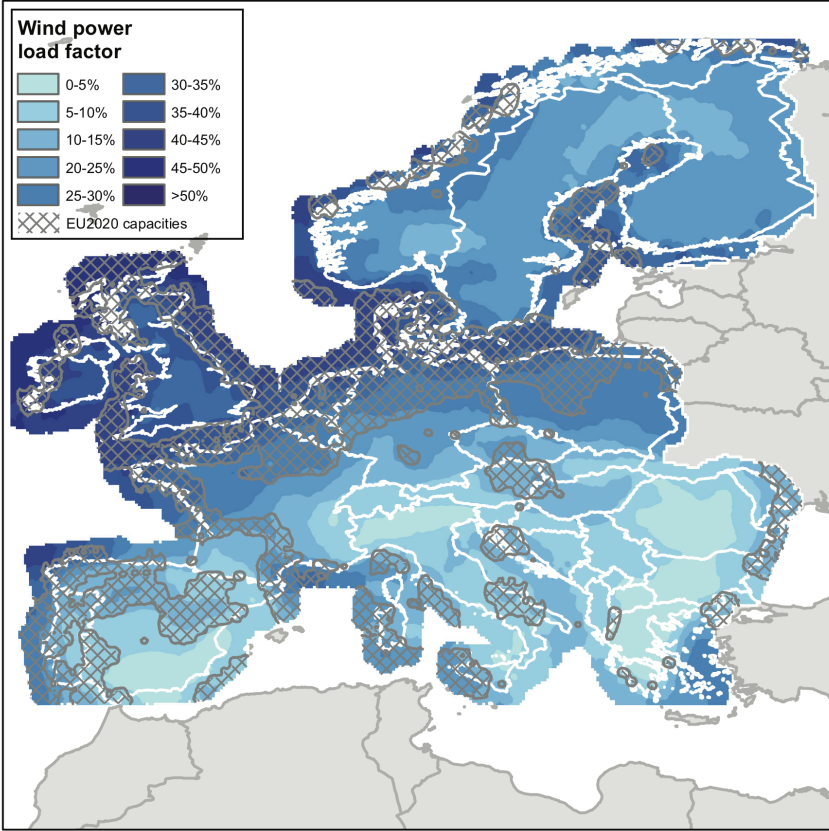
$$\langle G_n^S \rangle = (1 - \alpha_n) \gamma_n \langle L_n \rangle$$

actio = reactio

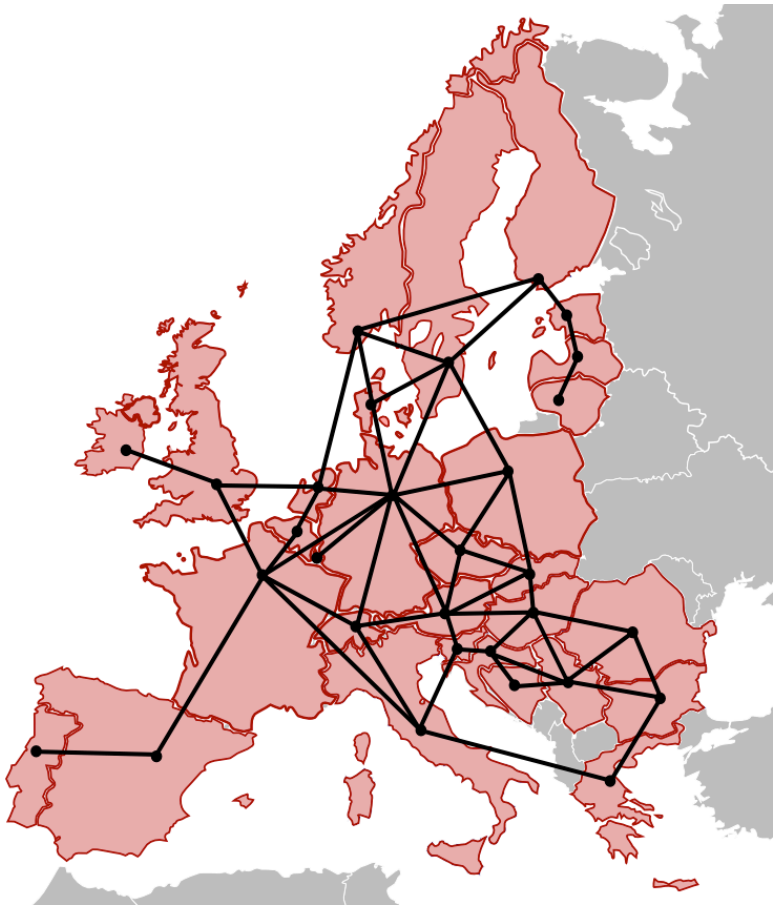
$$G_n^W(t) + G_n^S(t) - L_n(t) = C_n(t) - B_n(t) + \sum_{ngb(n)} (F_{n \rightarrow} - F_{\rightarrow n}) + (S_n^+ - S_n^-)$$

wind-power

solar-power



Let the weather decide!



$$G_n^{RES}(t) = G_n^W(t) + G_n^S(t)$$

$$L_n(t)$$

Renewable Energy Atlas

2000 – 2007: 1h, 45x45km²

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historical
load
(detrended)

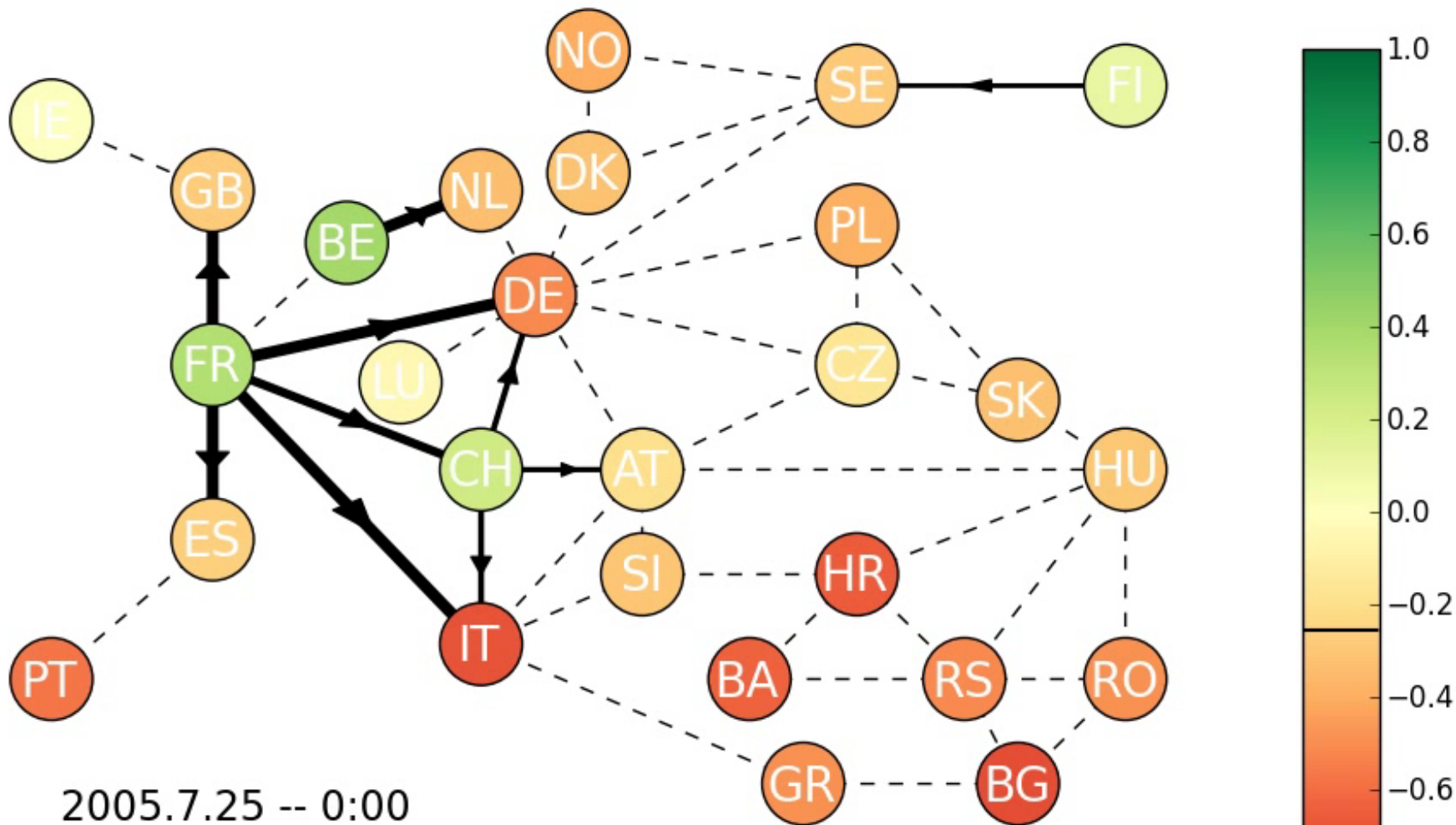
$$\langle G_n^W + G_n^S \rangle = \gamma_n \langle L_n \rangle$$

$$\langle G_n^W \rangle = \alpha_n \gamma_n \langle L_n \rangle$$

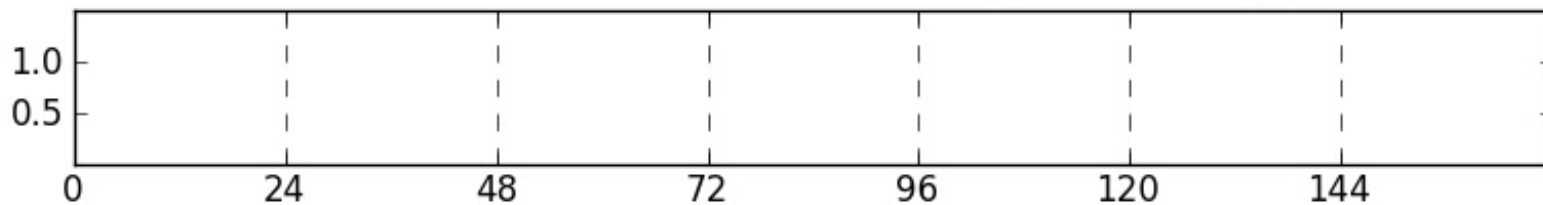
$$\langle G_n^S \rangle = (1 - \alpha_n) \gamma_n \langle L_n \rangle$$

actio = reactio

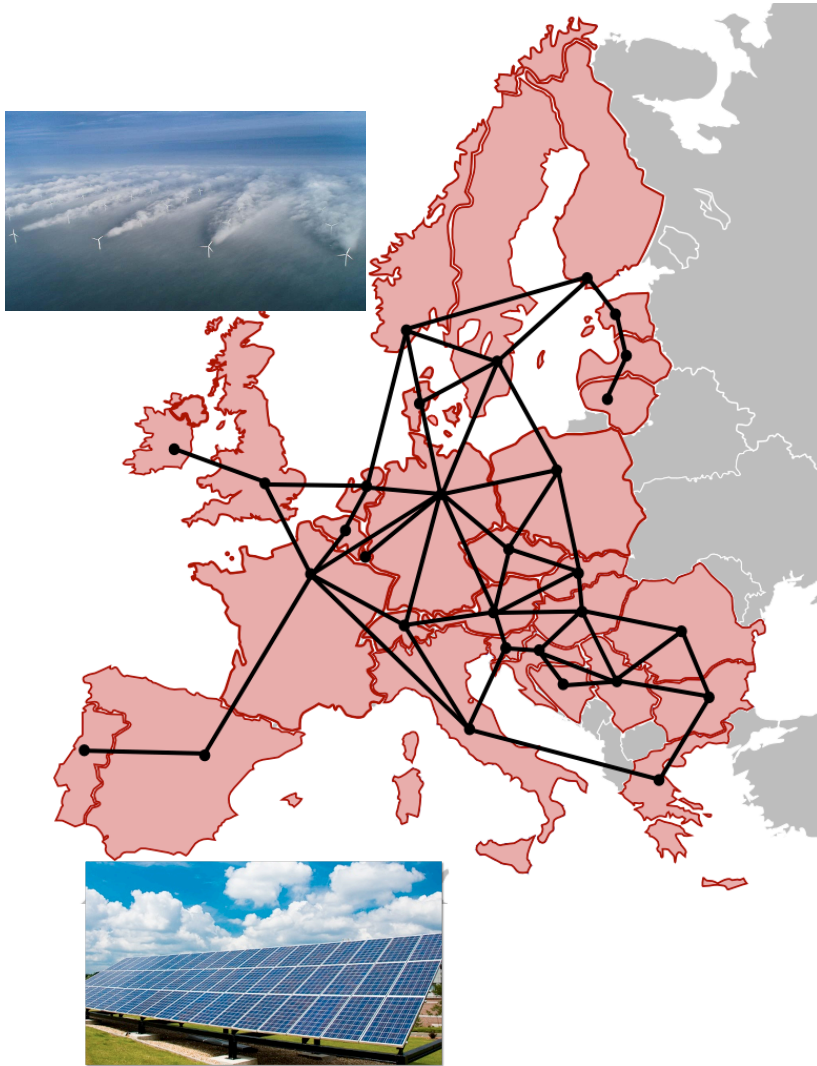
$$G_n^W(t) + G_n^S(t) - L_n(t) = C_n(t) - B_n(t) + \sum_{ngb(n)} (F_{n \rightarrow} - F_{\rightarrow n}) + (S_n^+ - S_n^-)$$



2005.7.25 -- 0:00



Technical + economical design of a highly renewable pan-European energy system



How much ...

... wind energy?

... solar PV energy?

... backup energy + power?

... transmission?

... storage?

... coupling of energy sectors?

and what about

... transition 2050 → 2014?

... future markets

$$G_n^W(t) + G_n^S(t) - L_n(t) = C_n(t) - B_n(t) + \sum_{ngb(n)} (F_{n \rightarrow} - F_{\rightarrow n}) + (S_n^+ - S_n^-)$$

- ① only Backup
- ② only Storage
- ③ Backup + Storage

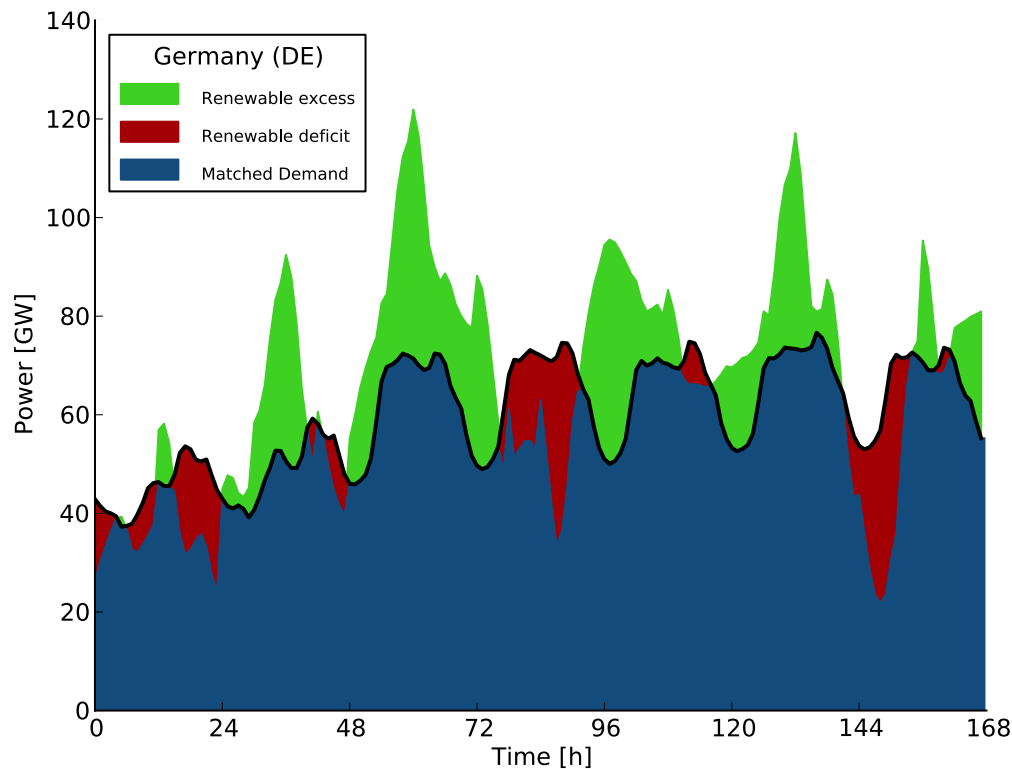
- ④ 2015 \leftrightarrow 2050
- ⑤ Transmission + Backup
- ⑥ Economics
- ⑦ outlook: CONSENSYS

How much wind + solar power?

Mismatch distribution (Germany)

$$\Delta_n(t) = G_n^{RES}(t) - L_n(t) = C_n(t) - B_n(t)$$

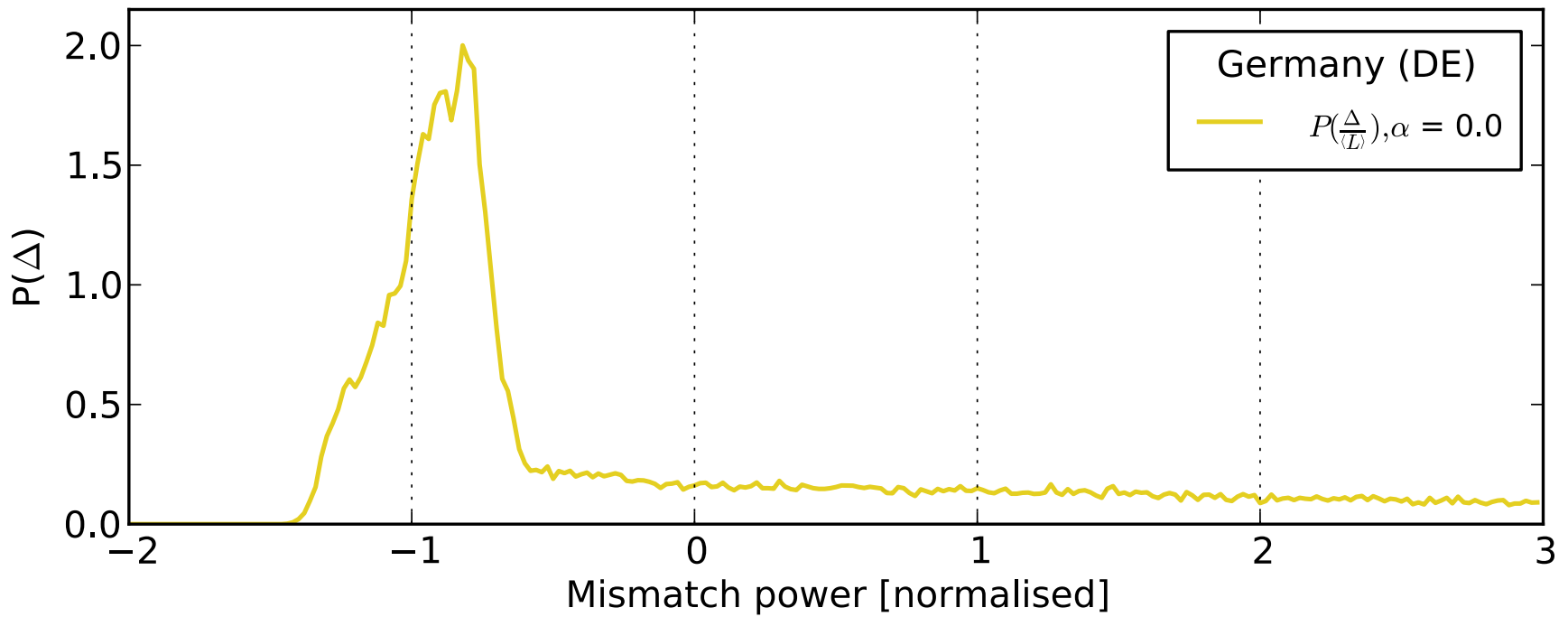
$$\langle G_n^{RES} \rangle = \langle L_n \rangle$$

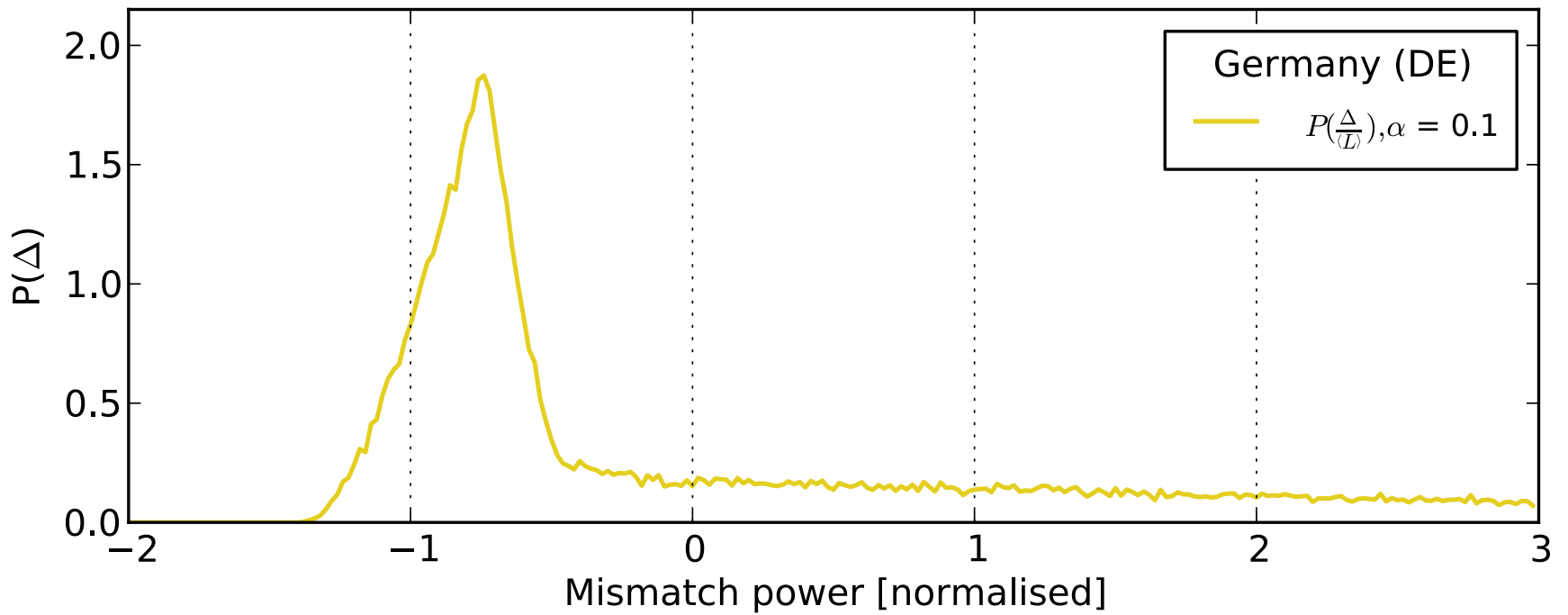


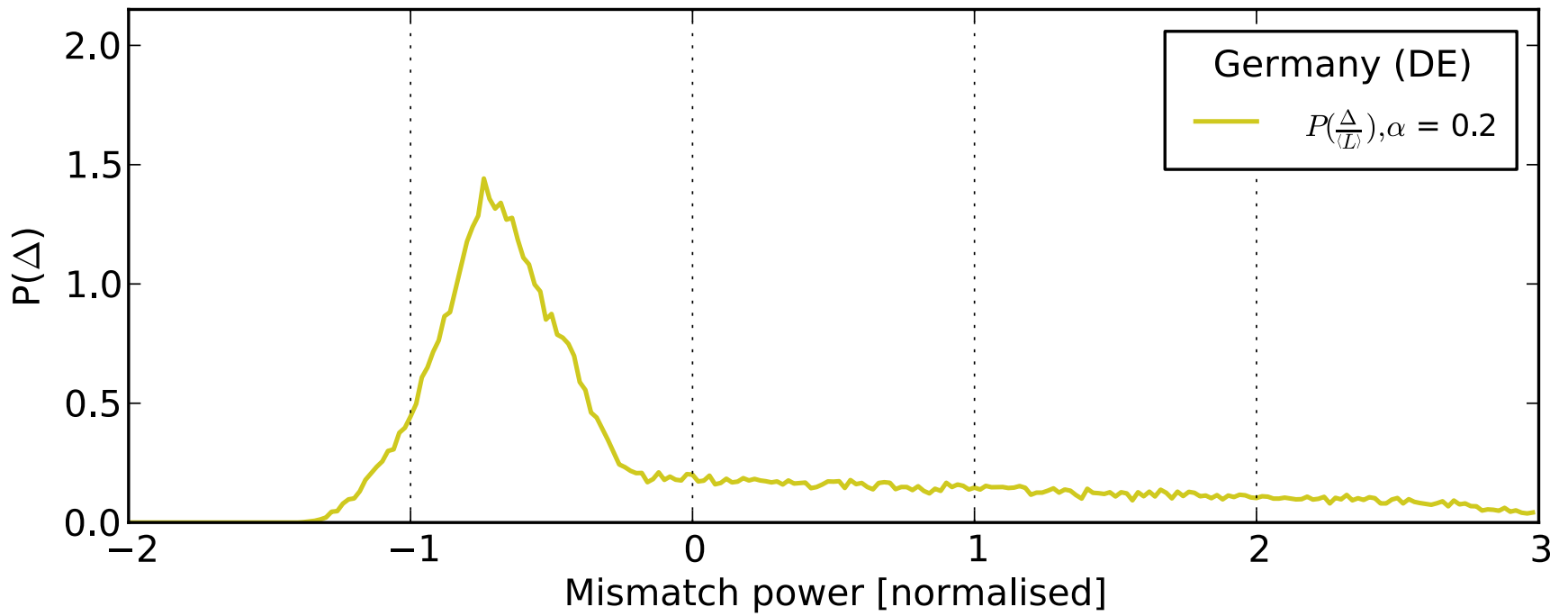
$$C_n(t) = \max(\Delta(t), 0)$$

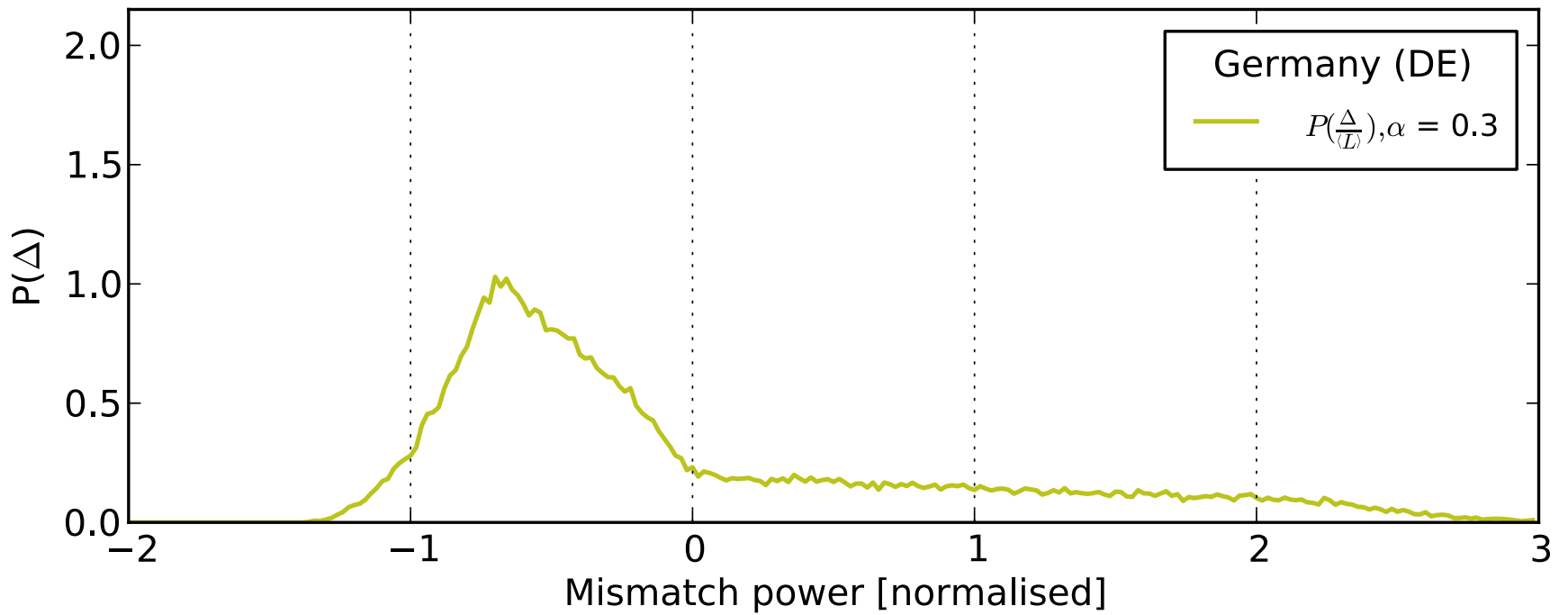
$$B_n(t) = -\min(\Delta(t), 0)$$

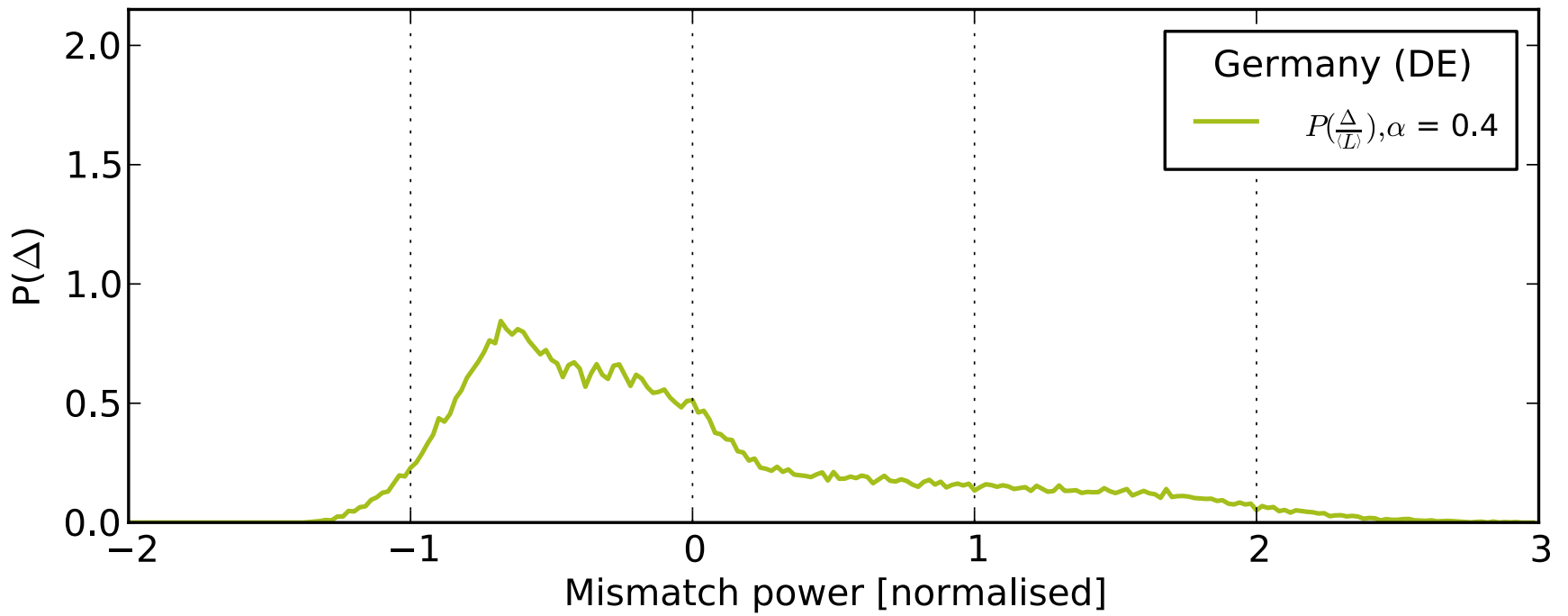
$$\alpha_n = \frac{\langle G_n^W \rangle}{\langle G_n^{RES} \rangle}$$

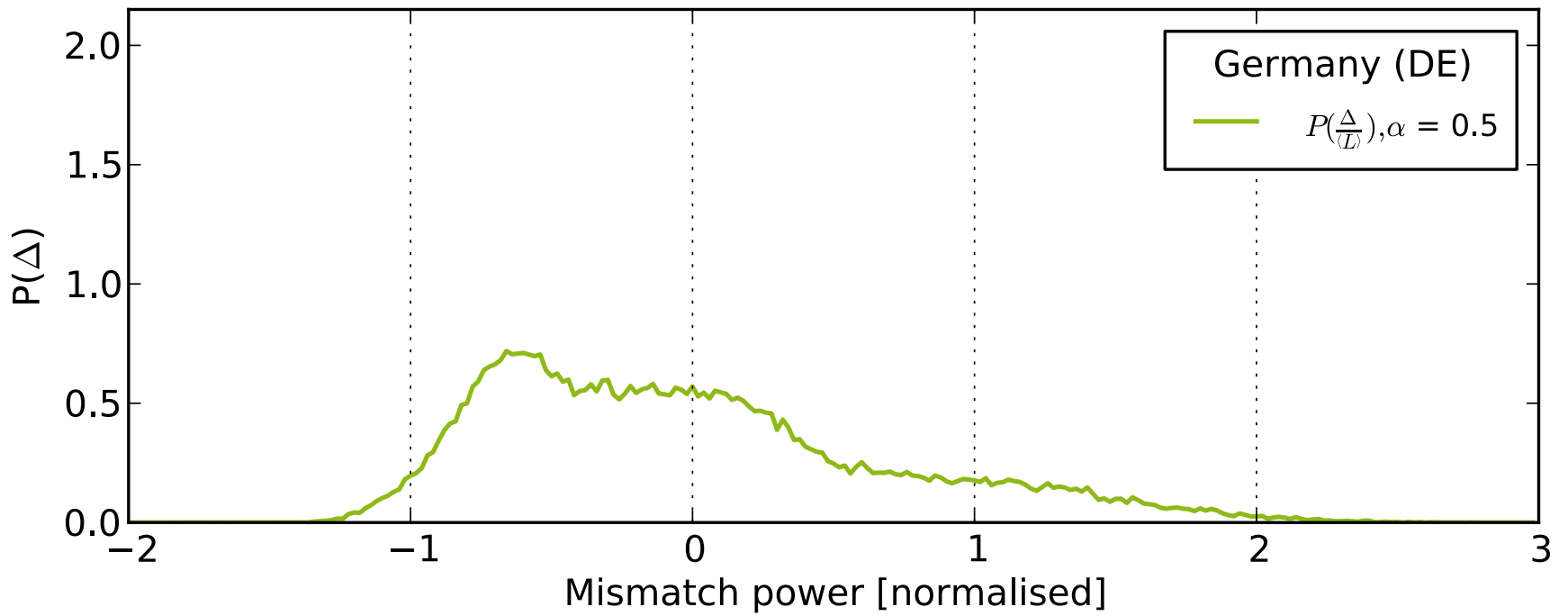


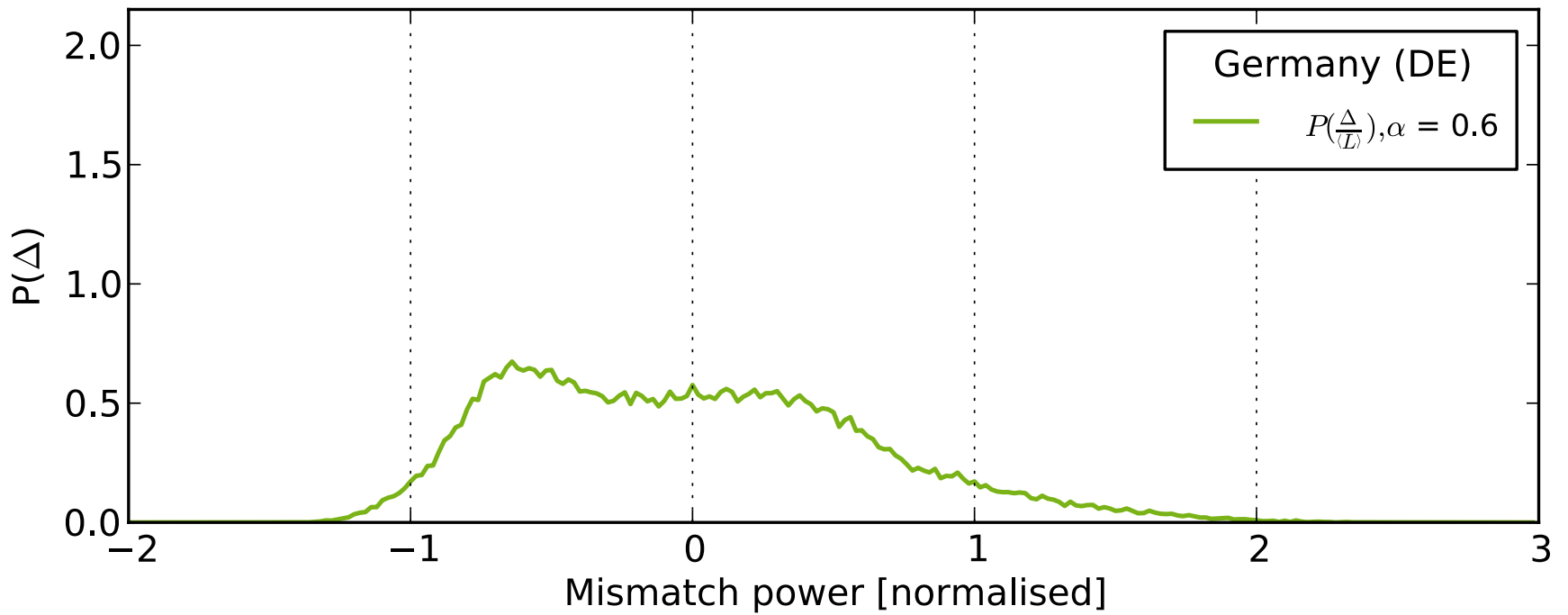


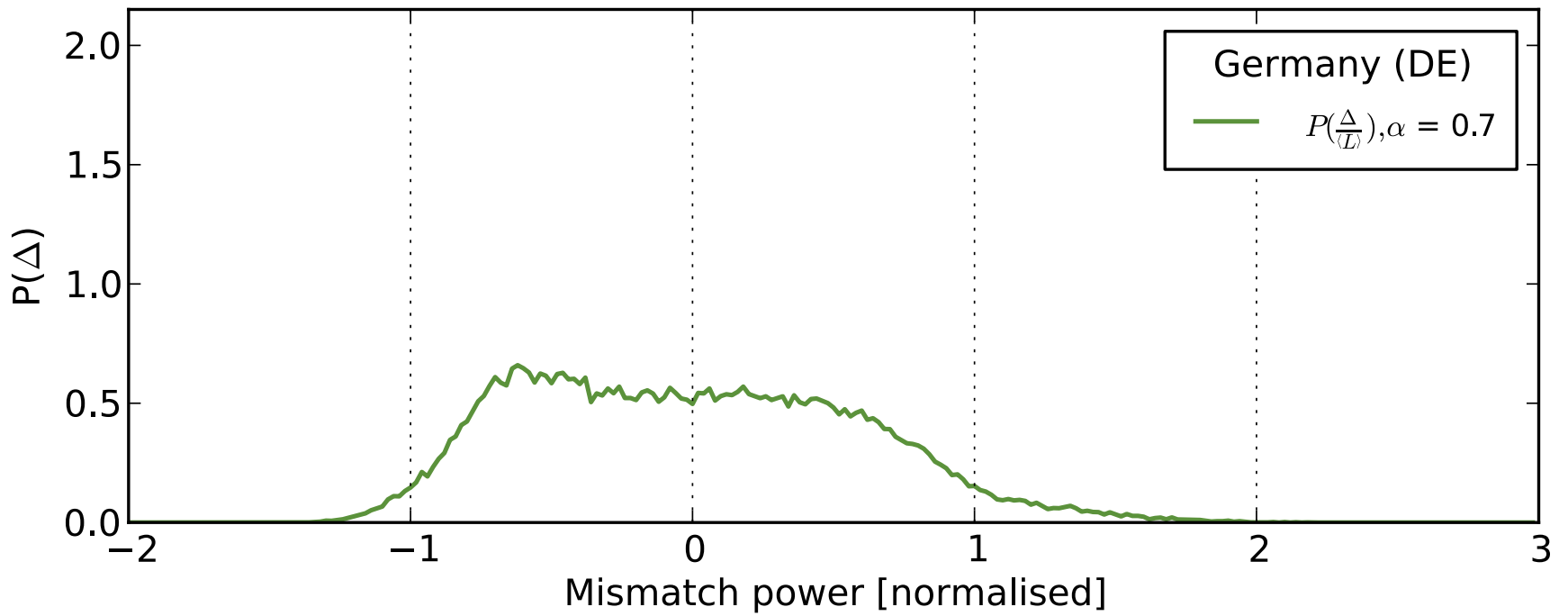


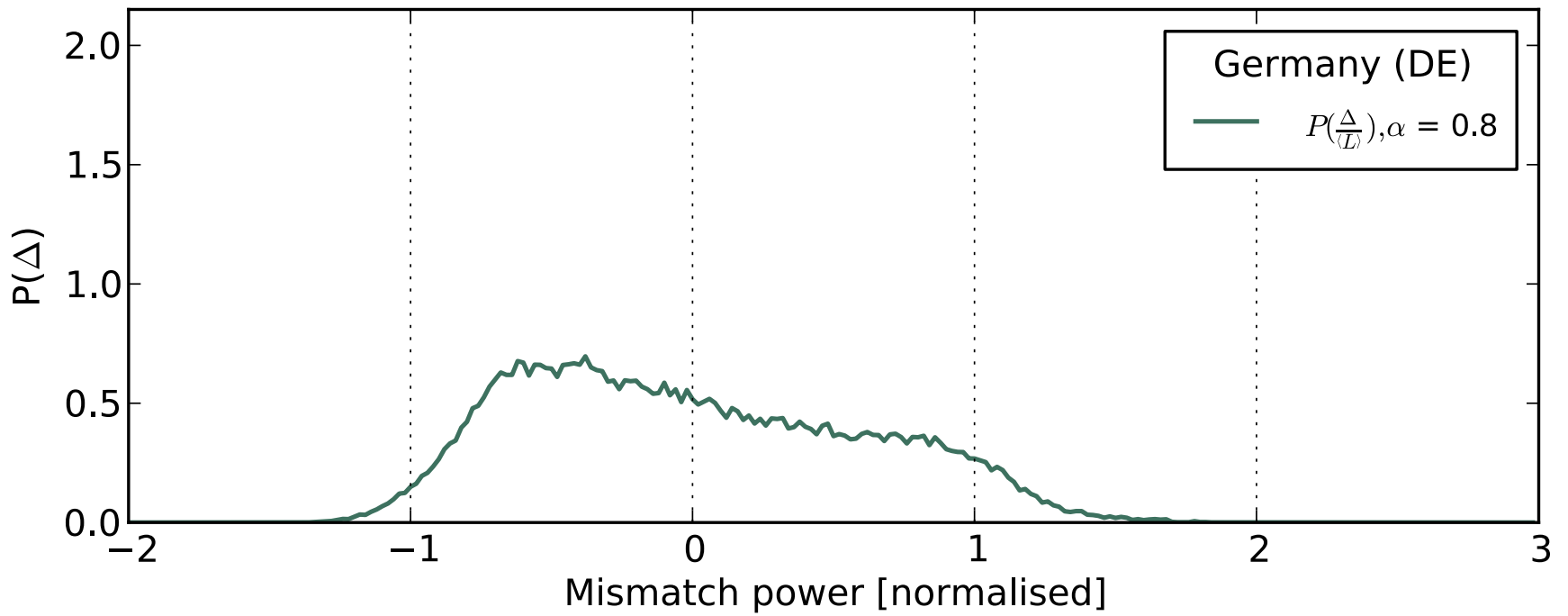


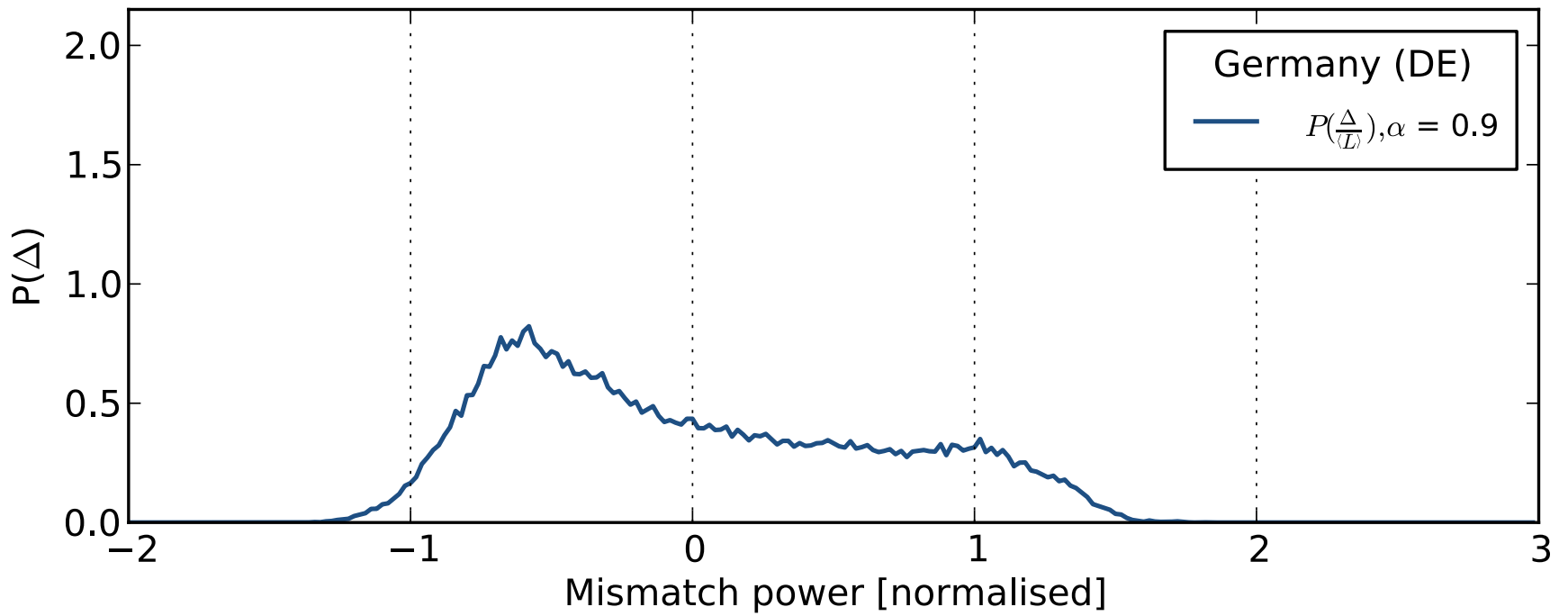


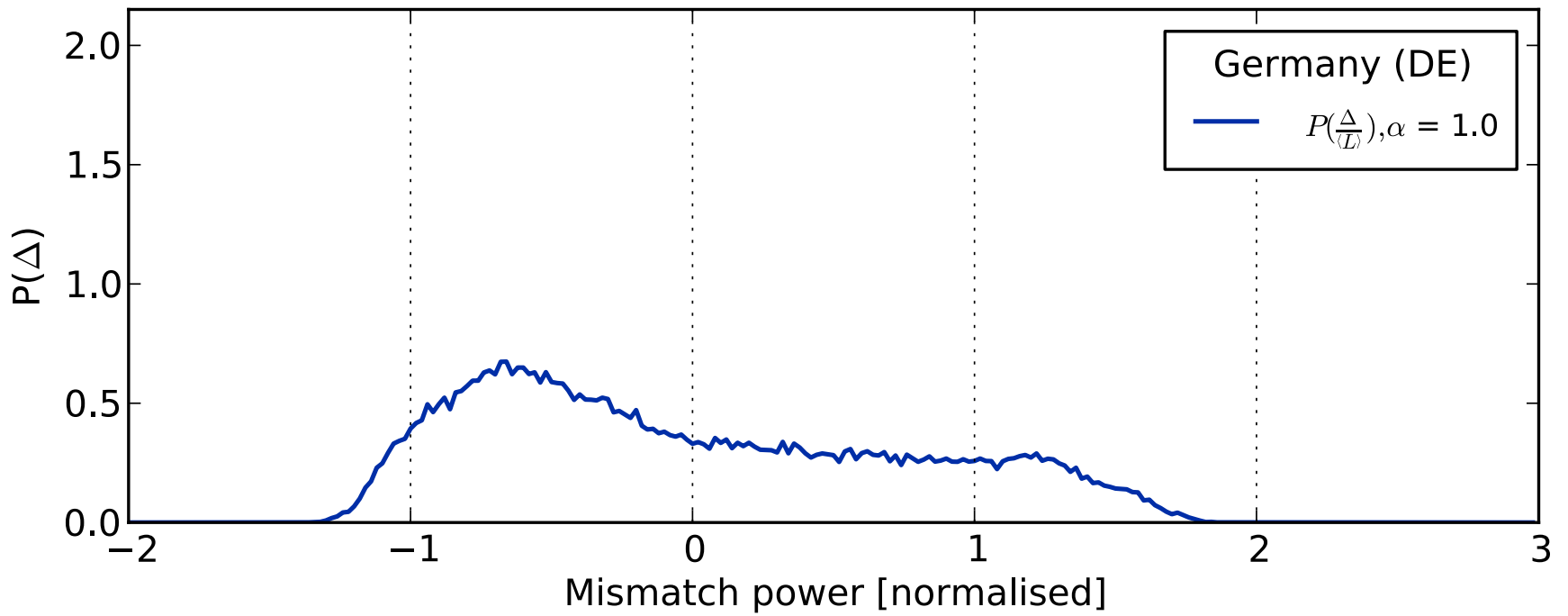








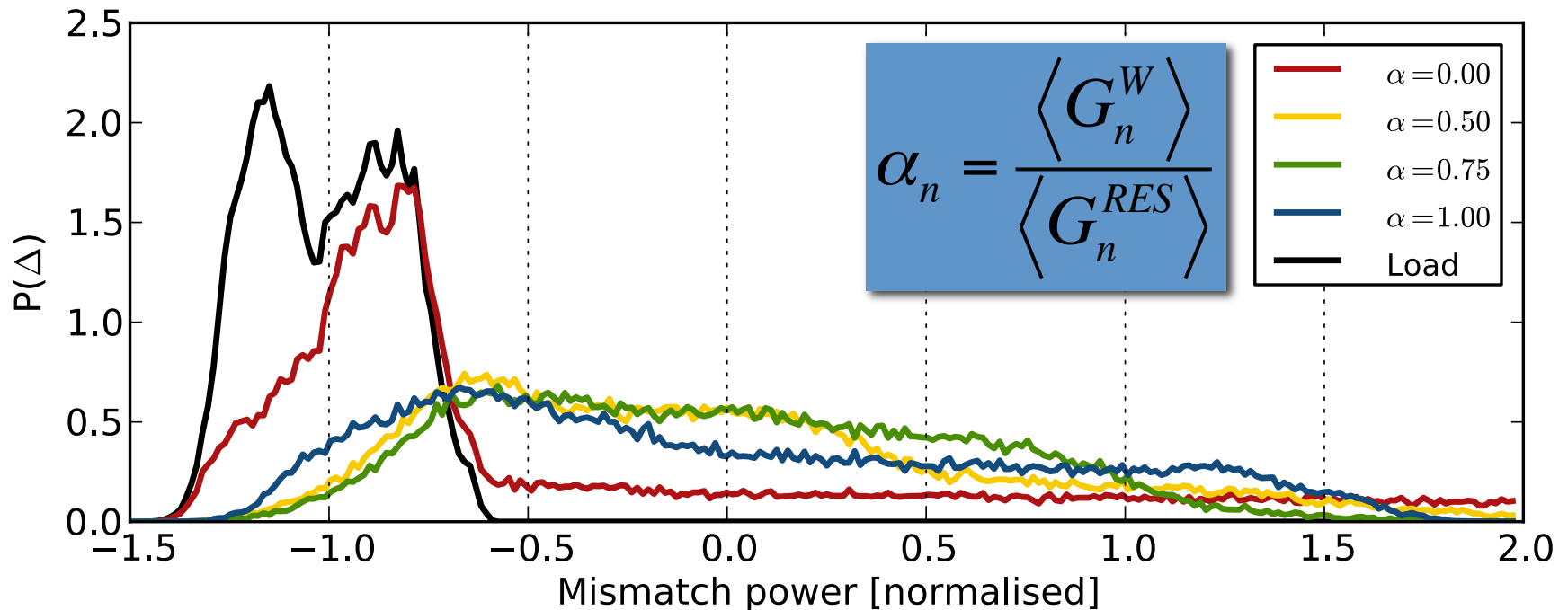




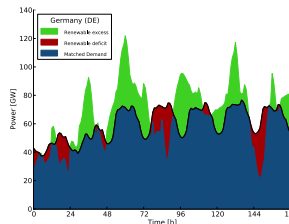
Mismatch distribution (Germany)

$$\Delta_n(t) = G_n^{RES}(t) - L_n(t)$$

$$\langle G_n^{RES} \rangle = \langle L_n \rangle$$



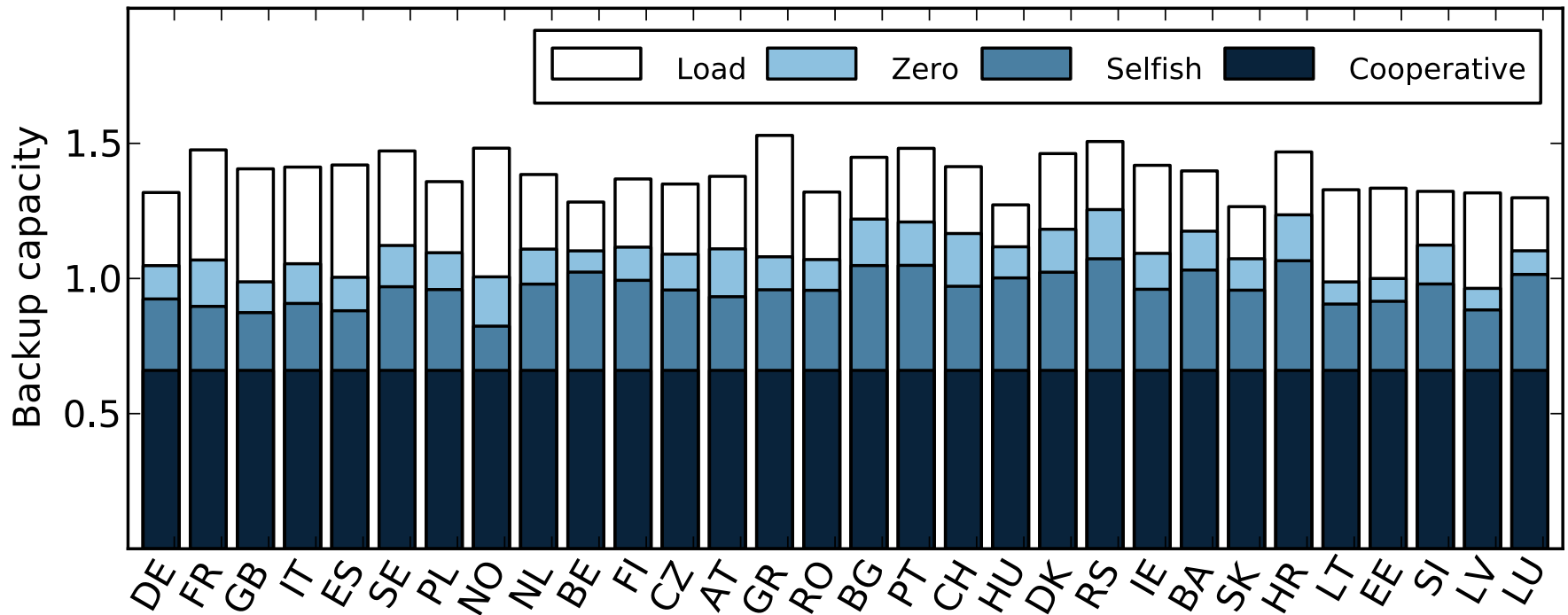
$$B_n(t) = -\min(\Delta(t), 0)$$



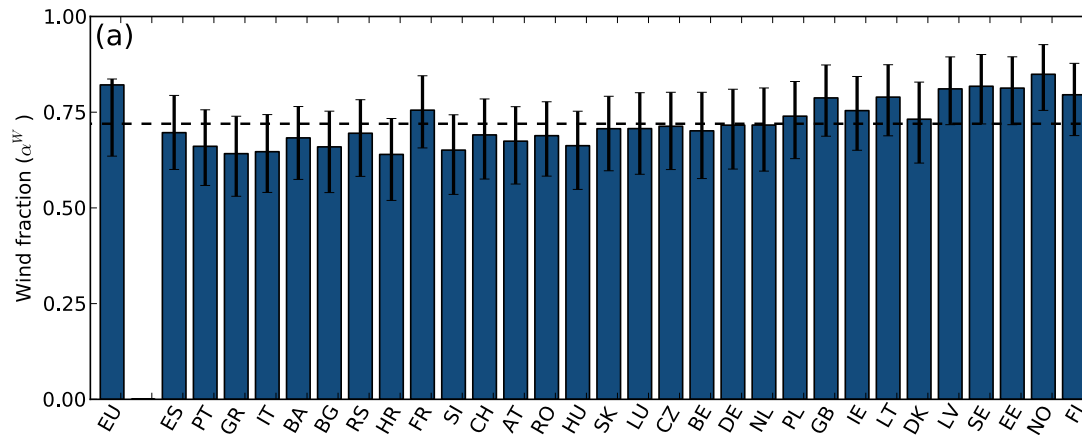
$$C_n(t) = \max(\Delta(t), 0)$$



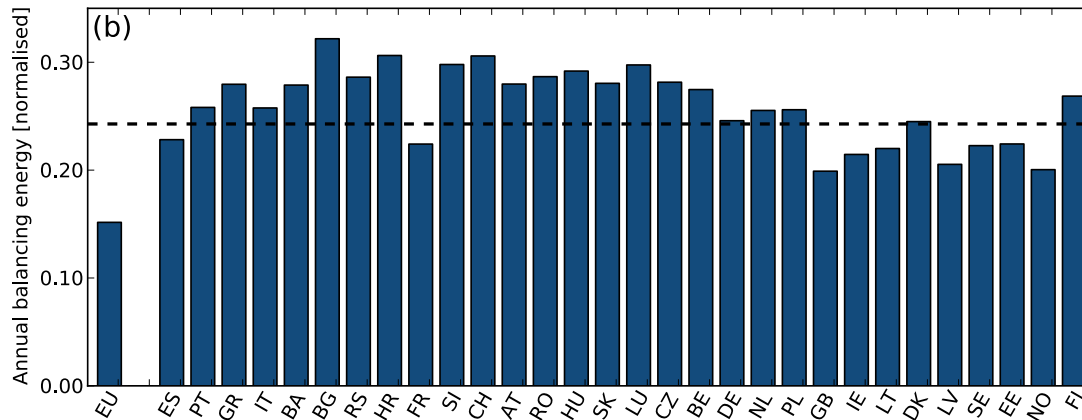
BACKUP CAPACITY of EU countries (zero transmission)



BACKUP ENERGIES of EU countries (zero transmission)



$$\alpha_{\min} \approx 0.70$$



$$\langle B_n \rangle \approx 0.24$$

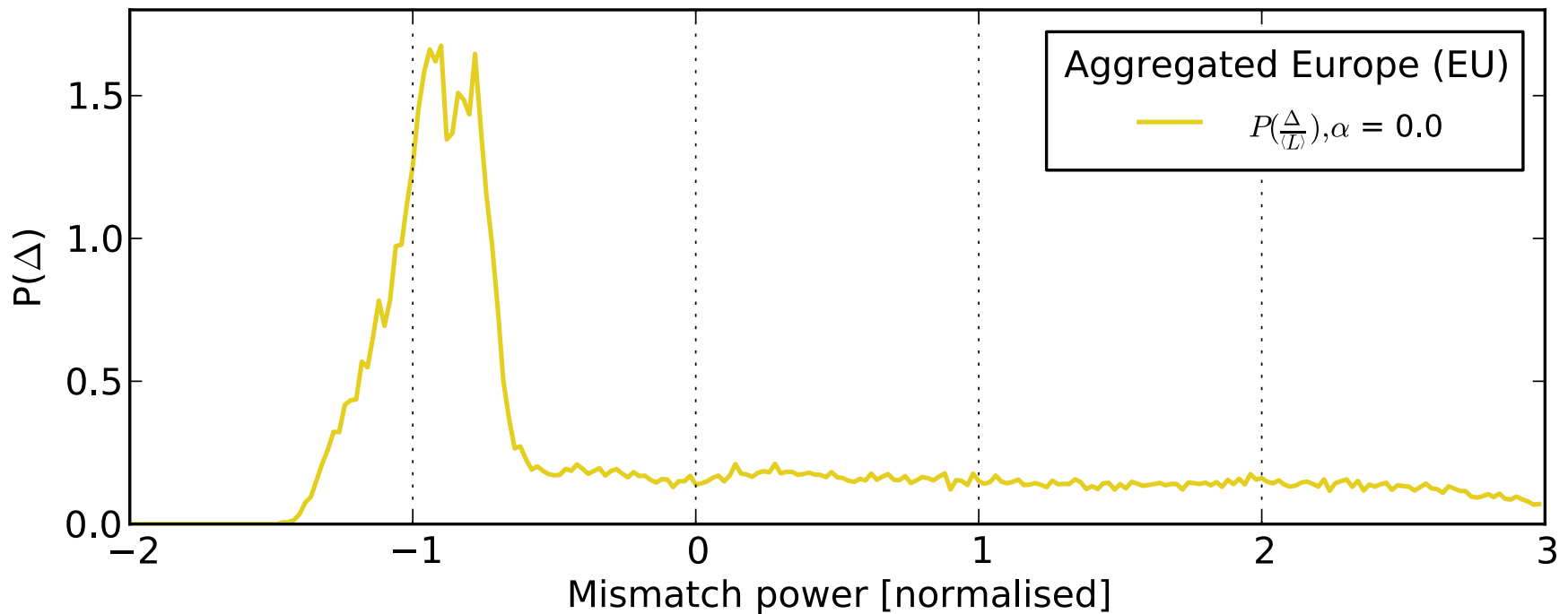
Mismatch distribution (Europe)

$$G_n^{RES}(t) - L_n(t) = C_n(t) - B_n(t) + \sum_{ngb(n)} (F_{n \rightarrow} - F_{\rightarrow n})$$

$$\begin{aligned} \Delta_{EU}(t) &= \sum_n G_n^{RES}(t) - \sum_n L_n(t) &&= G_{EU}^{RES}(t) - L_{EU}(t) \\ &= \sum_n (C_n(t) - B_n(t)) + \underbrace{\sum_n \sum_{ngb(n)} (F_{n \rightarrow} - F_{\rightarrow n})}_{=0} &&= C_{EU}(t) - B_{EU}(t) \end{aligned}$$

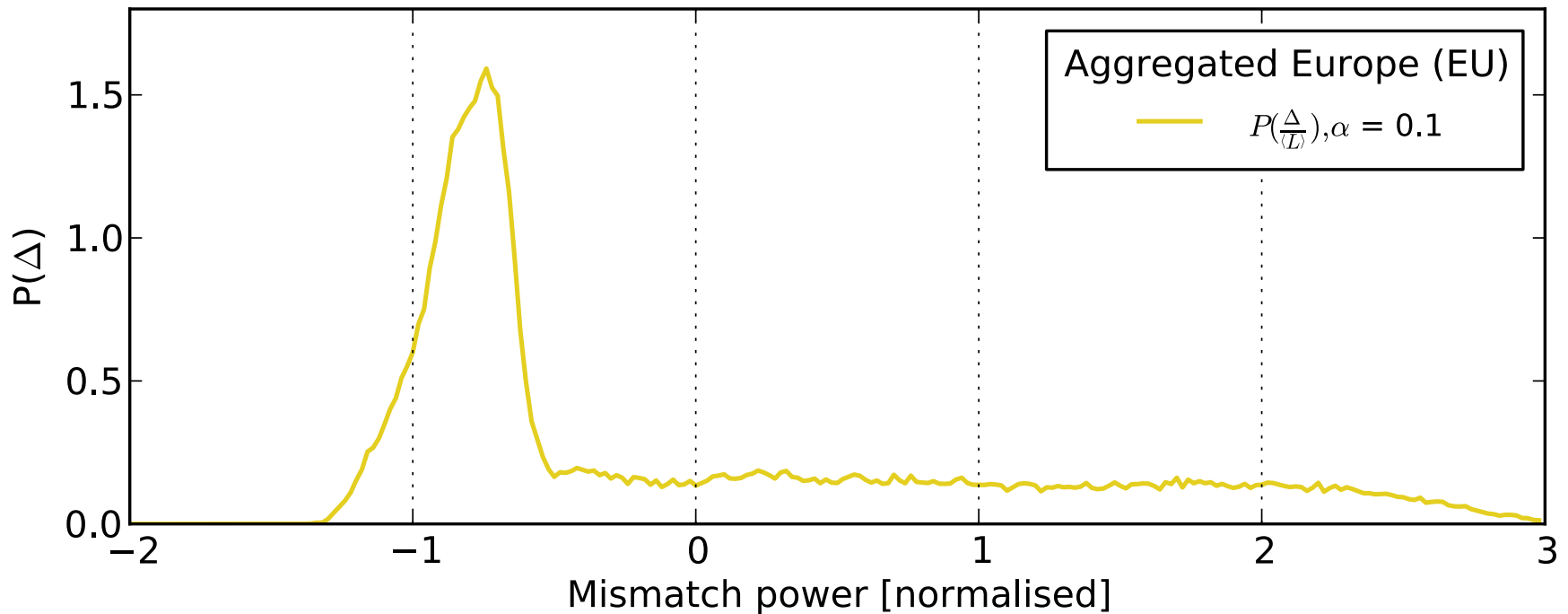
Mismatch distribution (Europe)

$$\Delta_{EU}(t) = G_{EU}^{RES}(t) - L_{EU}(t)$$



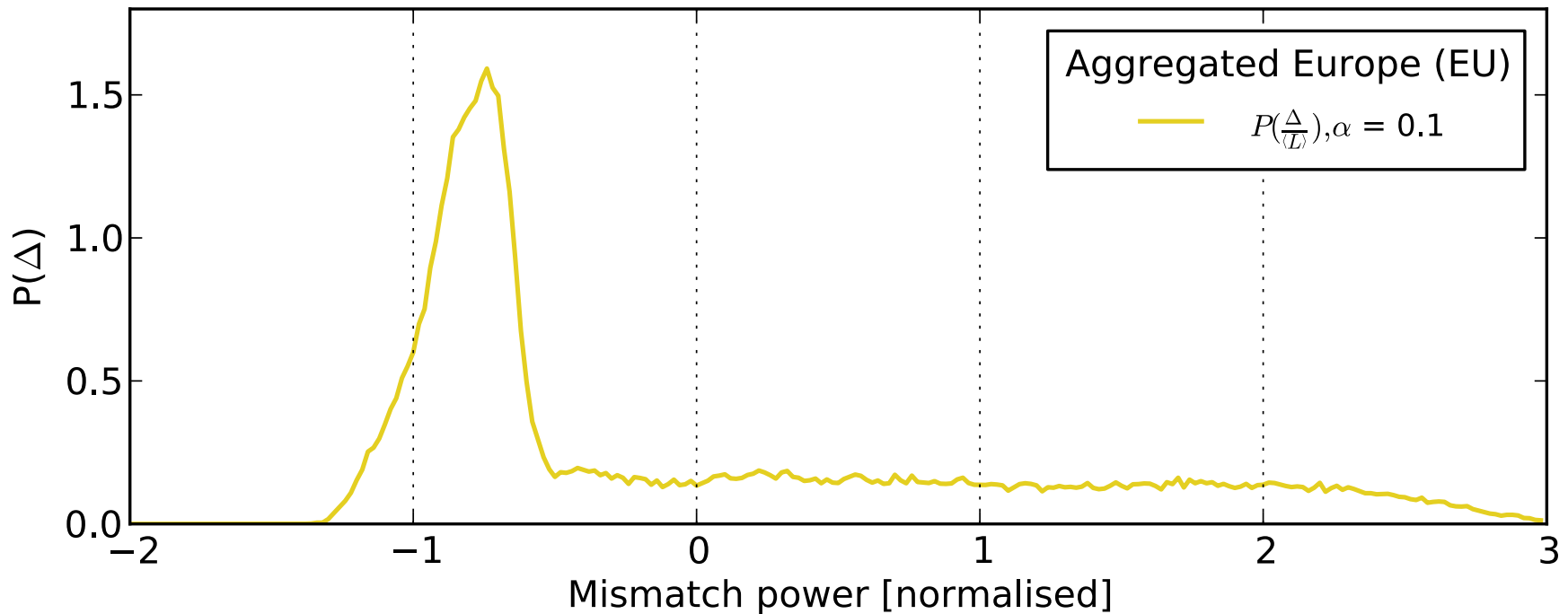
Mismatch distribution (Europe)

$$\Delta_{EU}(t) = G_{EU}^{RES}(t) - L_{EU}(t)$$



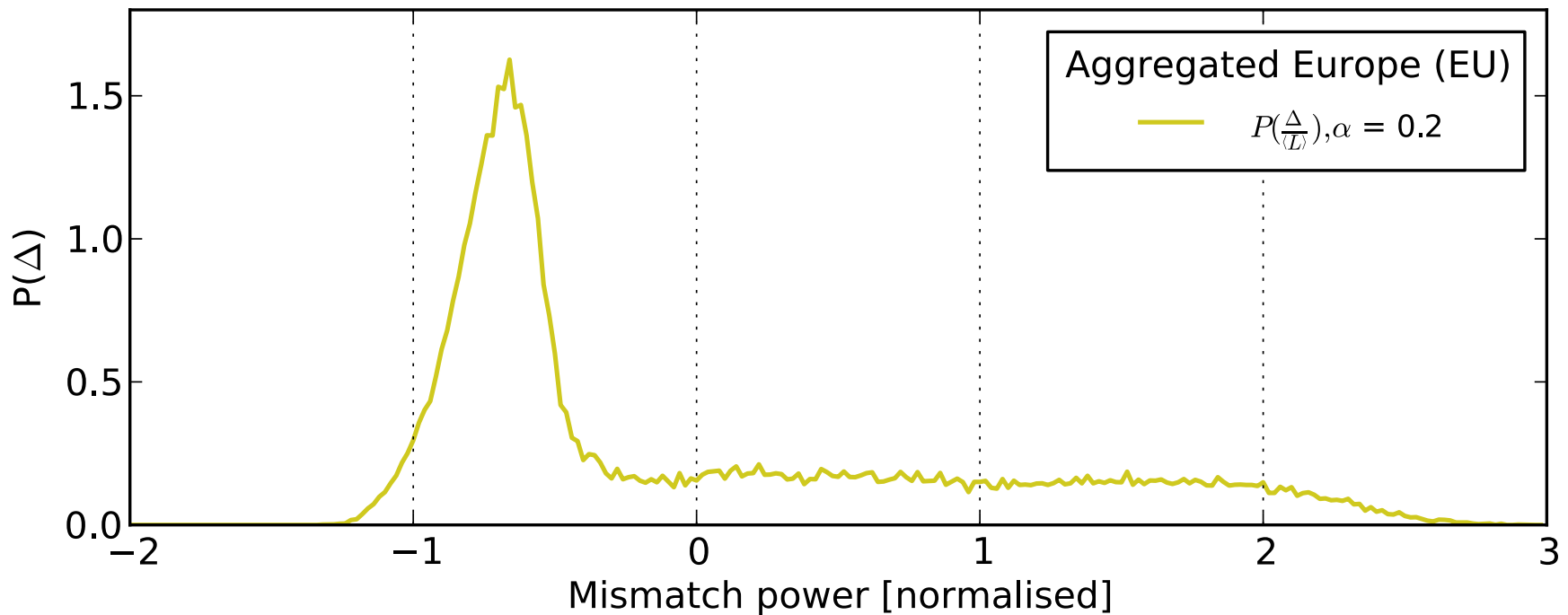
Mismatch distribution (Europe)

$$\Delta_{EU}(t) = G_{EU}^{RES}(t) - L_{EU}(t)$$



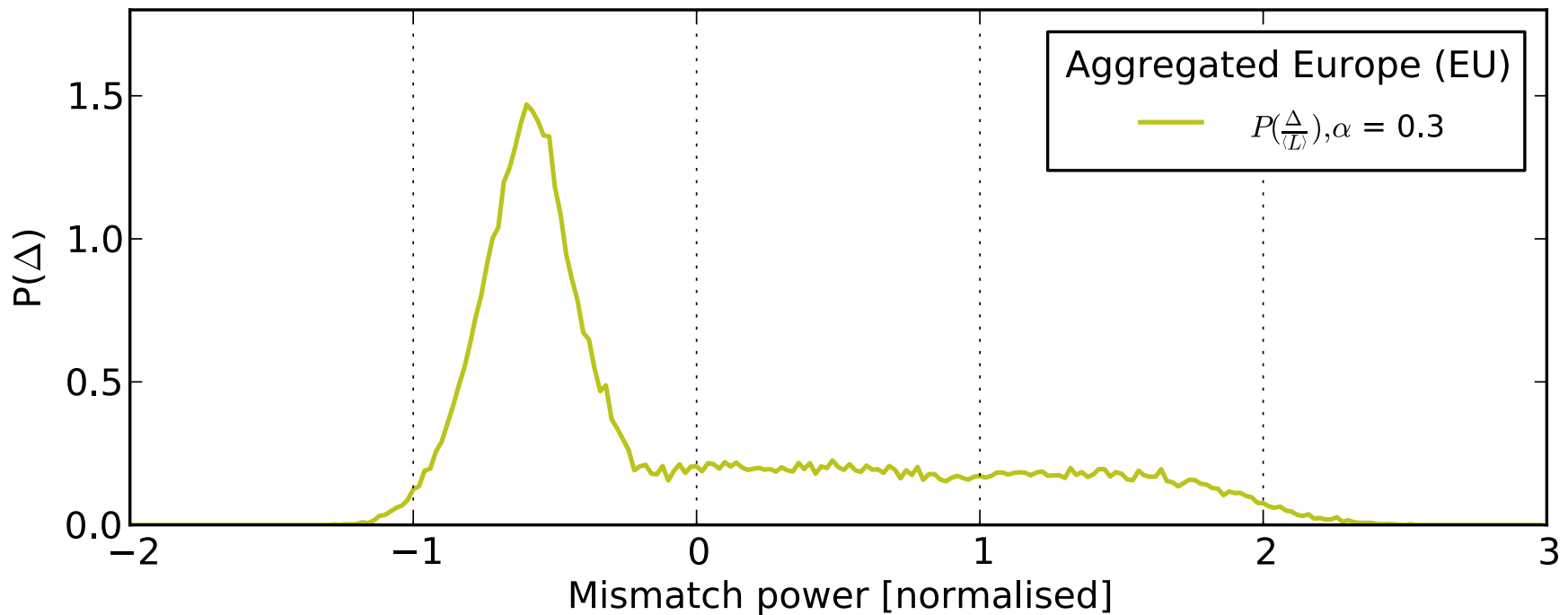
Mismatch distribution (Europe)

$$\Delta_{EU}(t) = G_{EU}^{RES}(t) - L_{EU}(t)$$



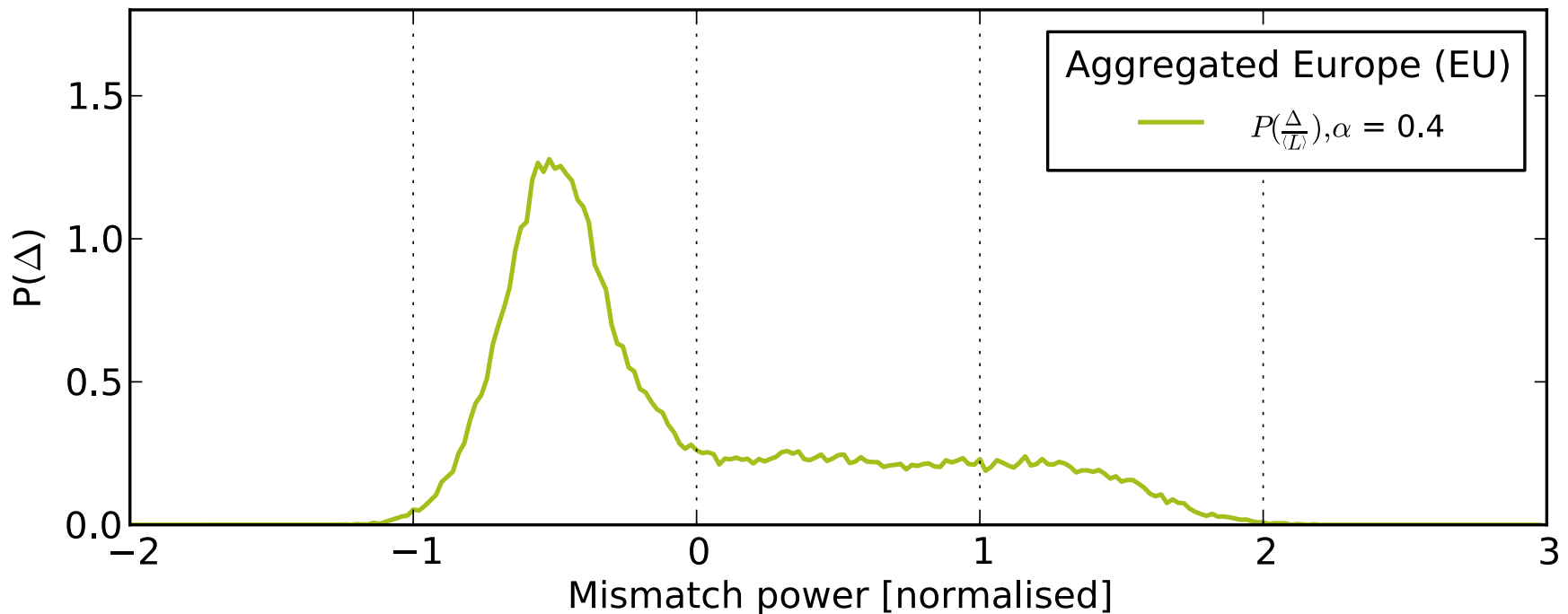
Mismatch distribution (Europe)

$$\Delta_{EU}(t) = G_{EU}^{RES}(t) - L_{EU}(t)$$



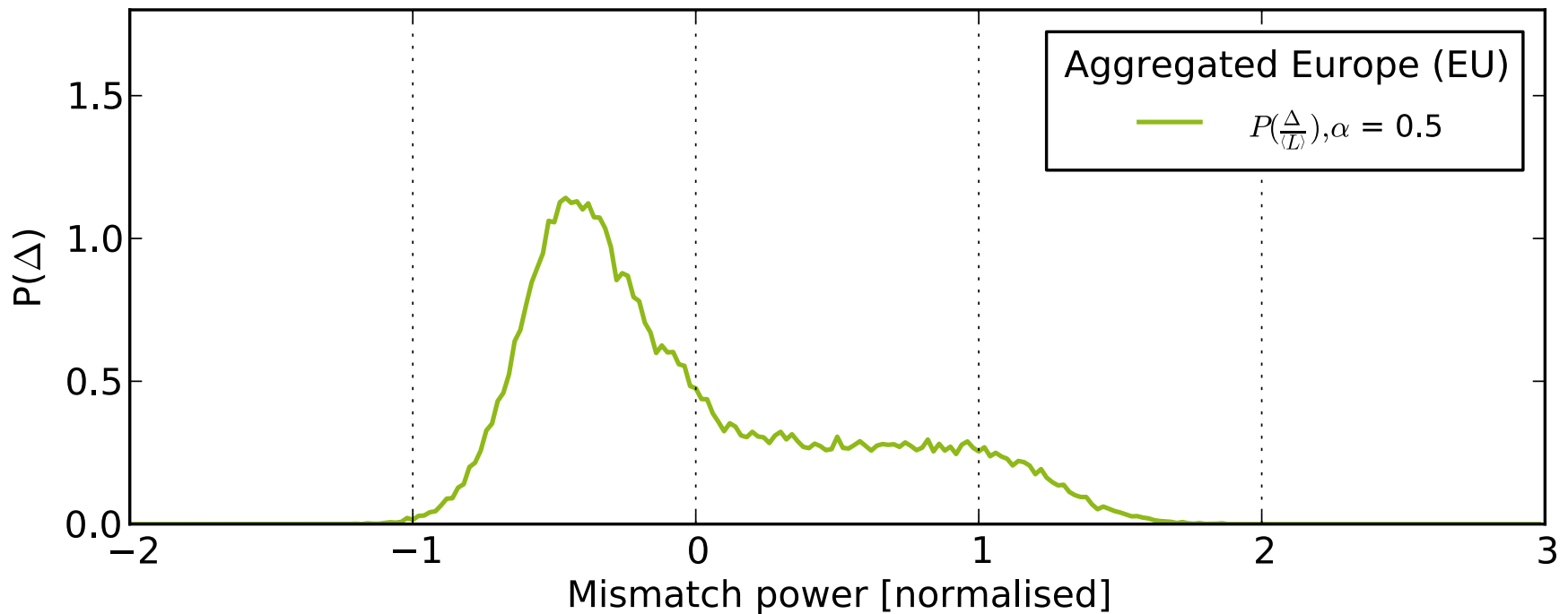
Mismatch distribution (Europe)

$$\Delta_{EU}(t) = G_{EU}^{RES}(t) - L_{EU}(t)$$



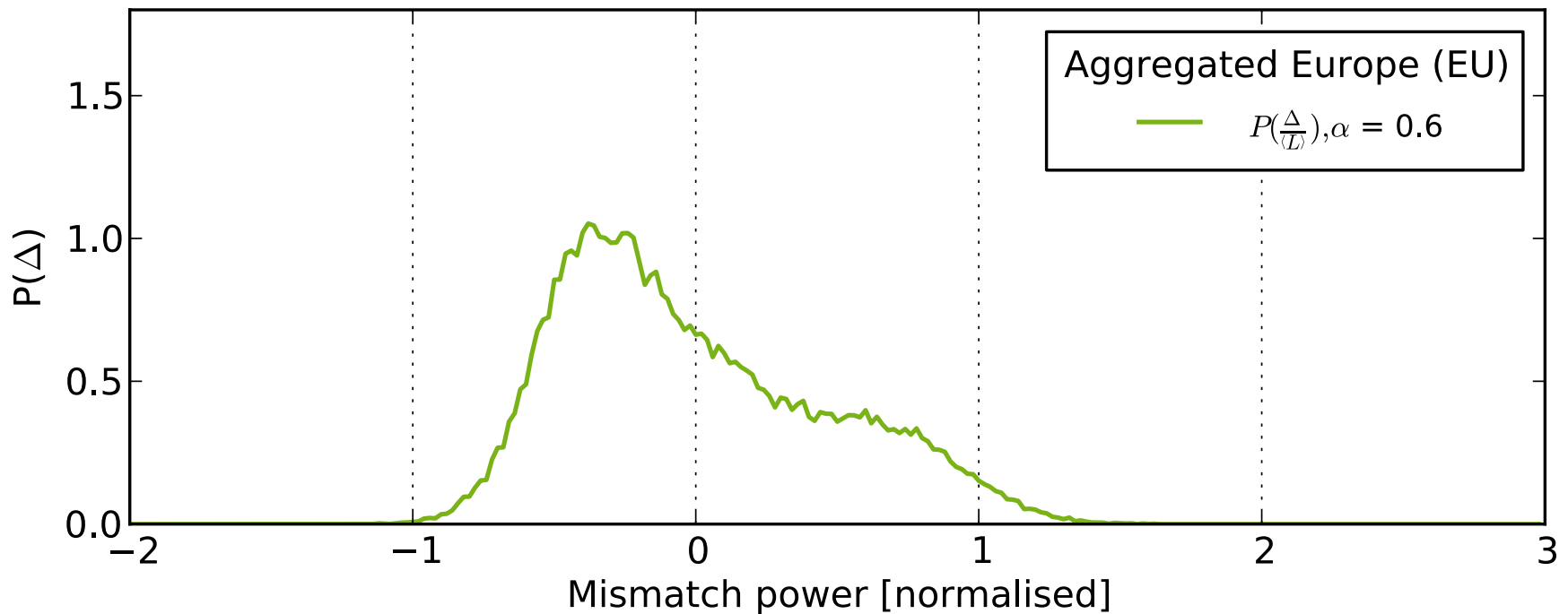
Mismatch distribution (Europe)

$$\Delta_{EU}(t) = G_{EU}^{RES}(t) - L_{EU}(t)$$



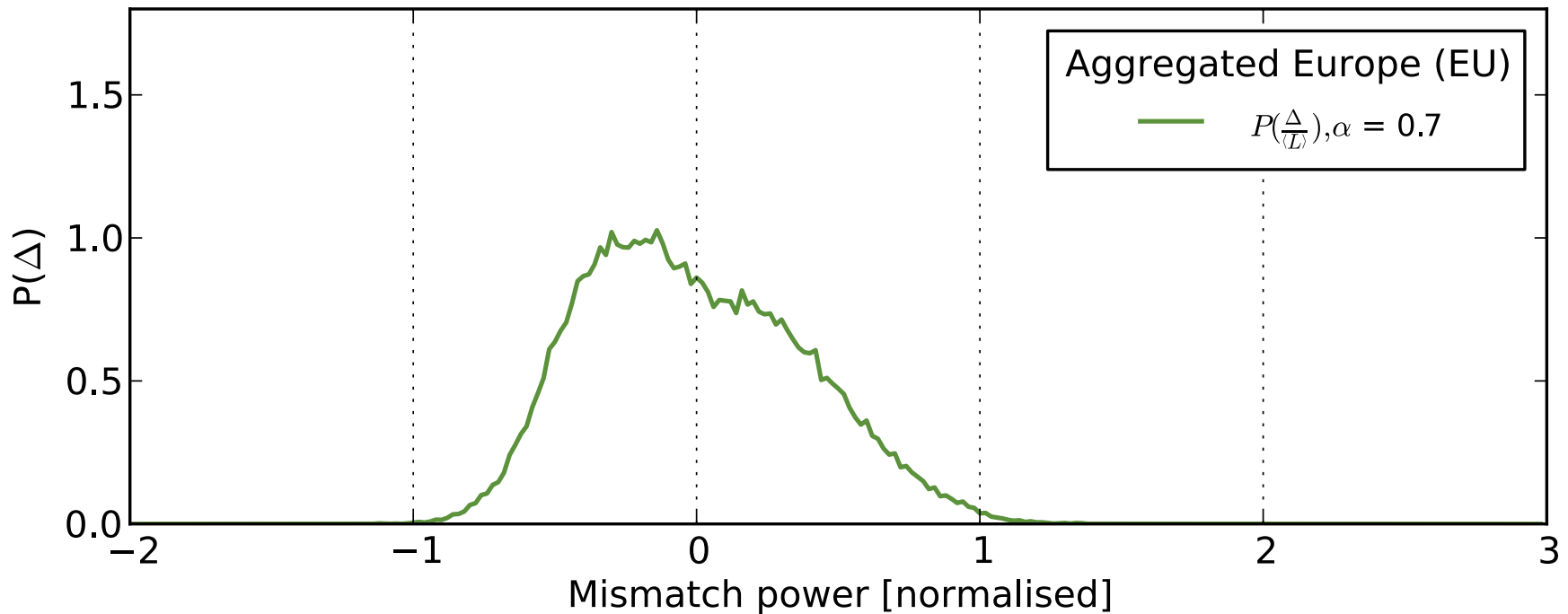
Mismatch distribution (Europe)

$$\Delta_{EU}(t) = G_{EU}^{RES}(t) - L_{EU}(t)$$



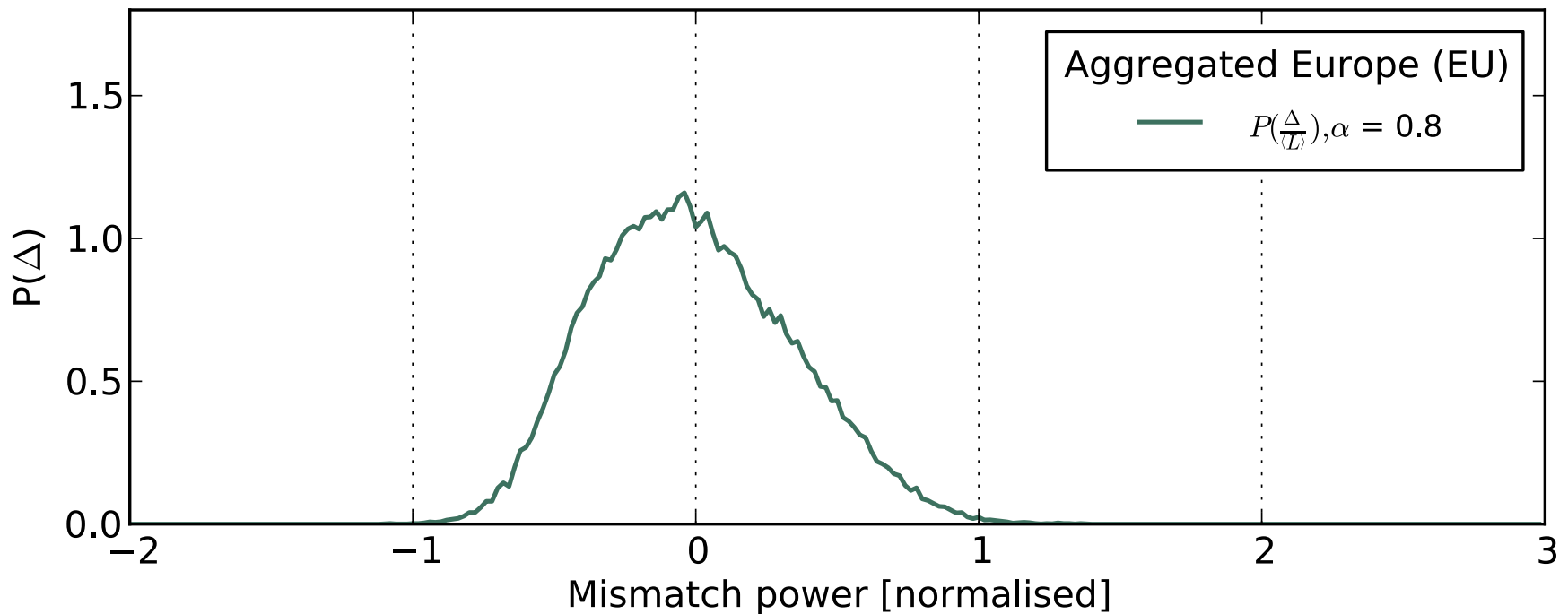
Mismatch distribution (Europe)

$$\Delta_{EU}(t) = G_{EU}^{RES}(t) - L_{EU}(t)$$



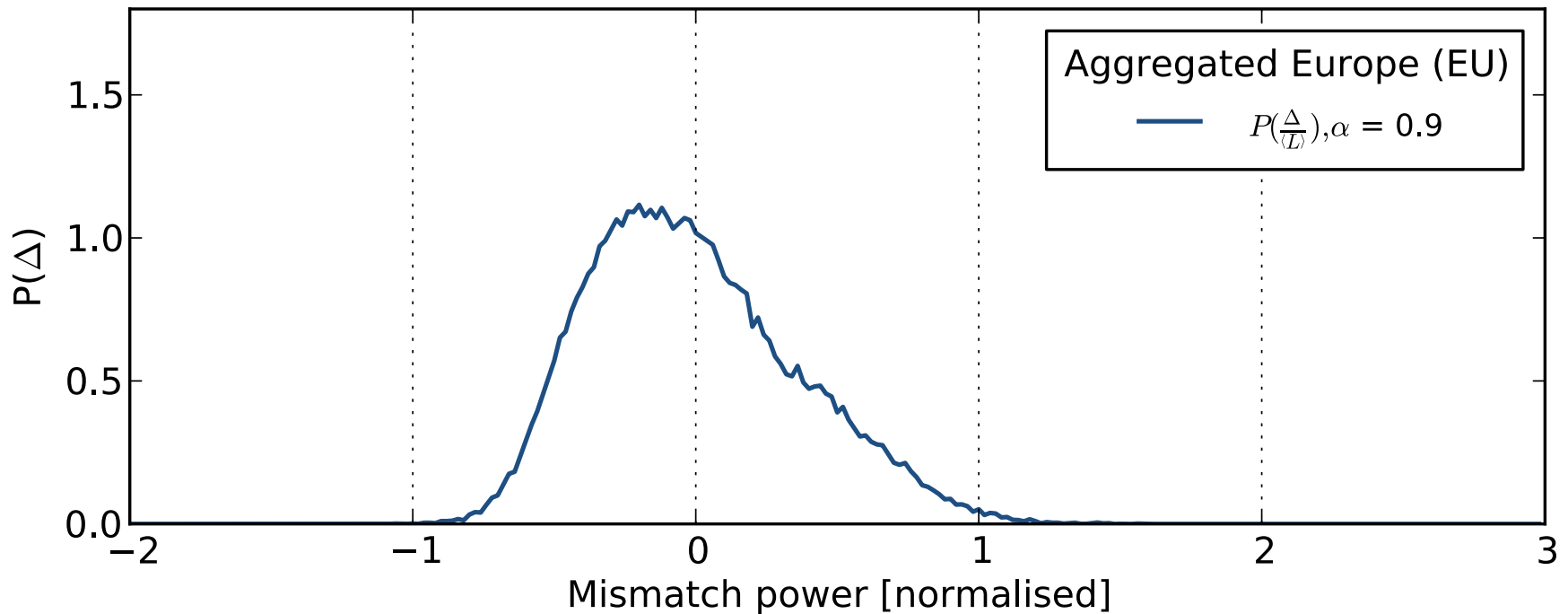
Mismatch distribution (Europe)

$$\Delta_{EU}(t) = G_{EU}^{RES}(t) - L_{EU}(t)$$



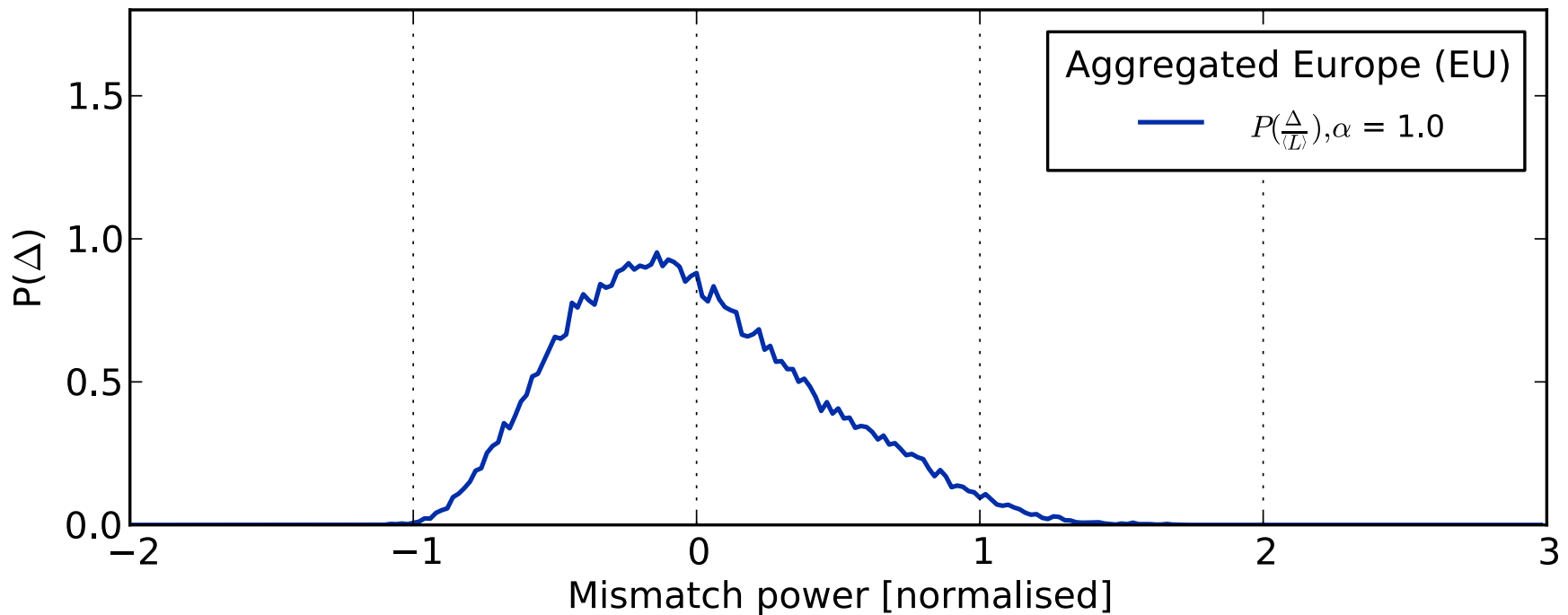
Mismatch distribution (Europe)

$$\Delta_{EU}(t) = G_{EU}^{RES}(t) - L_{EU}(t)$$

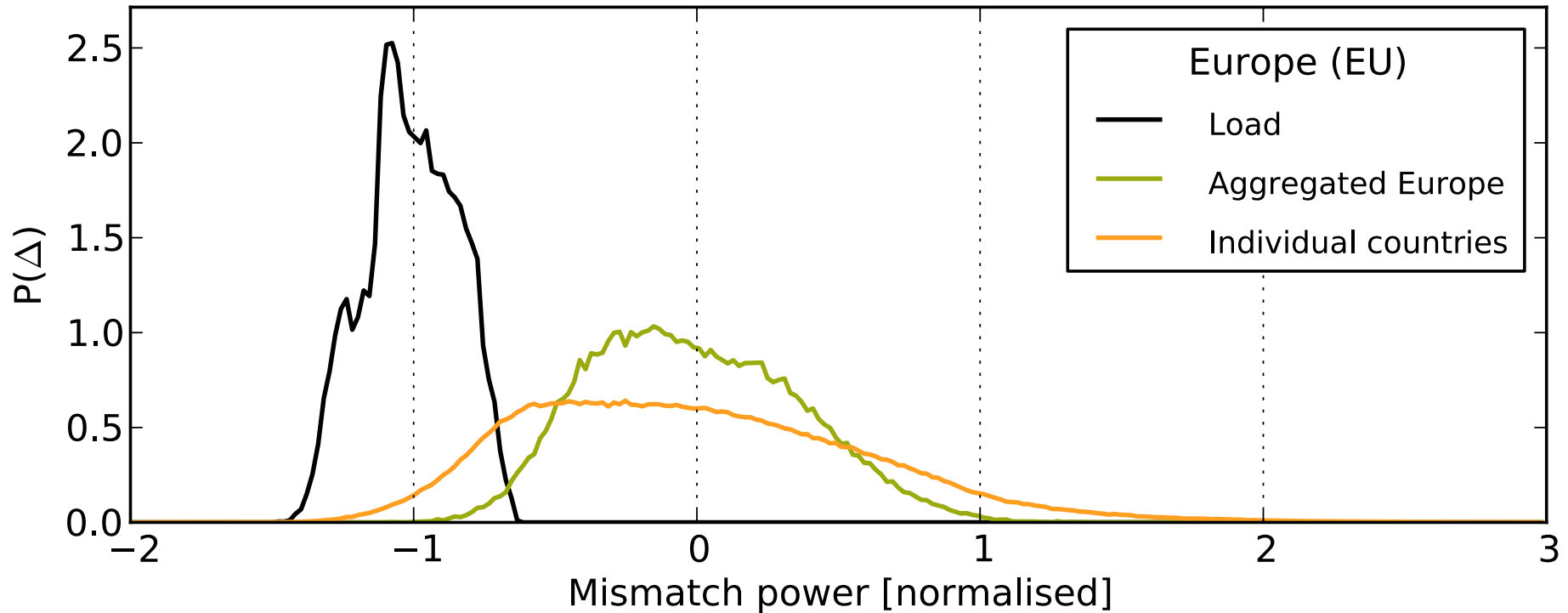


Mismatch distribution (Europe)

$$\Delta_{EU}(t) = G_{EU}^{RES}(t) - L_{EU}(t)$$

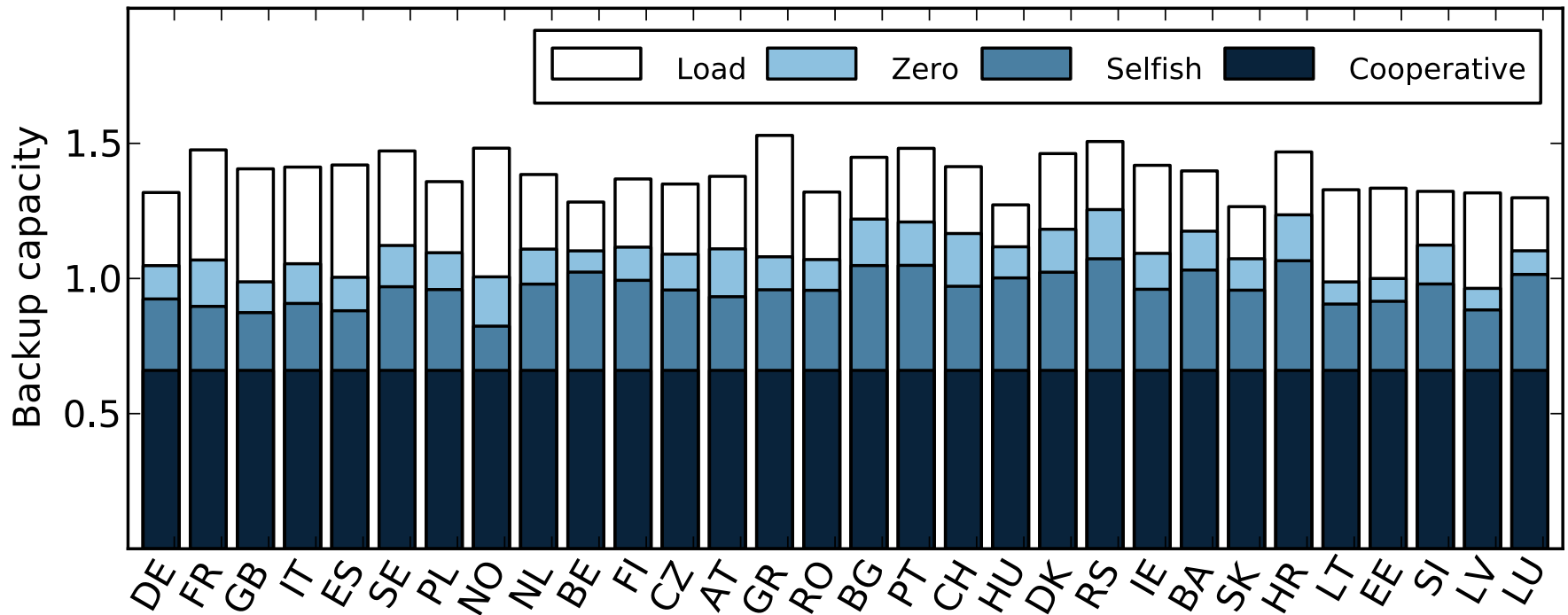


Mismatch distribution: Germany vs. Europe

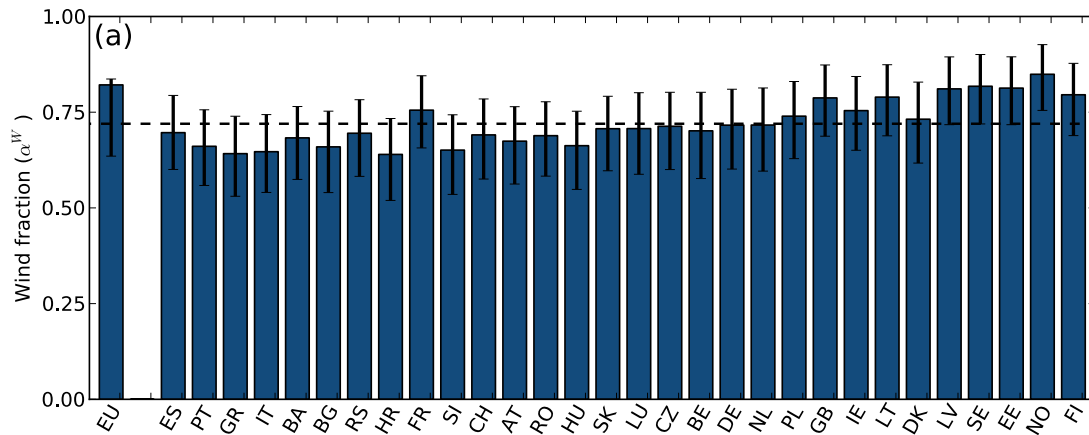


Mismatch **without** / **with** Transmission

BACKUP CAPACITY of EU countries (without/with transmission)

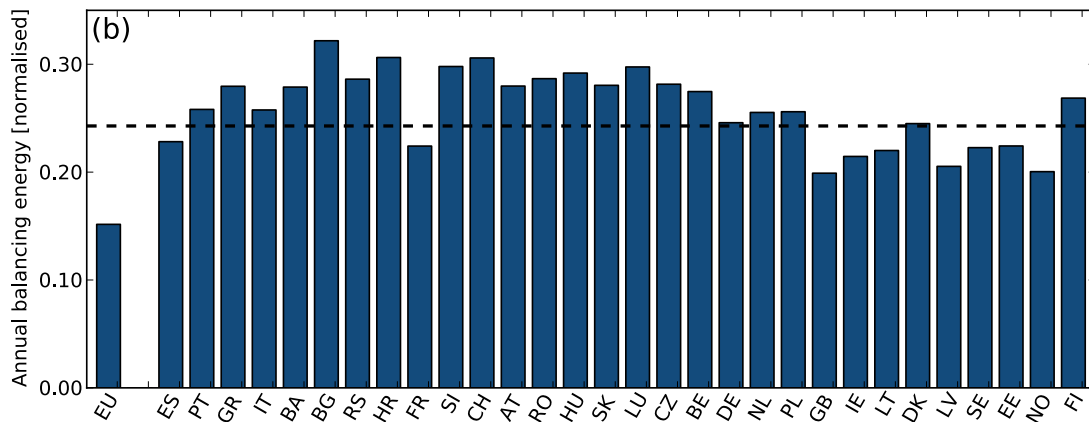


BACKUP ENERGIES of EU countries (with/without transmission)



$$\alpha_n^{\min} \approx 0.70$$

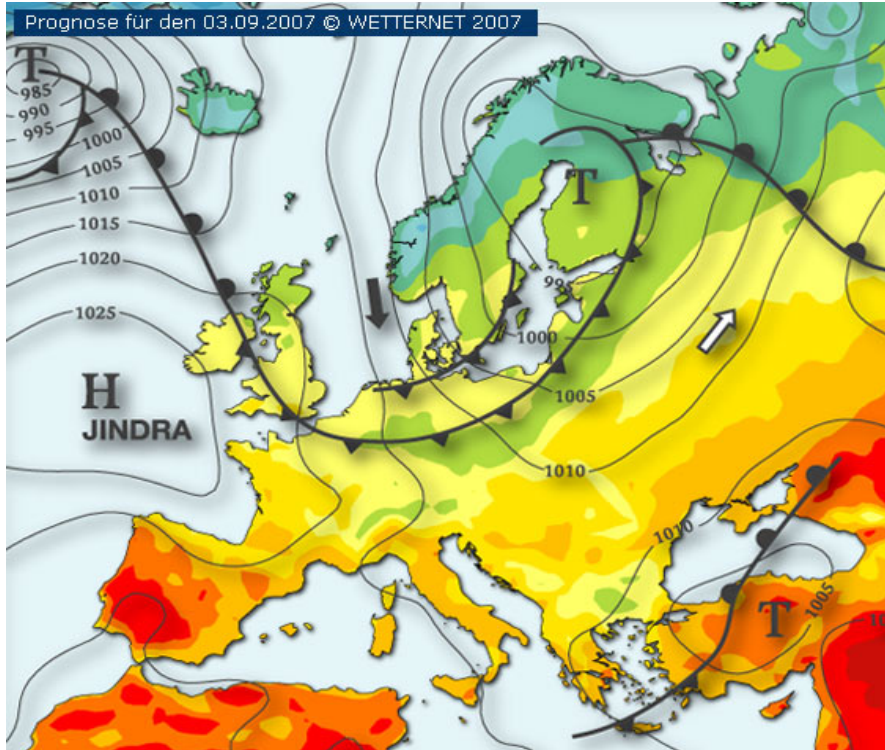
$$\alpha_{EU} \approx 0.80$$



$$\langle B_n \rangle \approx 0.24$$

$$\langle B_{EU} \rangle \approx 0.15$$

wind and solar power capacities



annual consumption (2009)
= 3360 TWh

70% wind power generation
= 875 GW installed capacity
= 175.000 x 5MW turbines
= 4350 x 200MW wind farms
≈ 115000 km²

30% solar PV power generation
= 550 GW installed capacity
≈ 3500 - 7500 km²

so far: only backup

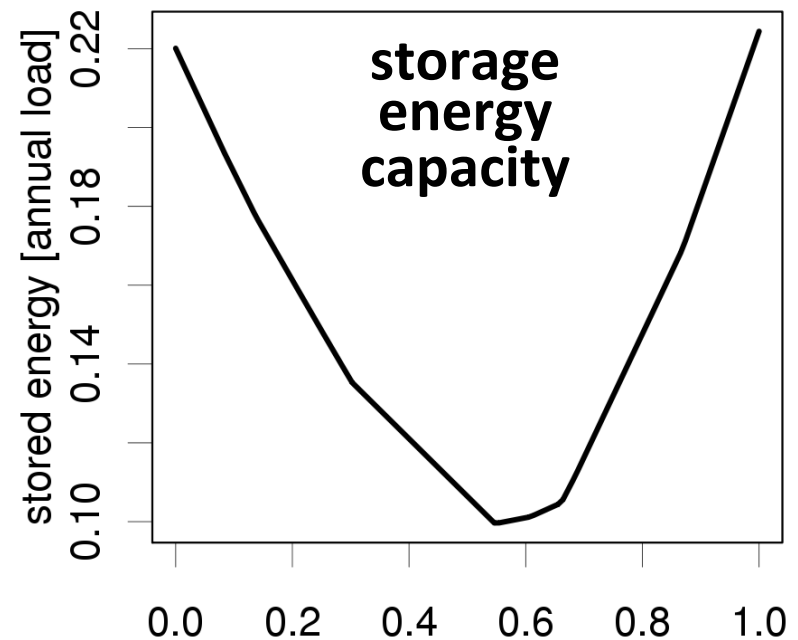
now: what about storage?

How much storage? @ 100% penetration in EU

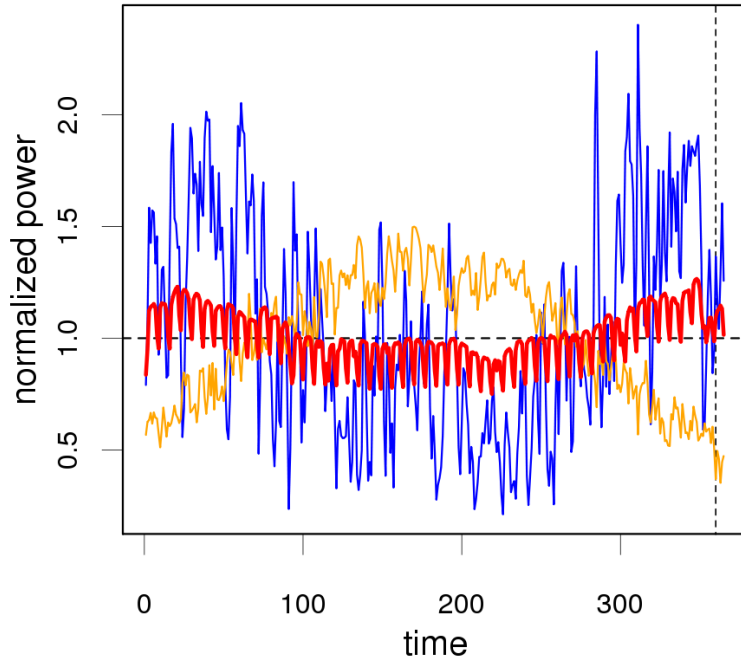
$$G_n^W(t) + G_n^S(t) - L_n(t) = \sum_{ngb(n)} (F_{n \rightarrow} - F_{\rightarrow n}) + (S_n^+ - S_n^-)$$

$$\Delta_{EU}(t) = G_{EU}^{RES}(t) - L_{EU}(t)$$

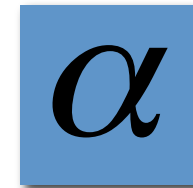
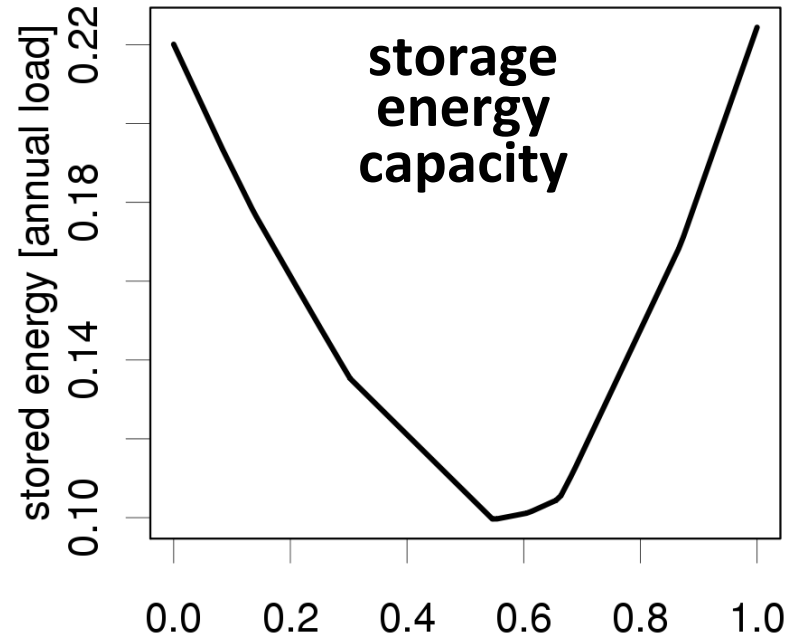
$$S(t) - S(t-1) = \begin{cases} \eta_{in} \Delta(t) & (\Delta > 0) \\ \eta_{out}^{-1} \Delta(t) & (\Delta < 0) \end{cases}$$



How much storage? @ 100% penetration in EU



Seasonal optimal mix
= 60% wind power
+ 40% solar power

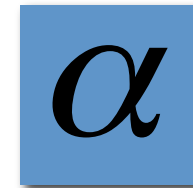
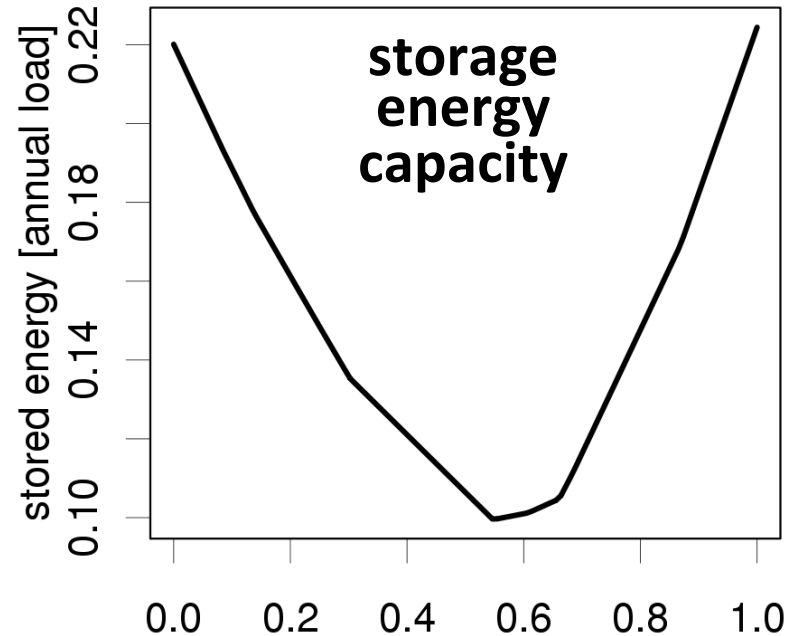


How much storage? @ 100% penetration in EU

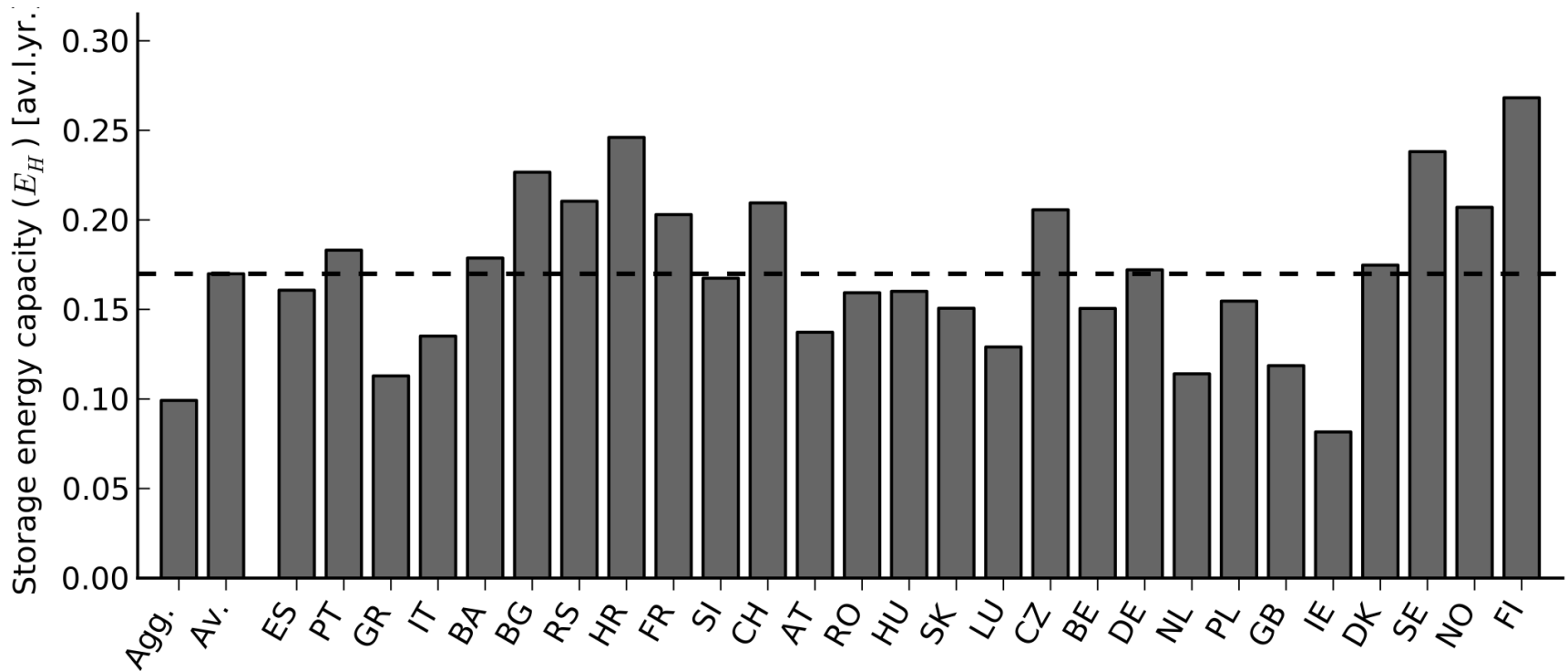
$$C_S = 10\% \langle L \rangle_{\text{annual}} = 340 \text{ TWh}$$

NOT POSSIBLE:
Pumped Hydro,
Compressed Air

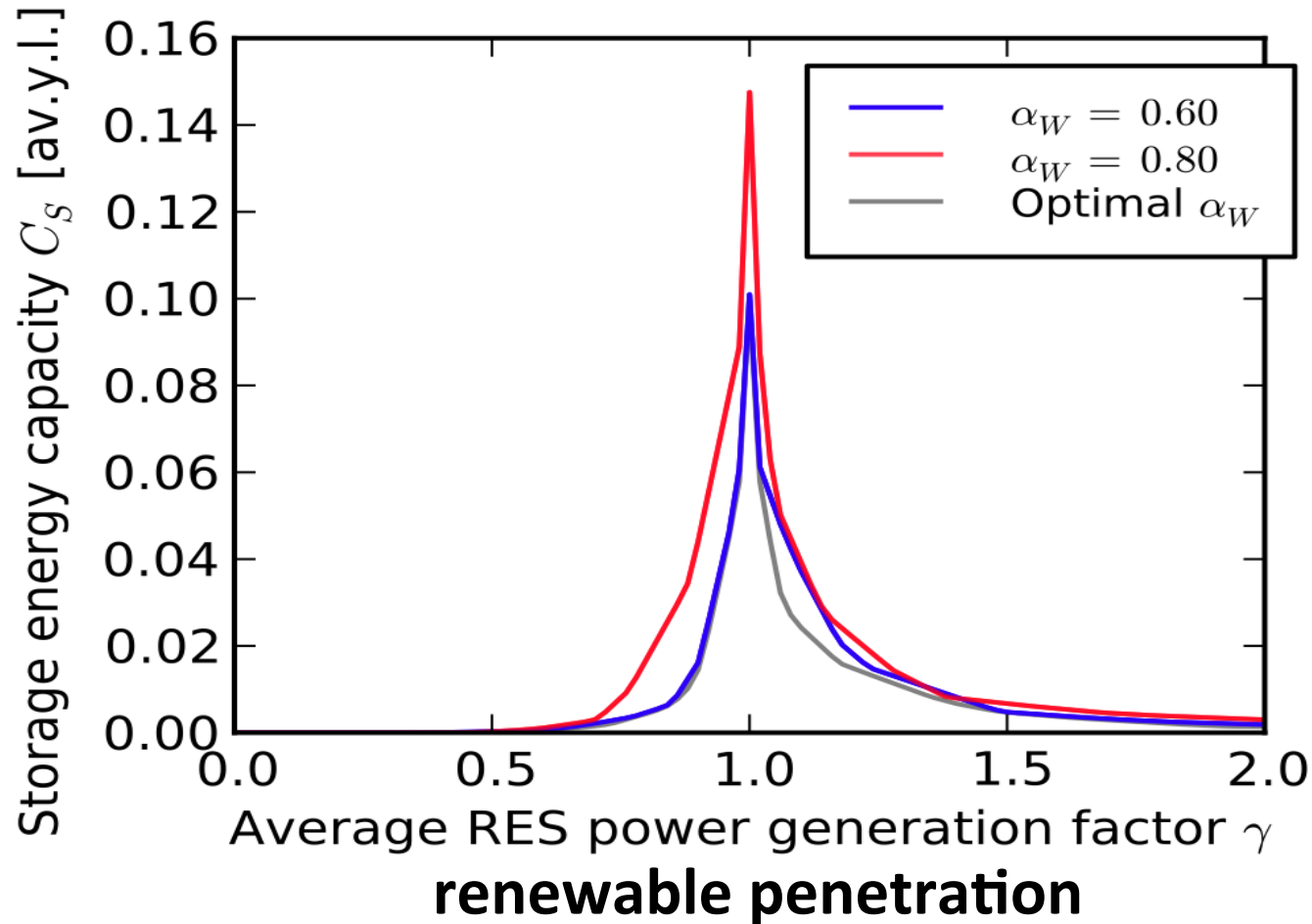
POSSIBLE:
H2 storage
25 TWh = 0.008 av.y.l.
6h "battery" storage
2.2 TWh = 0.0007 av.y.l



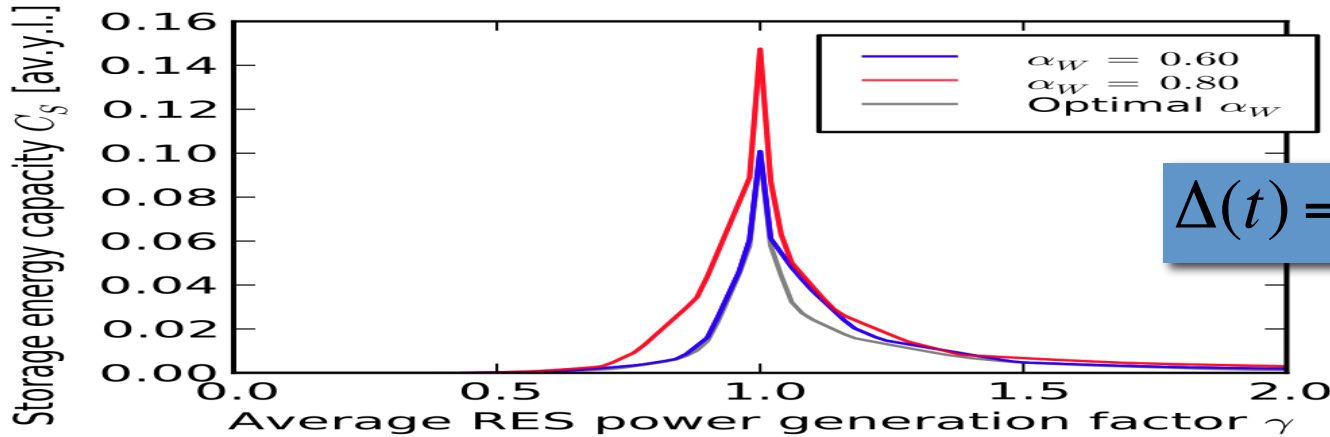
Country storage needs



Storage Singularity

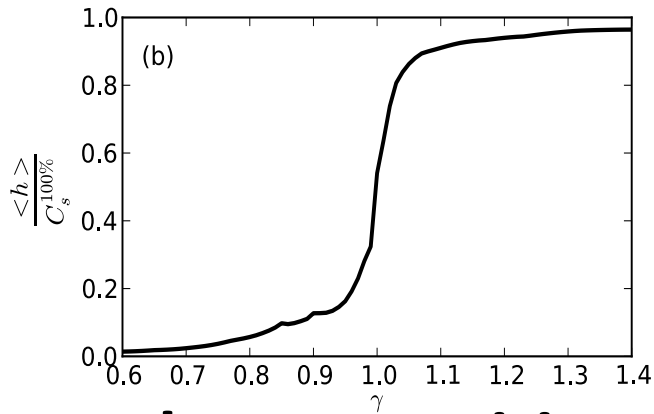


Storage Singularity

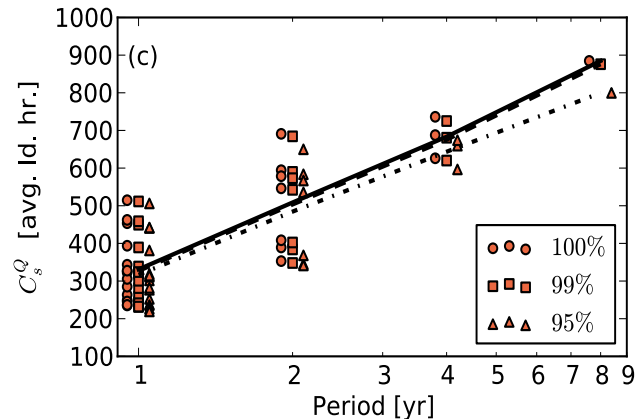


$$\Delta(t) = \gamma G_{RES}(t) - L(t)$$

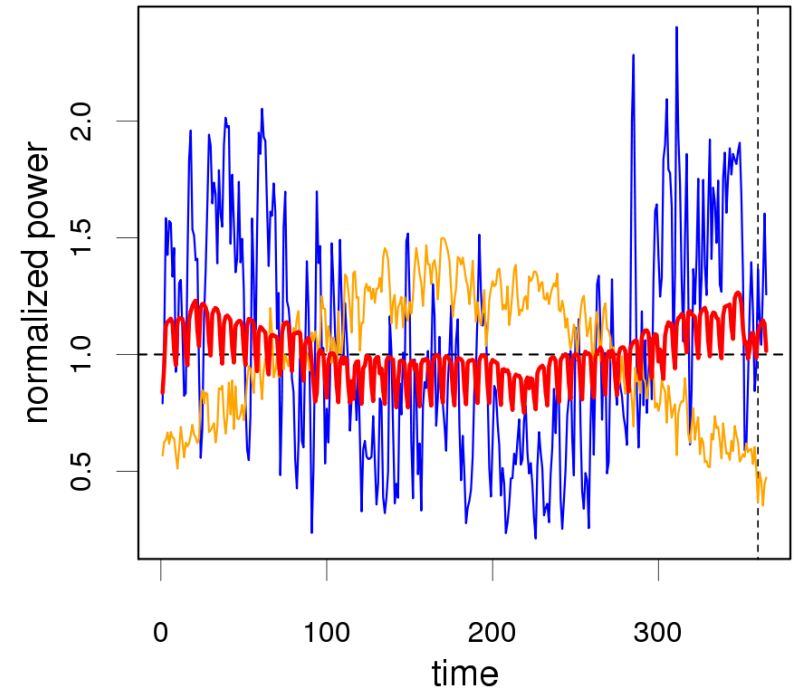
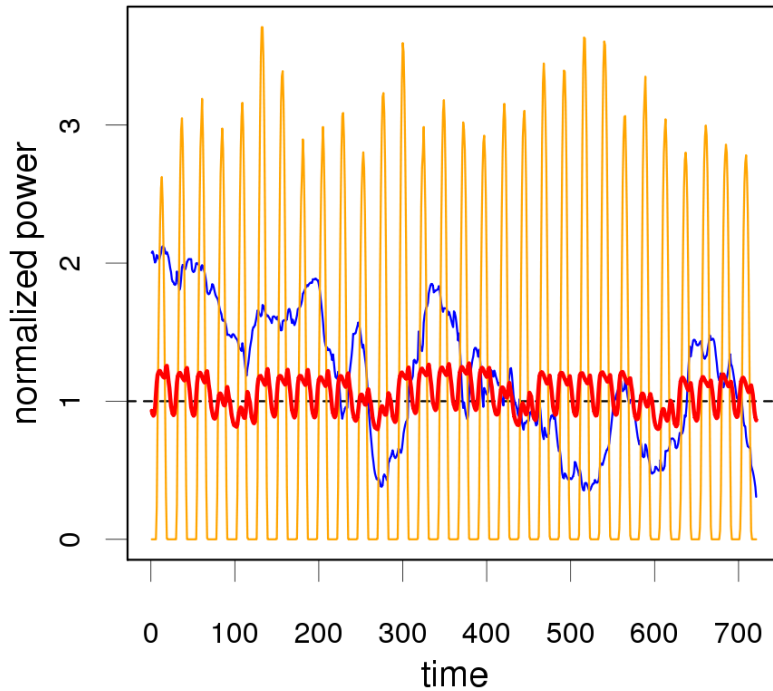
γ = renewable penetration



phase transition



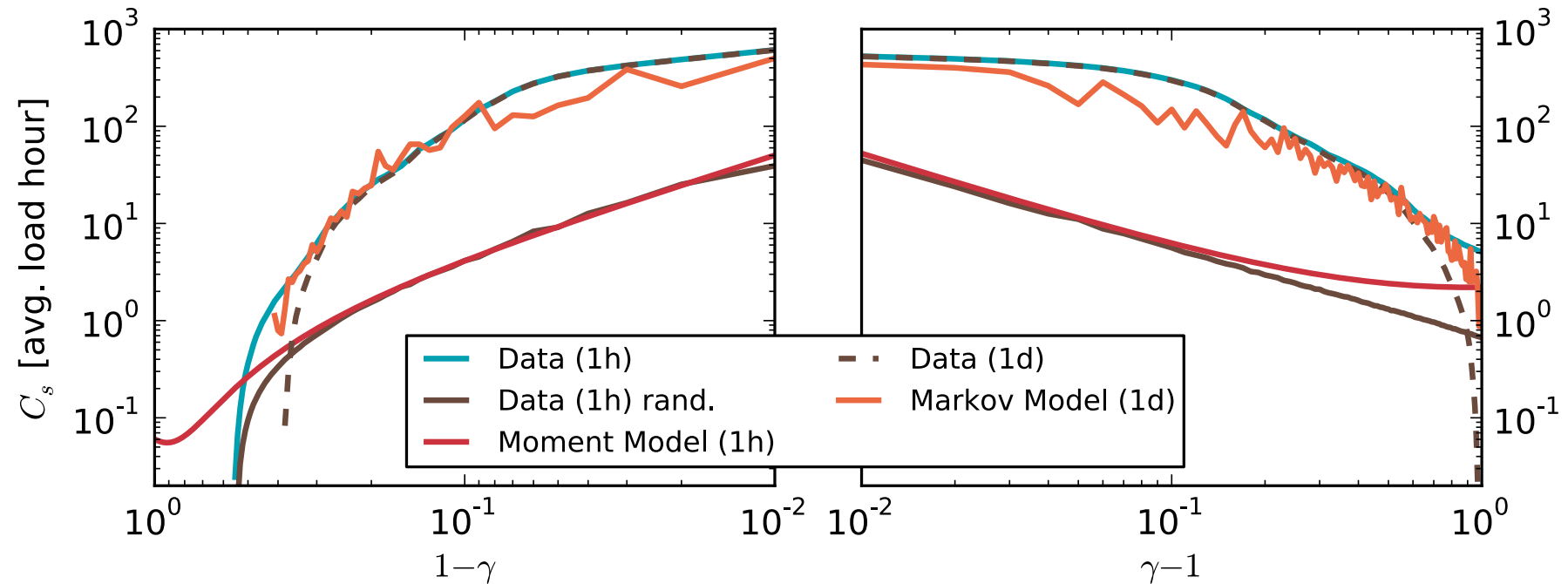
European aggregation: Wind + Solar power generation + Load



3 TIME SCALES:

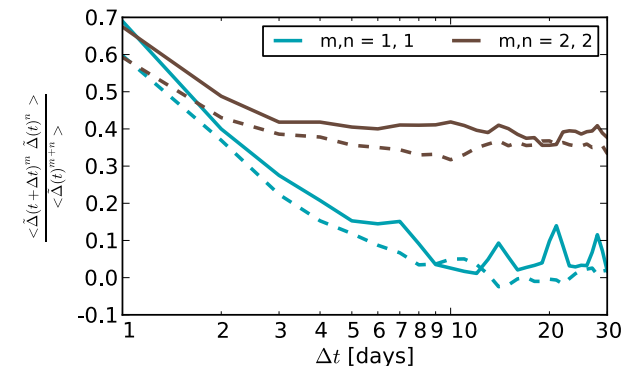
diurnal (1h-1d)
synoptic (2-10d)
seasonal (1y)

Storage Singularity



Temporal correlations on the synoptic time scale cause the extremely enhanced need for storage energy capacity.

Beyond a penetration of $\gamma > 60\%$ a 6h storage (load flexibility, smart grid, v2g) is no longer sufficient!



Break?

Welcome back!

- ① only Backup
- ② only Storage
- ③ Backup + Storage

- ④ 2015 \leftrightarrow 2050
- ⑤ Transmission + Backup
- ⑥ Economics
- ⑦ outlook: CONSENSYS

What about synergies: balancing + storage?

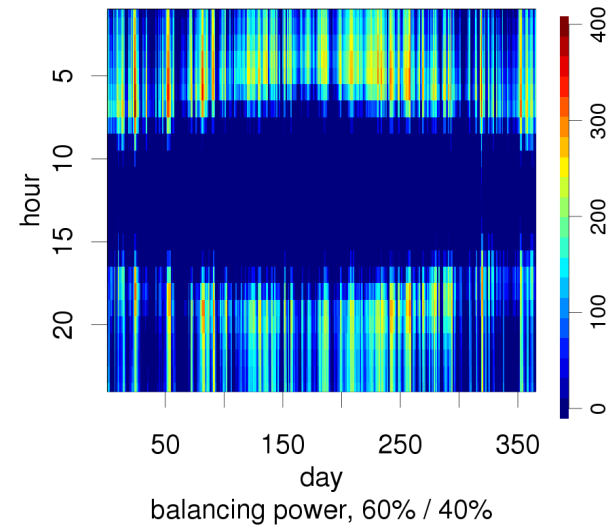
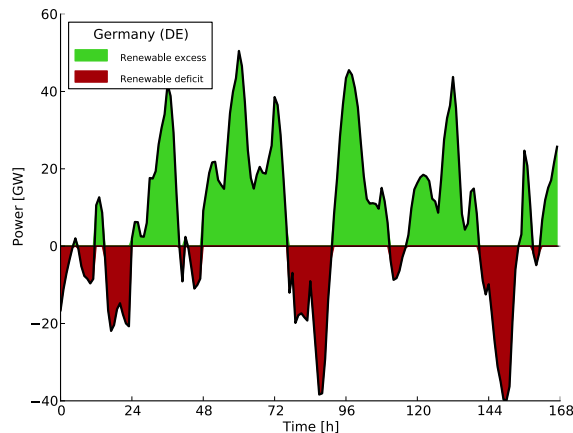
“hydro/bio” balancing (150 TWh)

+ **6h “battery” storage**

(2.2 TWh, $\eta=1.0$)

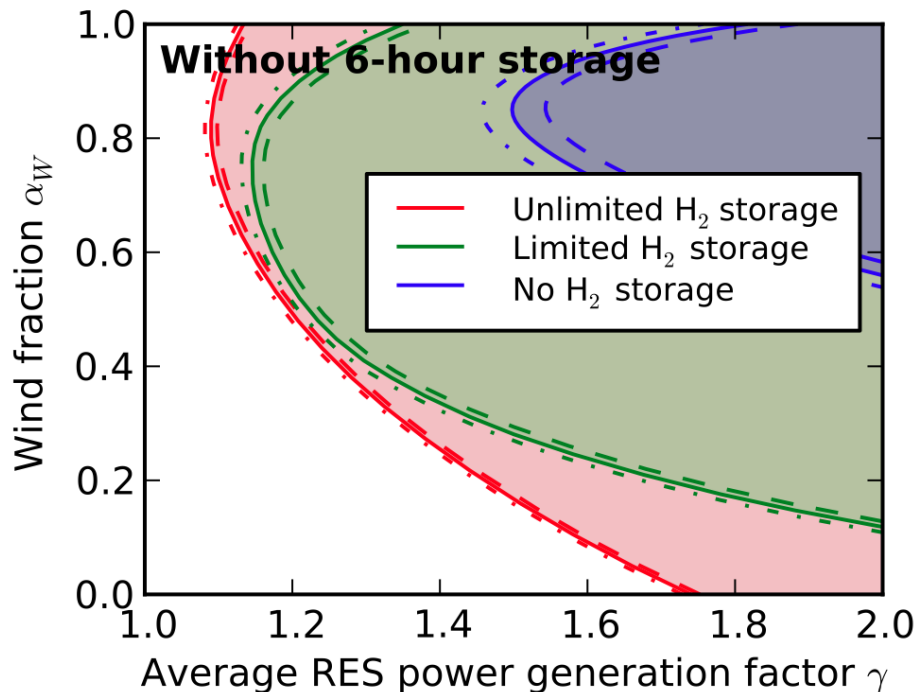
+ **seasonal H2 storage**

(25 TWh, $\eta=0.6$)



6h “battery” storage
 + seasonal H₂ storage
 + “hydro/bio” balancing

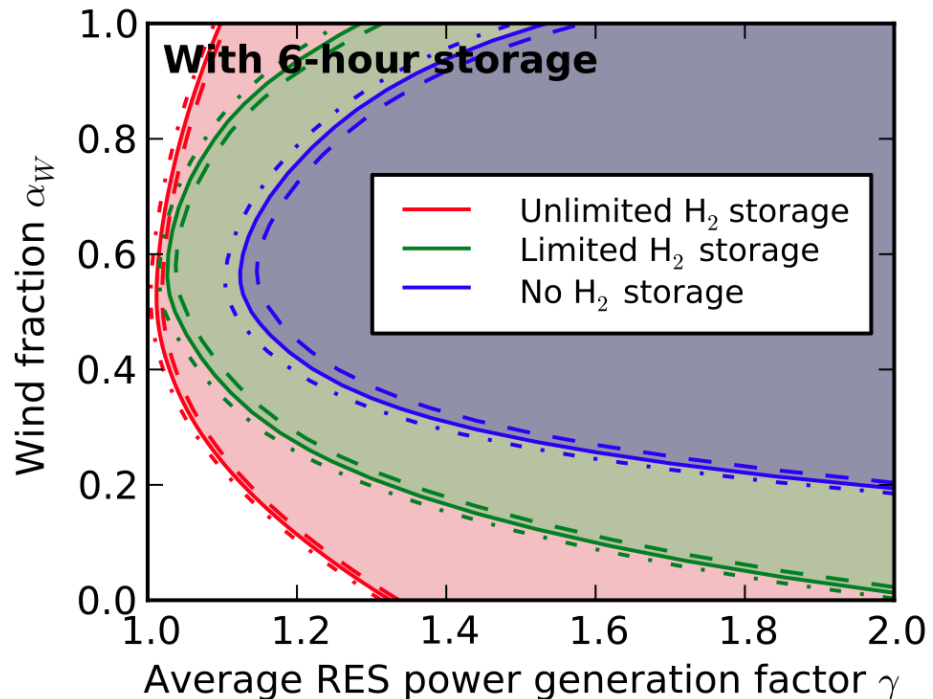
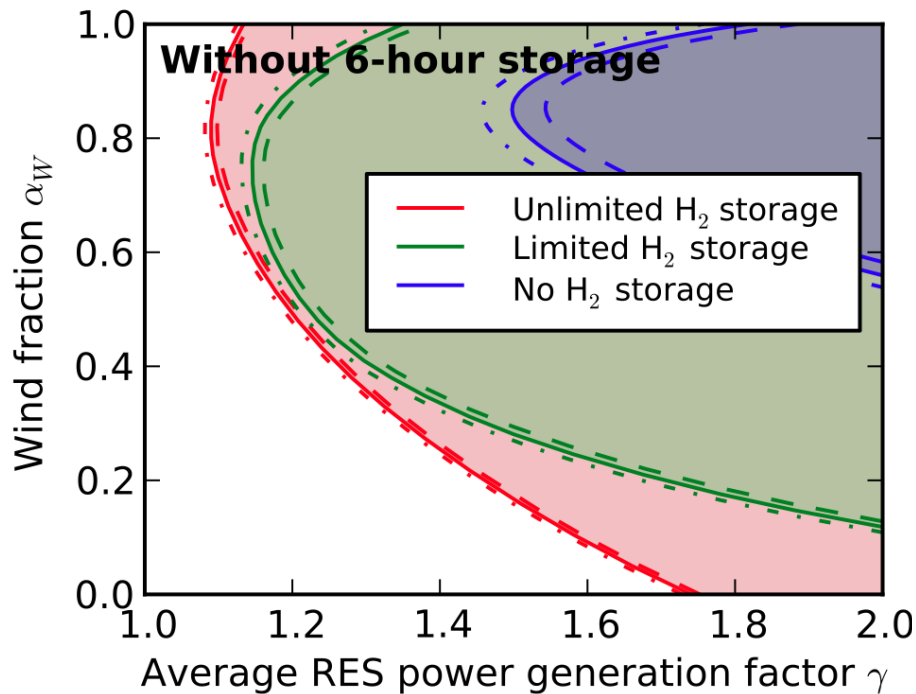
(2.2 TWh, $\eta=1.0$)
 (25 TWh, $\eta=0.6$)
(150 TWh)



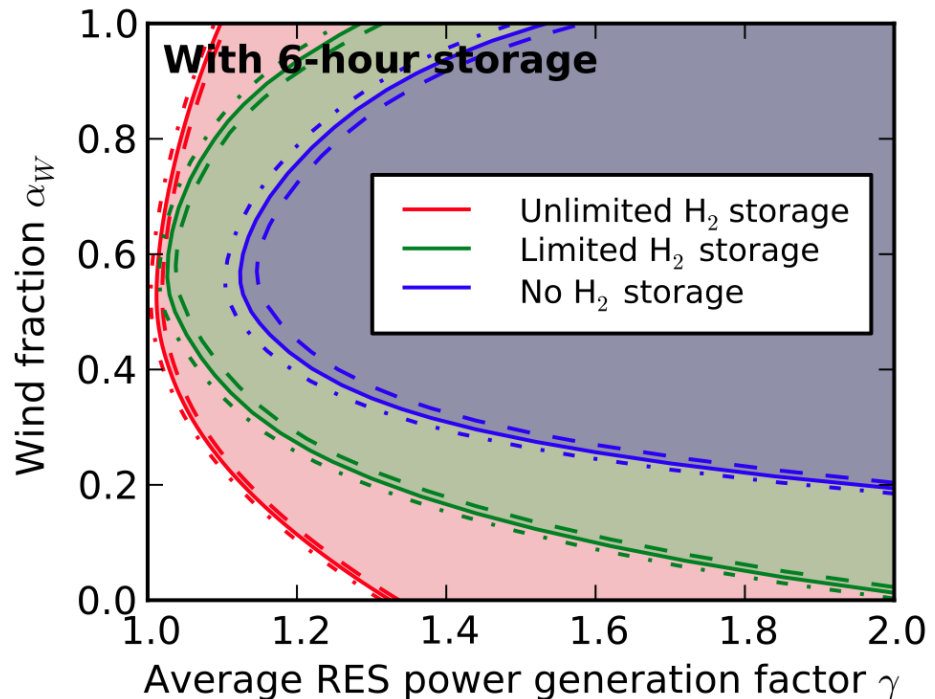
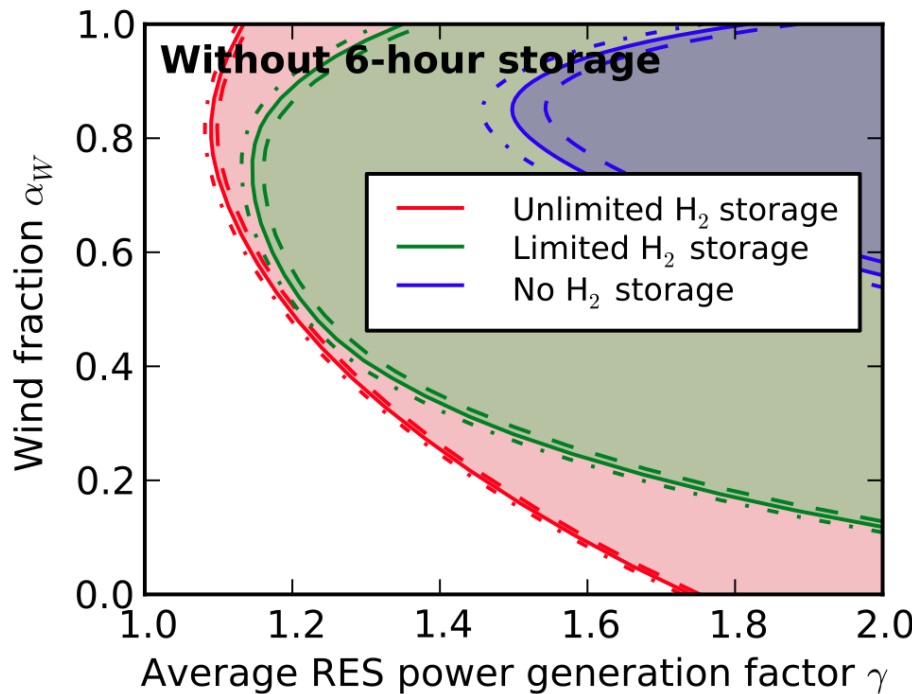
$$\gamma = 1, \alpha = 0.8 :$$

$$\langle B(t) \rangle_{EU} = 15\% \langle L \rangle_{\text{annual}} = 510 \text{ TWh}$$

6h “battery” storage (2.2 TWh, $\eta=1.0$)
+ seasonal H₂ storage (25 TWh, $\eta=0.6$)
+ “hydro/bio” balancing (150 TWh)



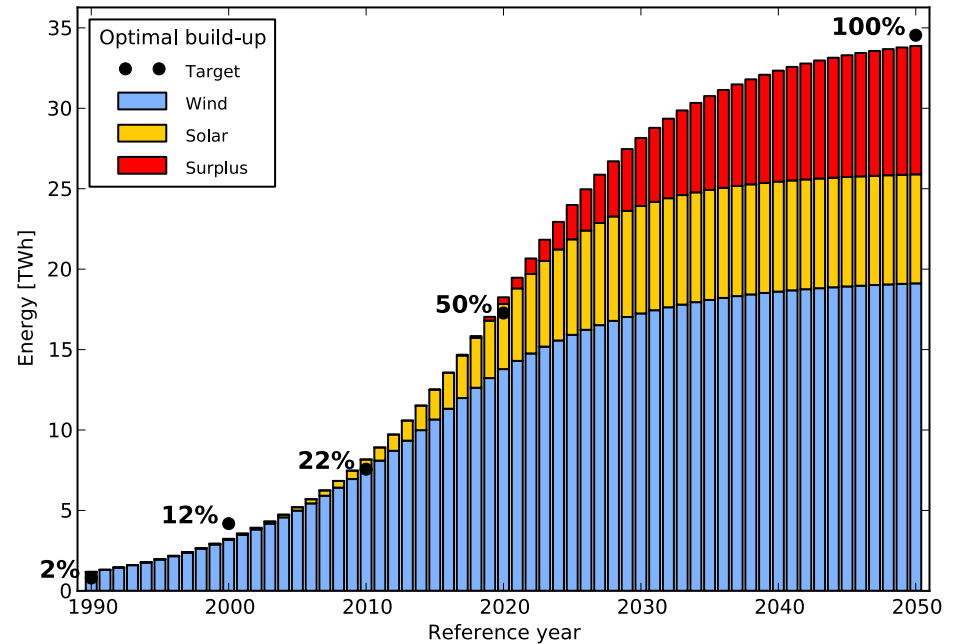
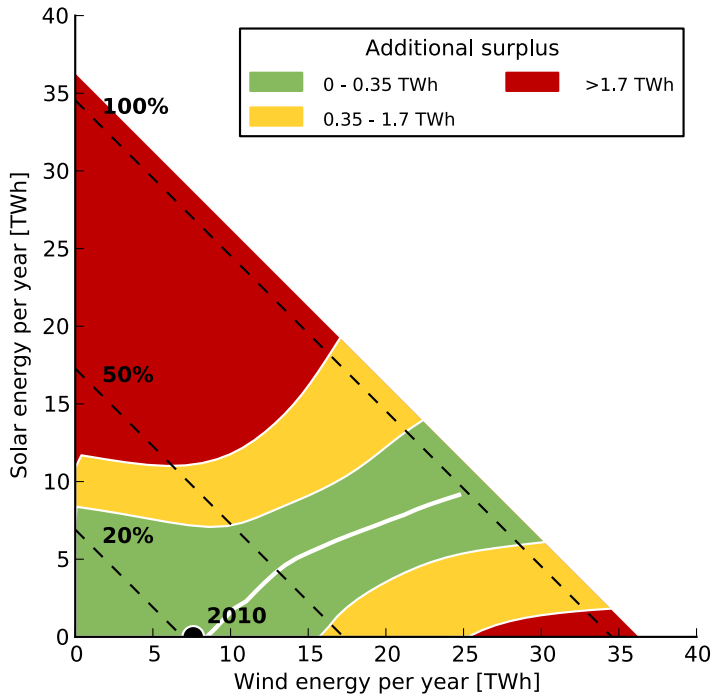
6h “battery” storage (2.2 TWh, $\eta=1.0$)
+ seasonal H₂ storage (25 TWh, $\eta=0.6$)
+ “hydro/bio” balancing (150 TWh)



2015 ↔ 2050

Transition 0% → 100% renewables

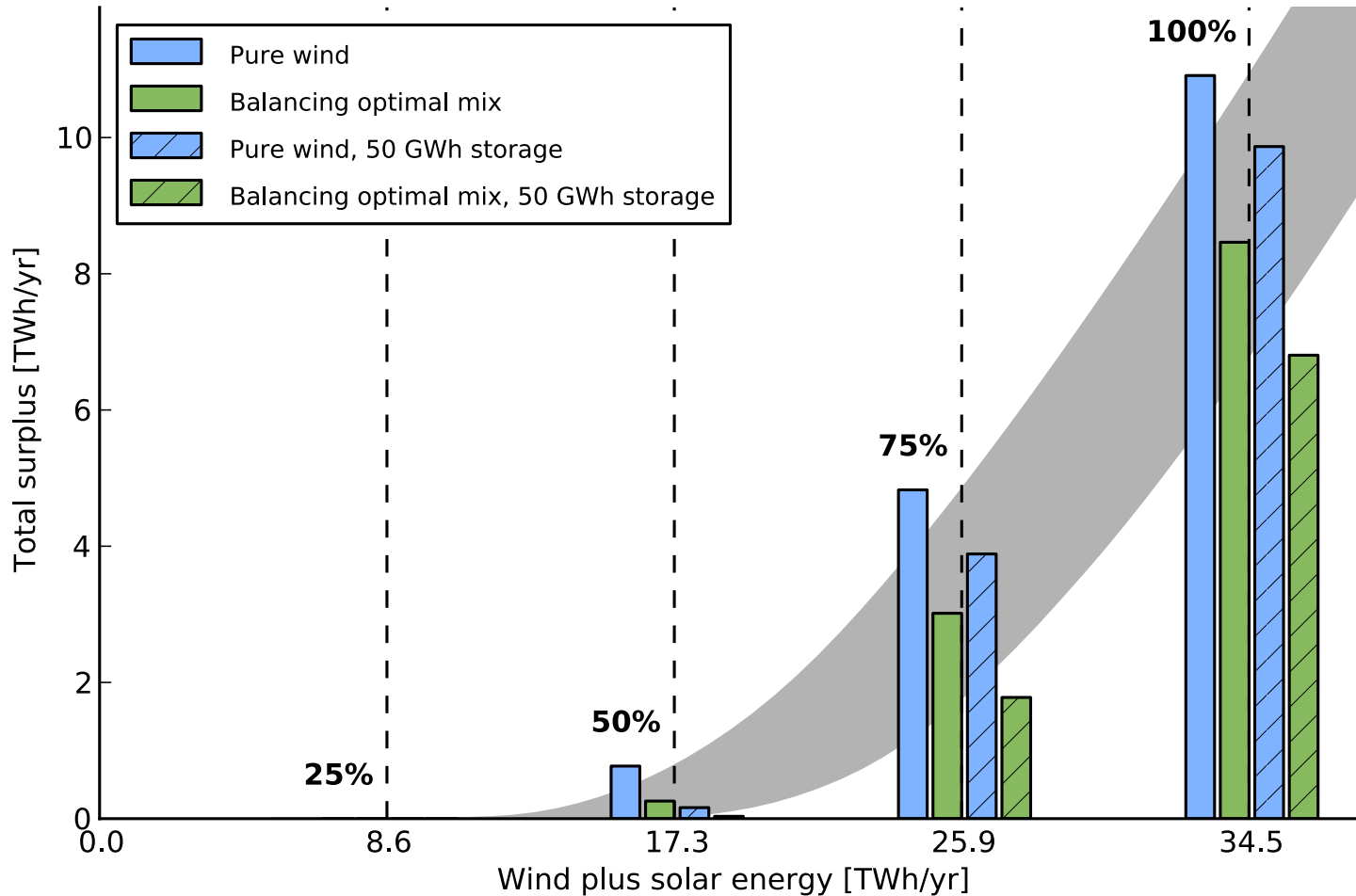
Case: Denmark (without storage)



$$G_n^{RES}(t) - L_n(t) = C_n(t) - B_n(t)$$

Excess generation:

$$\langle C_n(t) \rangle_t$$

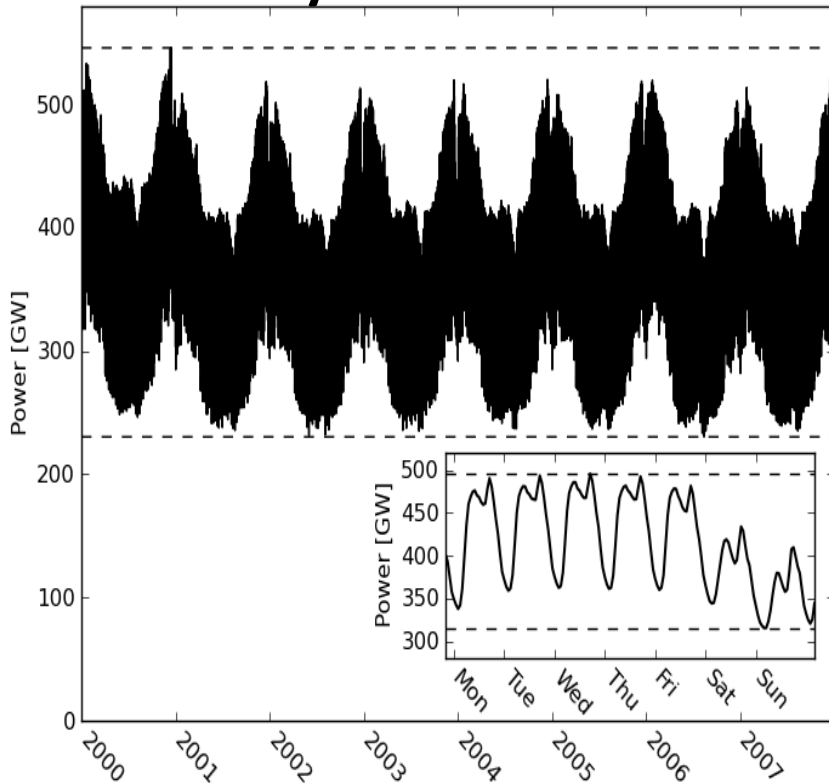


$$G_n^W(t) + G_n^S(t) - L_n(t) = C_n(t) - B_n(t) + (S_n^+ - S_n^-)$$



Transition 0% → 100% renewables with highly / medium /slowly flexible conventionals

European electricity demand 2000-2007:



load curve contains three time scales:

- Intra-day (1-24 hours)
- Intra-week (1-7 days)
- Seasonal (7-365 days)

Minimum peak capacities:

- Intra-day: 165 GW
- Intra-week: 133 GW
- Seasonal: 273 GW

Derived power capacities (2007 values)

Country	Derived power capacities (GW)			
	Seasonal	Intra-week	Intra-day	Total
Austria (AT)	4.05 (43%)	2.29 (24%)	3.08 (33%)	9.42 (100%)
Belgium (BE)	7.21 (50%)	3.64 (25%)	3.60 (25%)	14.45 (100%)
Bulgaria (BG)	4.27 (48%)	2.13 (24%)	2.57 (29%)	8.98 (100%)
Bosnia and Herzegovina (BA)	2.75 (54%)	0.58 (12%)	1.72 (34%)	5.05 (100%)
Czech Republic (CZ)	5.45 (53%)	2.54 (25%)	2.36 (23%)	10.35 (100%)
Switzerland (CH)	4.47 (54%)	1.73 (21%)	2.01 (24%)	8.21 (100%)
Germany (DE)	34.15 (41%)	23.46 (28%)	25.80 (31%)	83.41 (100%)
Denmark (DK)	2.50 (37%)	1.56 (23%)	2.67 (40%)	6.73 (100%)
Spain (ES)	15.88 (38%)	12.44 (30%)	13.70 (33%)	42.01 (100%)
France (FR)	56.80 (60%)	17.36 (18%)	19.87 (21%)	94.03 (100%)
Finland (FI)	8.46 (59%)	3.17 (22%)	2.69 (19%)	14.31 (100%)
Great Britain (GB)	29.93 (48%)	19.81 (32%)	20.06 (32%)	69.80 (100%)
Greece (GR)	4.80 (45%)	2.13 (20%)	2.67 (25%)	9.60 (100%)
Hungary (HU)	3.39 (51%)	1.56 (23%)	1.72 (26%)	6.67 (100%)
Italy (IT)	21.00 (30%)	19.81 (28%)	29.00 (42%)	70.81 (100%)

Minimum peak capacities (Total):

- Intra-day: 165 GW (29%)
- Intra-week: 133 GW (23%)
- Seasonal: 273 GW (48%)

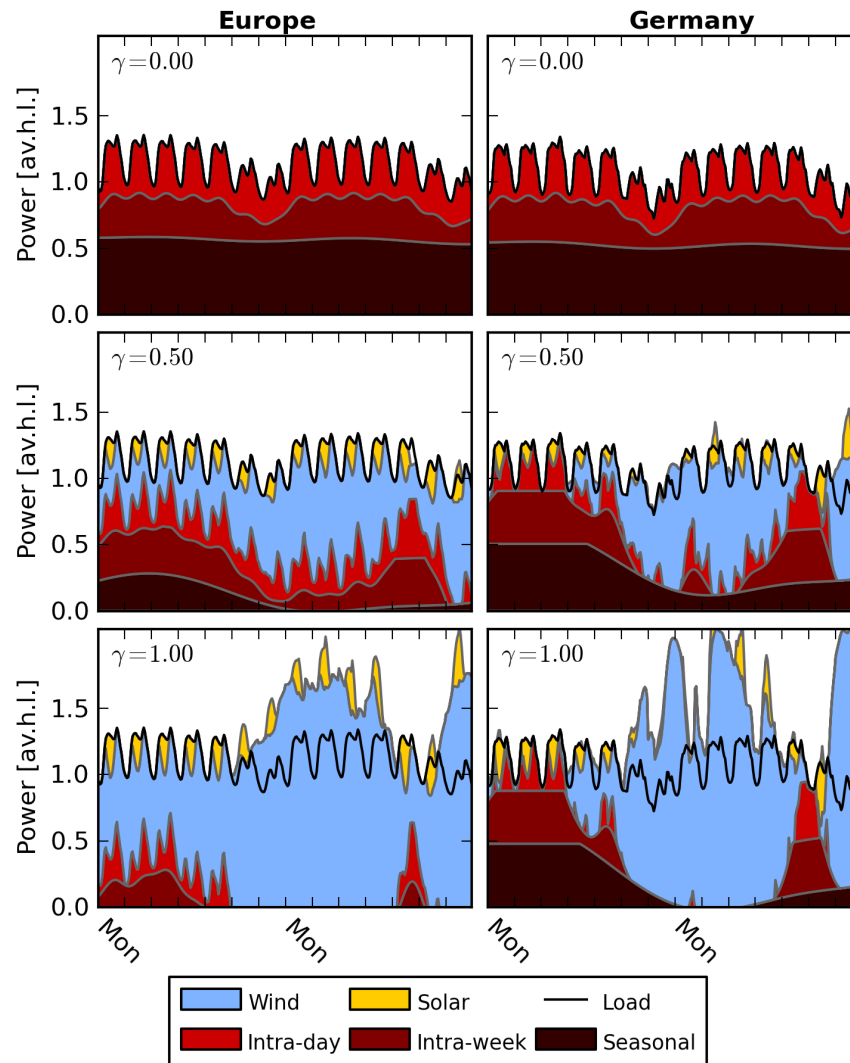
Power dispatch

Requirements:

- 99% Security of supply.
- Minimal excess power generation.
- Forced shut-down of conventional capacity.

Simple Rules of operation:

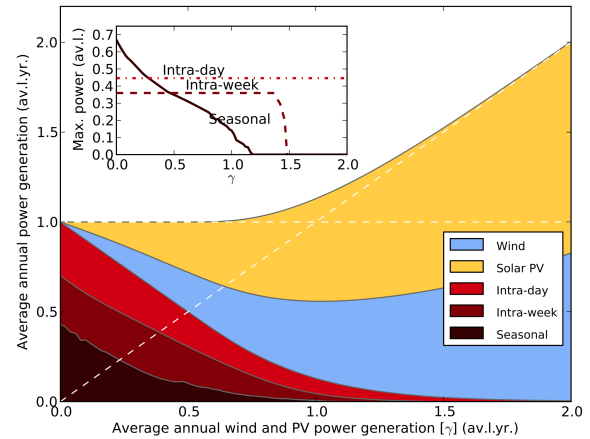
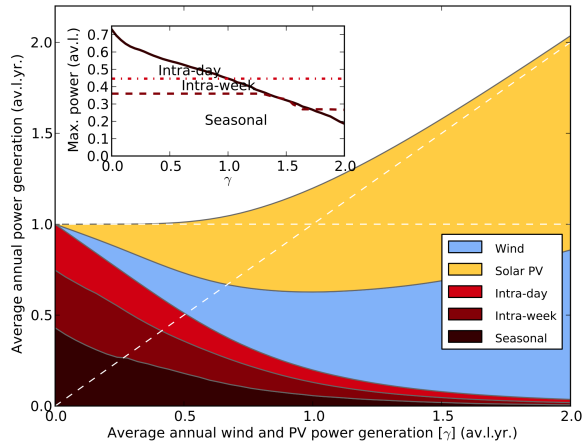
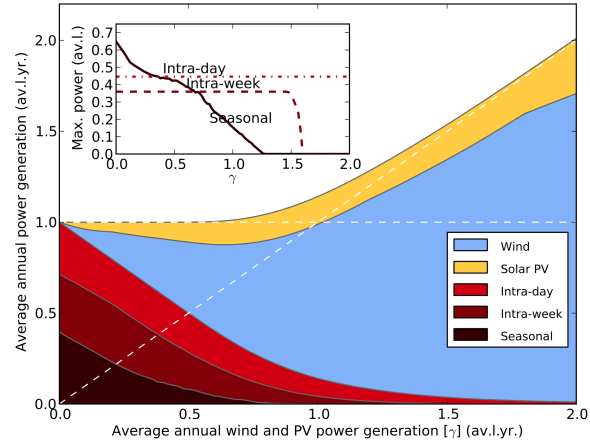
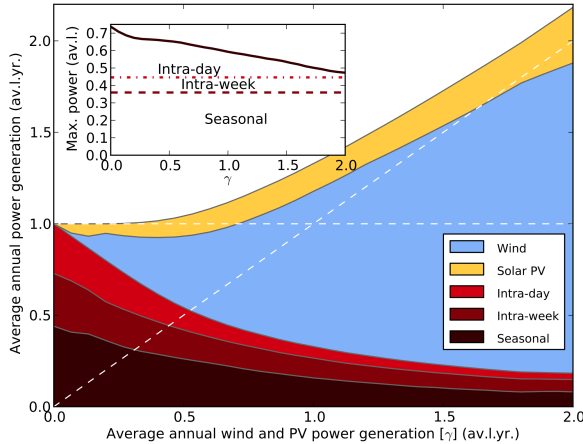
- Seasonal power generation follows 7-day moving average.
- Intra-week power generation follows 24-hour moving average.
- Intra-day power generation follows 1-hour moving average.



Transition: 0% → 100% renewables

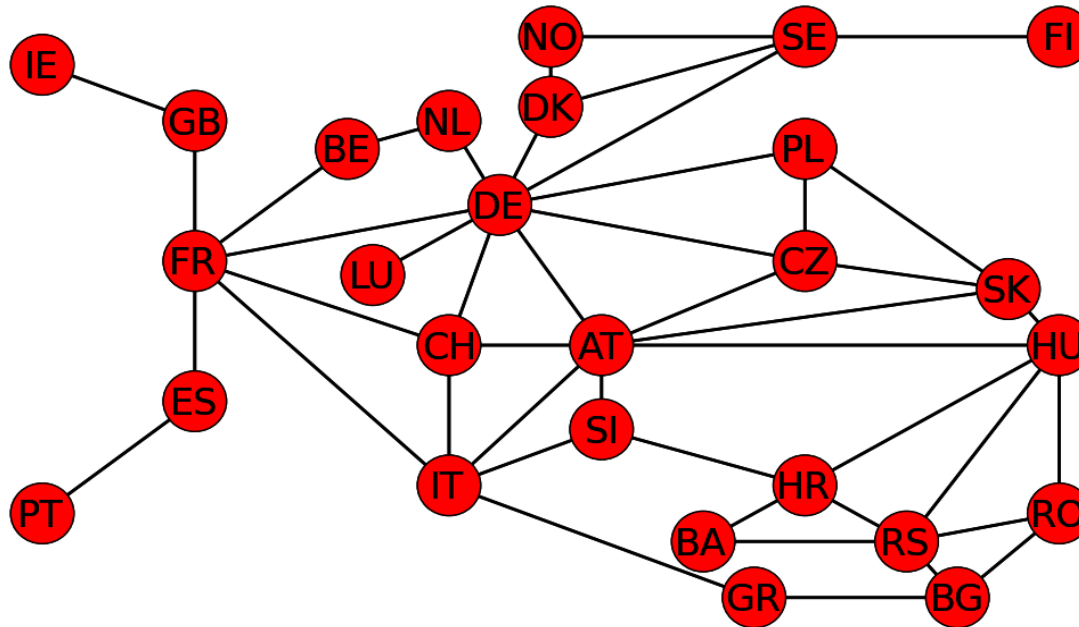
no ... cross-border transmission ... yes

yes...short-term storage...no



PRELIMINARY

How much transmission?

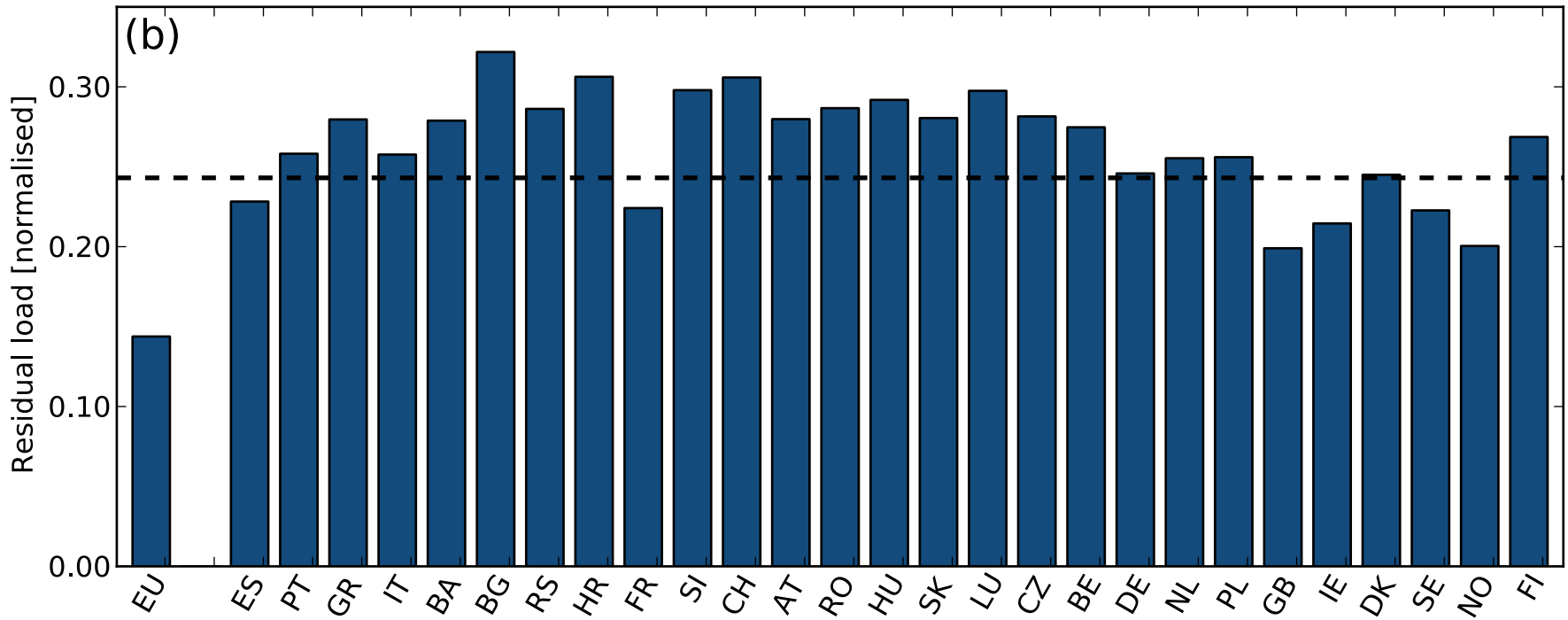


transmission calculation without transmission

$$\gamma = 1$$

$$\alpha \approx 0.7$$

minimum backup energy at optimal wind / solar mix

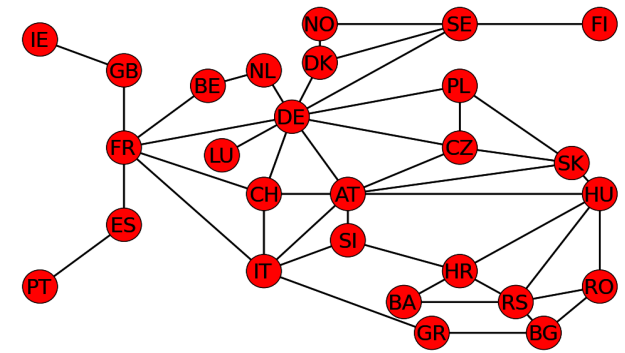
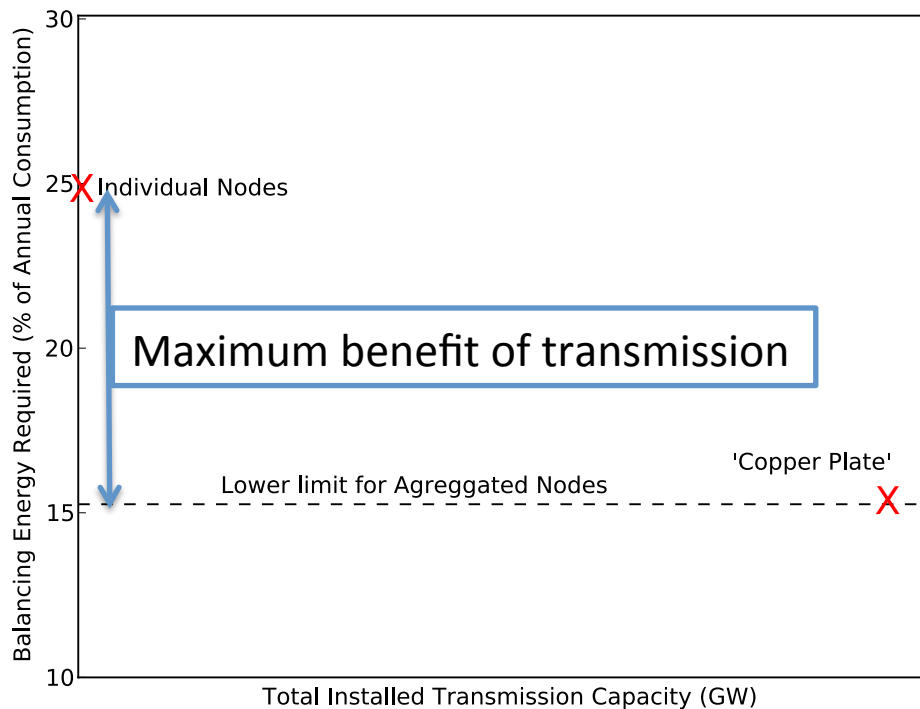


$$B_{EU} = 0.15$$

vs.

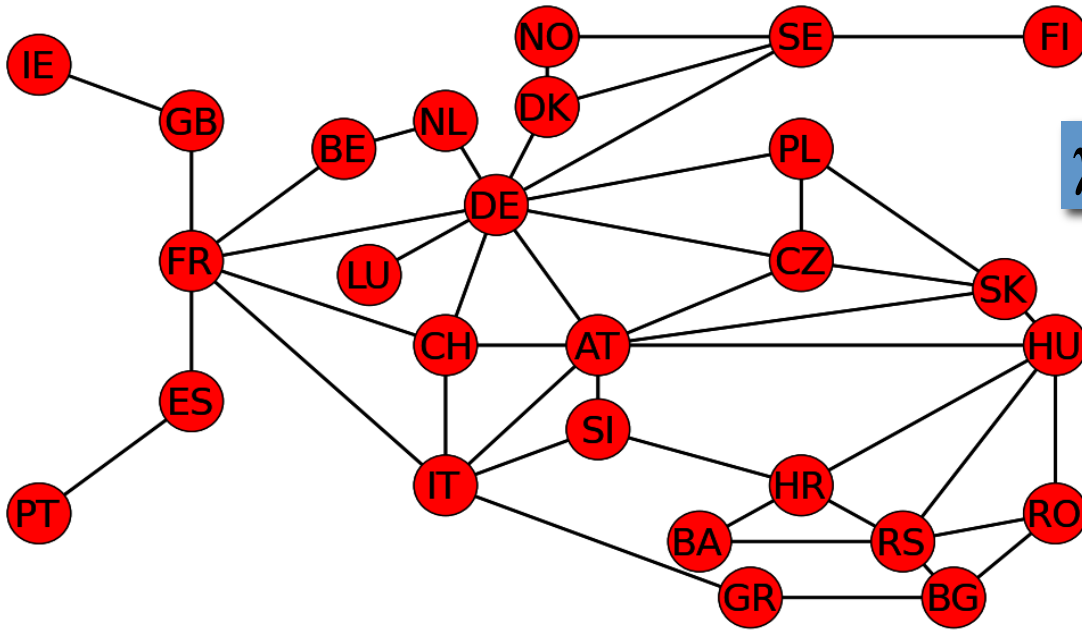
$$\sum_n B_n = 0.24$$

transmission calculation without transmission



The **MAXIMUM BENEFIT OF TRANSMISSION** quantifies how much balancing/surplus can be reduced by sharing local surplus wind and solar power in an unconstrained pan-European transmission network.

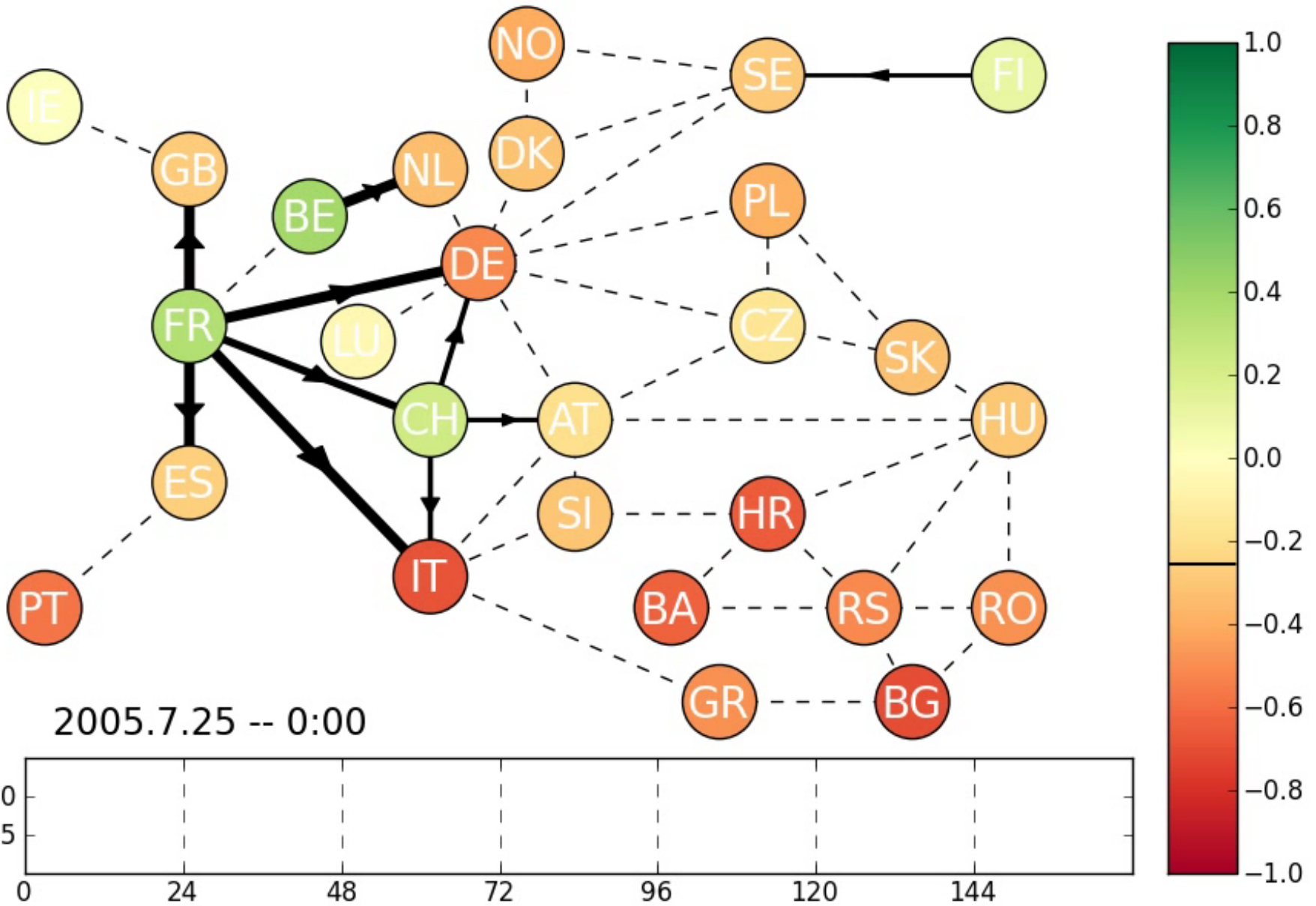
How much transmission?



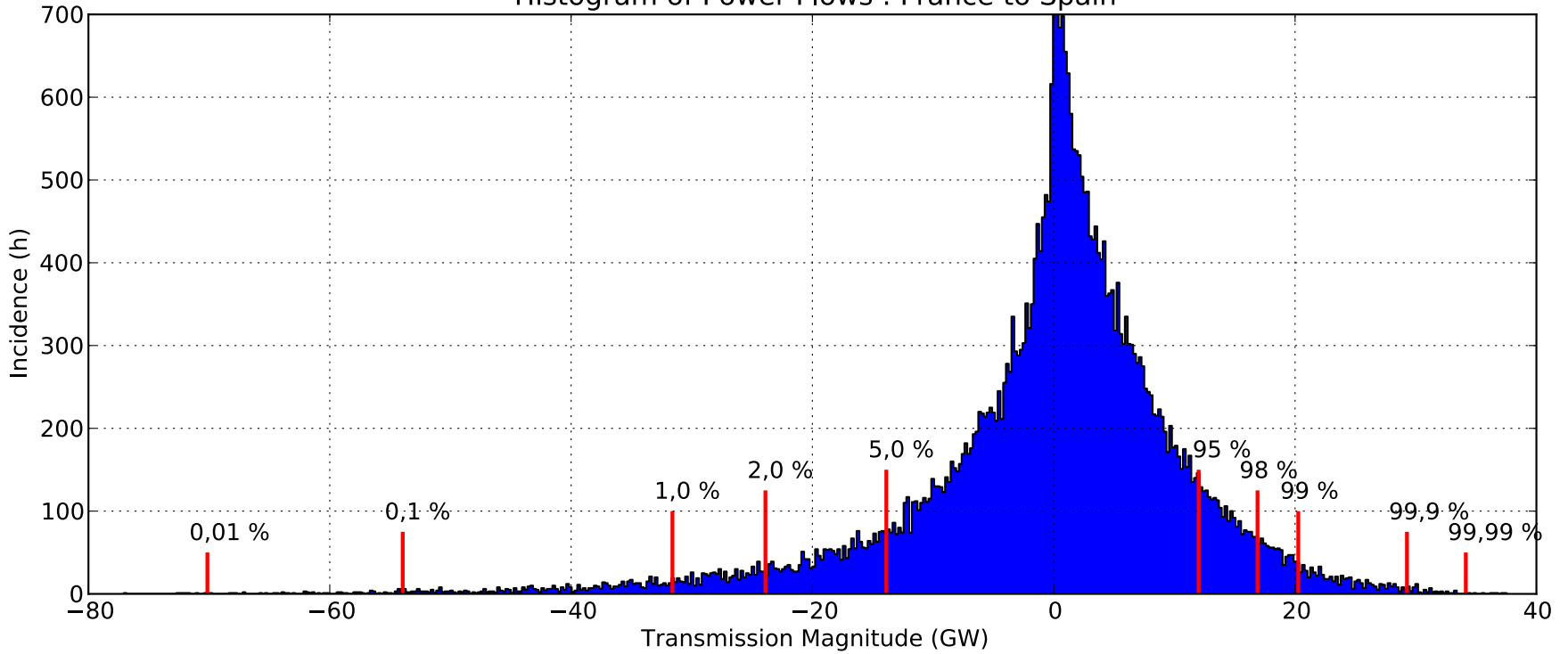
$$\gamma = 1, \quad \alpha \approx 0.7$$

$$\min \sum_n B_n$$

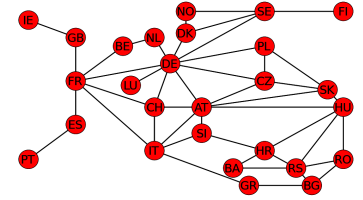
$$\min \sum_l F_l^2$$



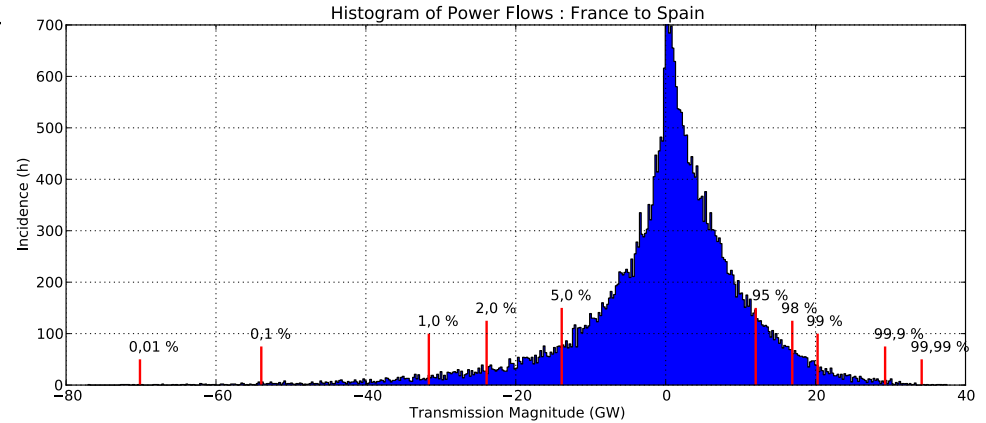
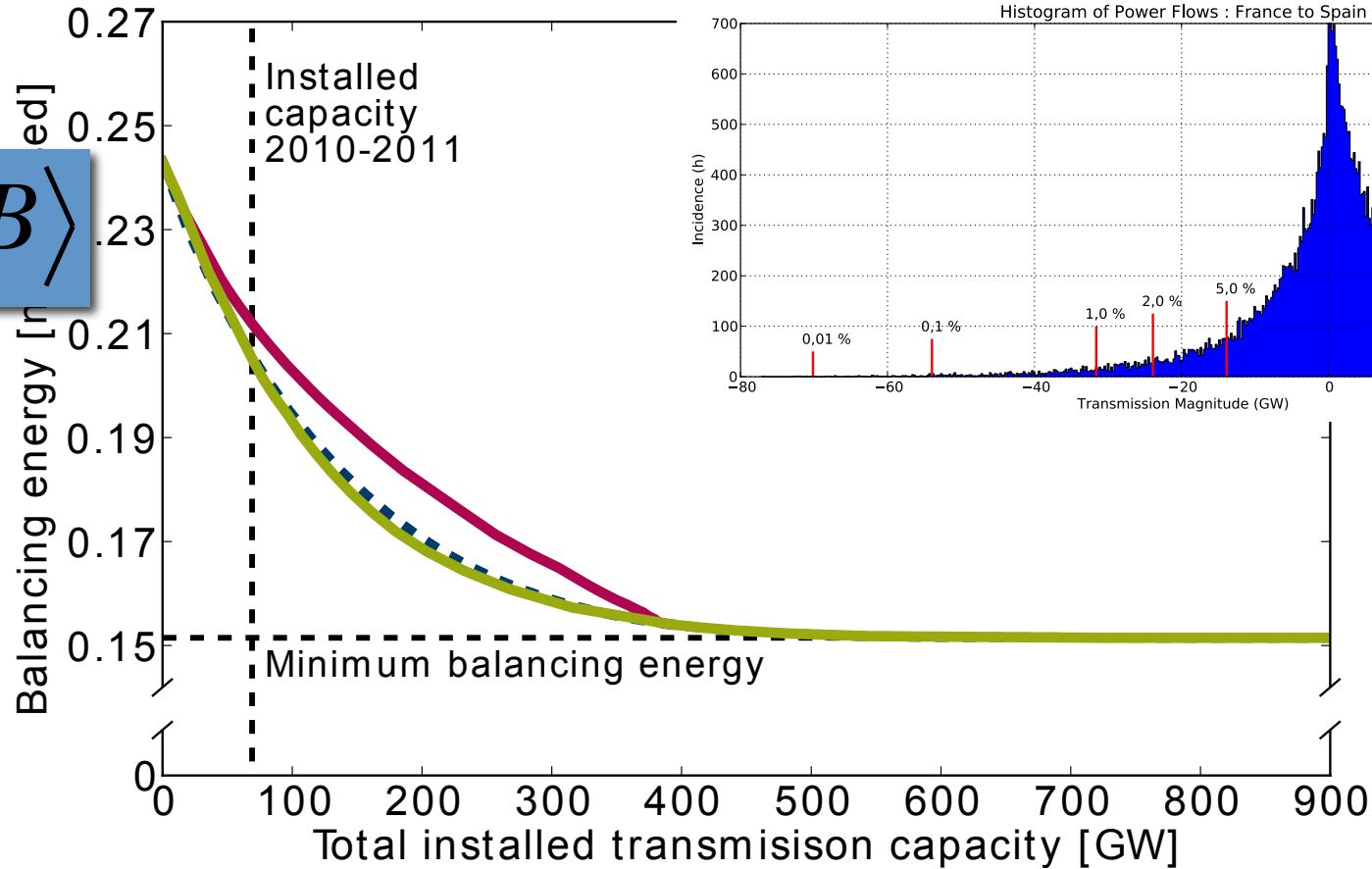
Histogram of Power Flows : France to Spain



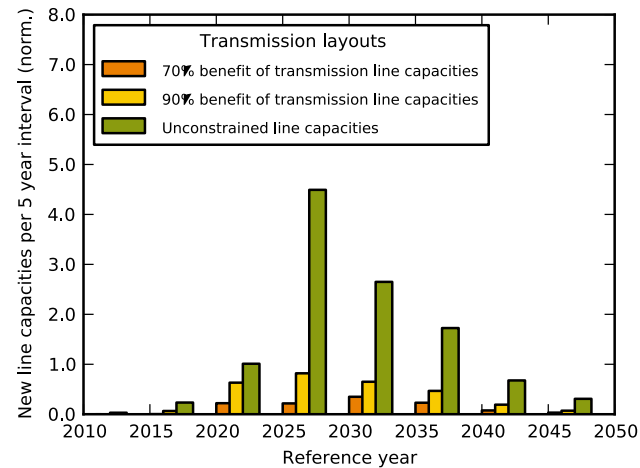
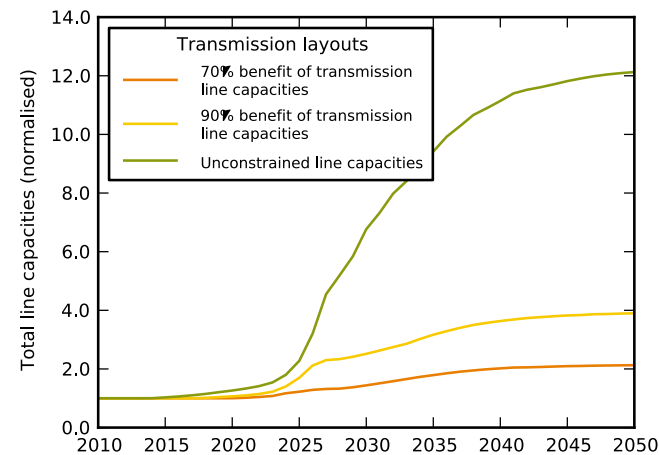
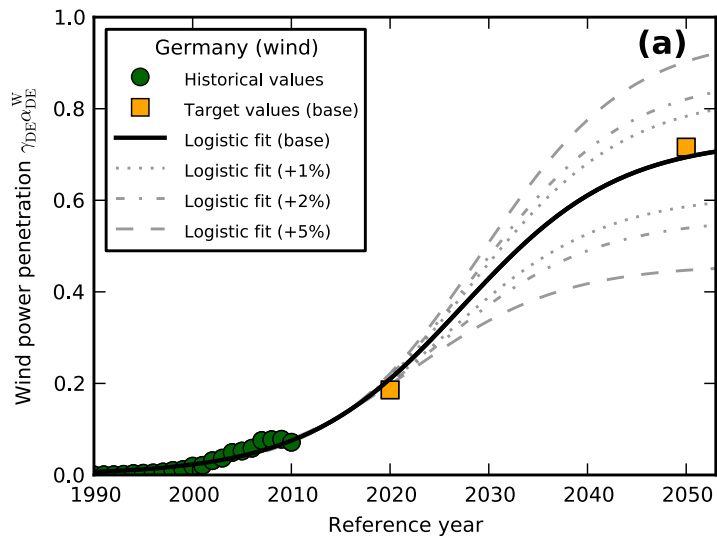
Backup vs. Transmission



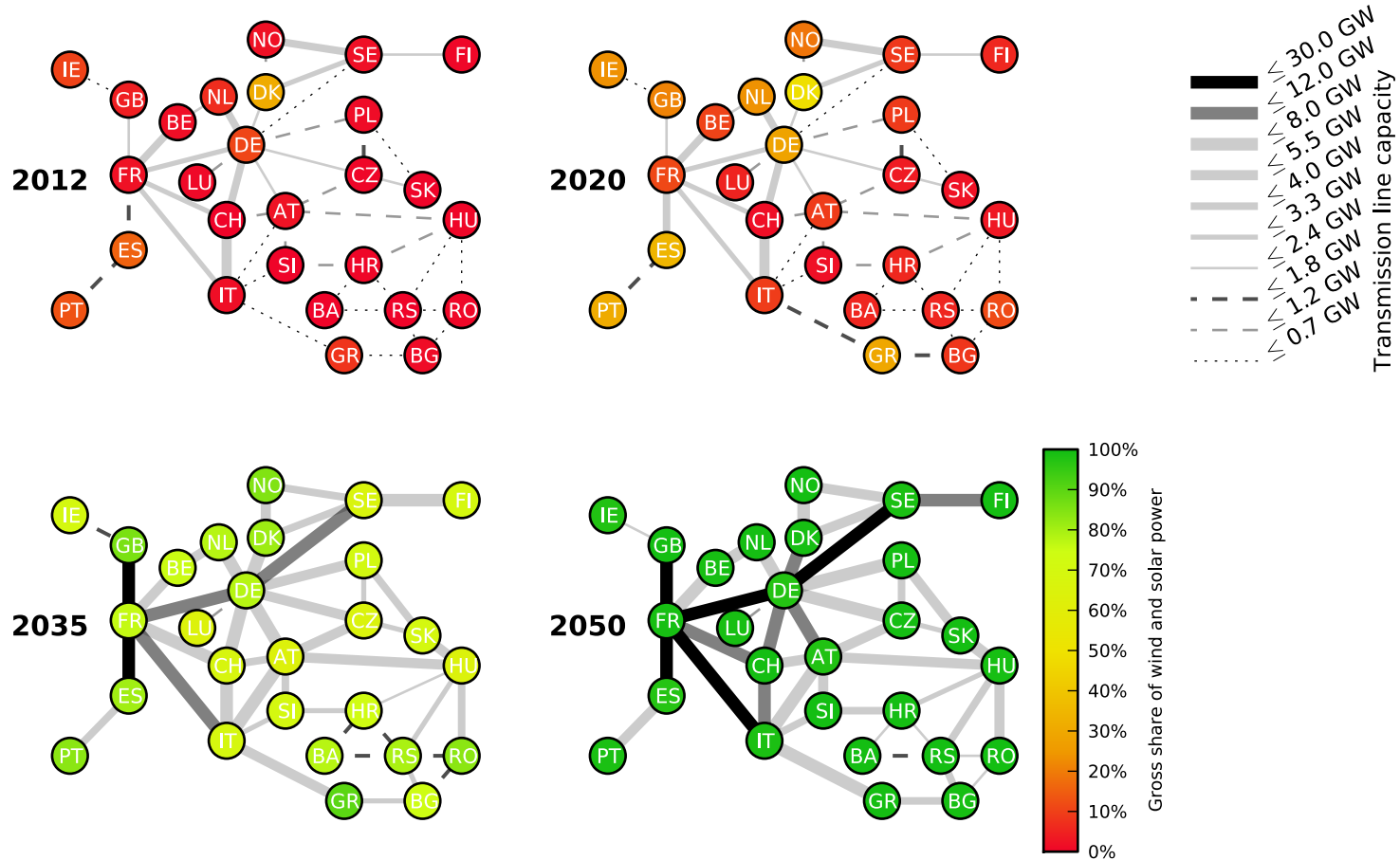
$\langle B \rangle$



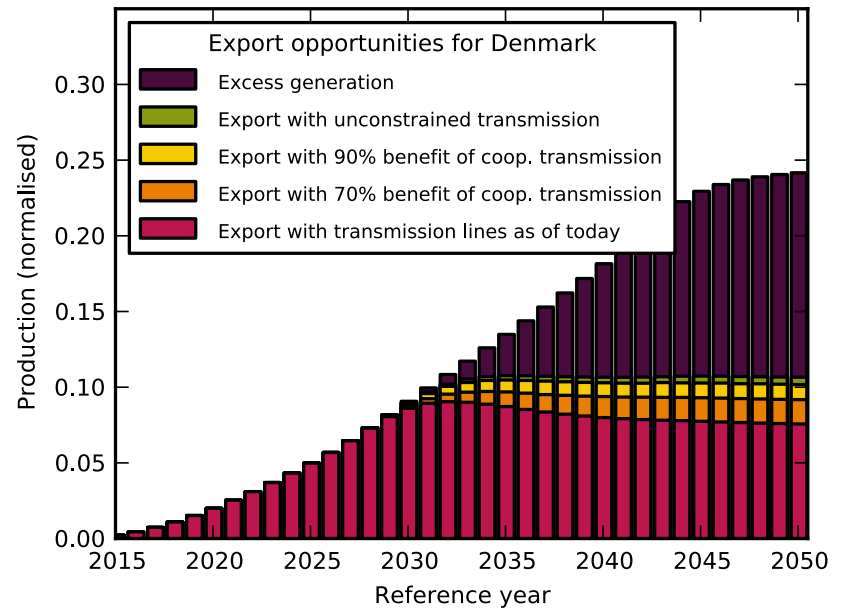
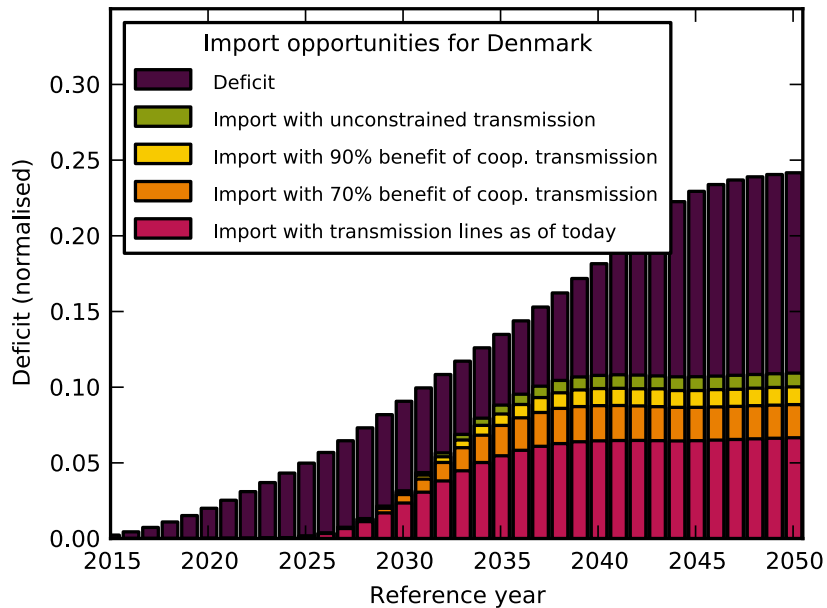
Pan-European Transmission 2014 → 2050



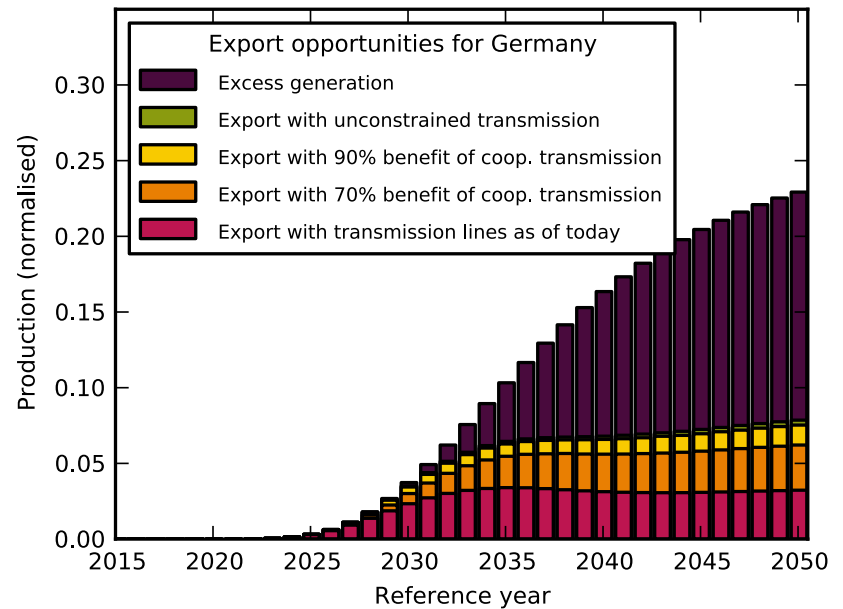
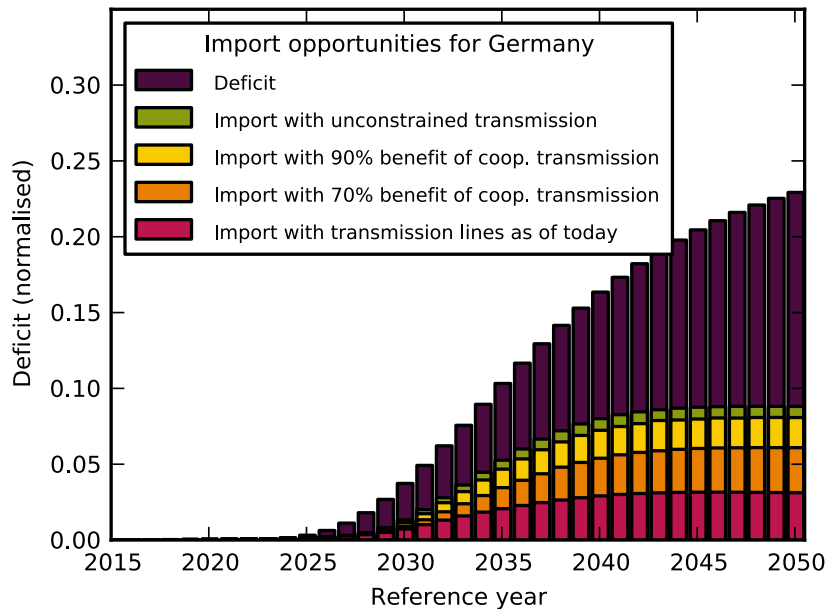
Pan-European Transmission 2014 → 2050



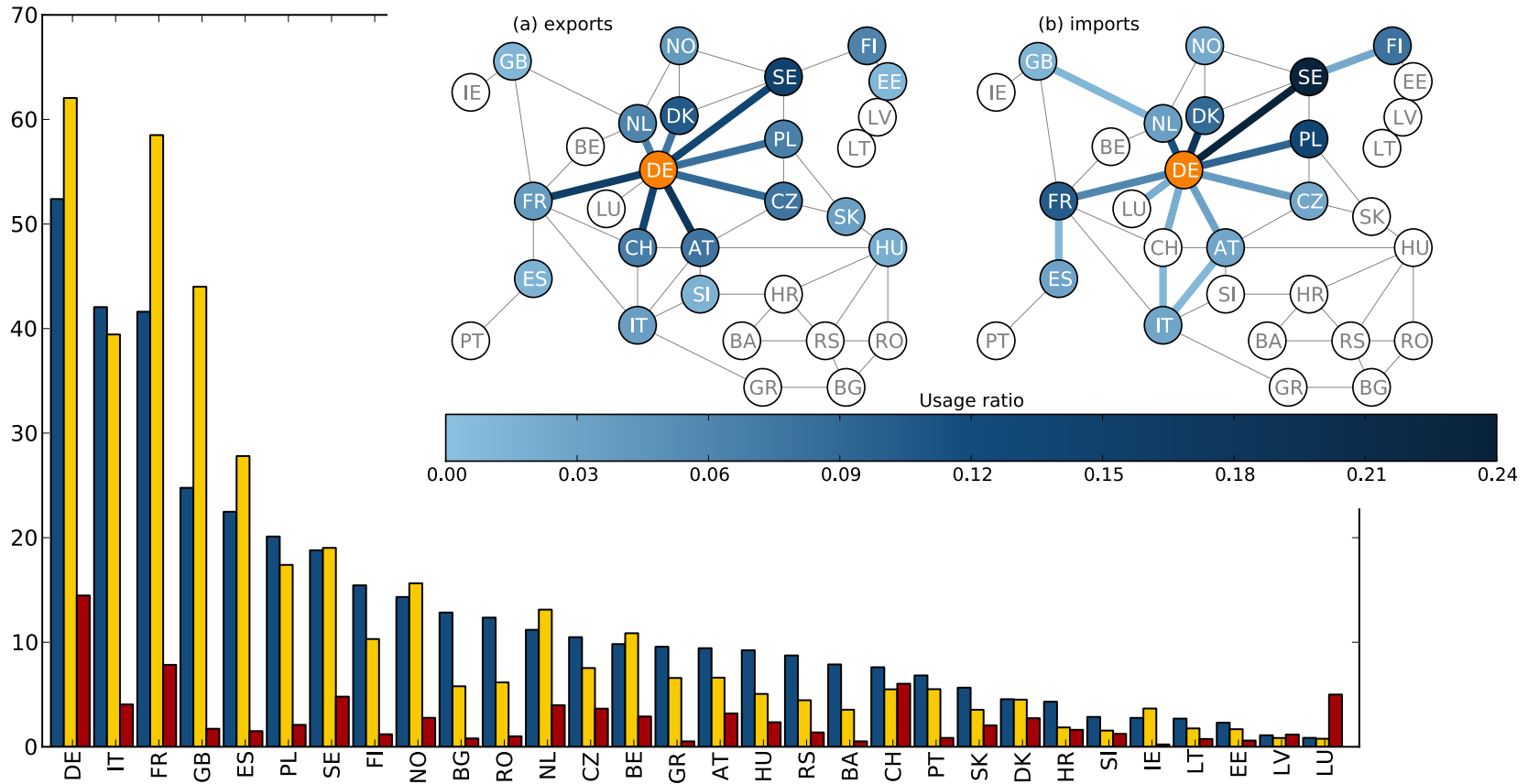
Denmark 2014 → 2050: Import / Export opportunities



Germany 2014 → 2050: Import / Export opportunities



Who pays for the transmission capacity?

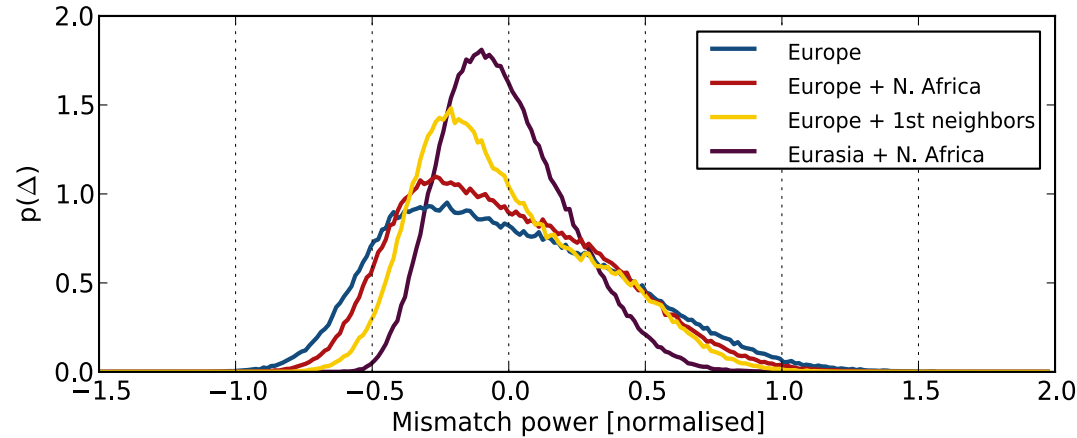
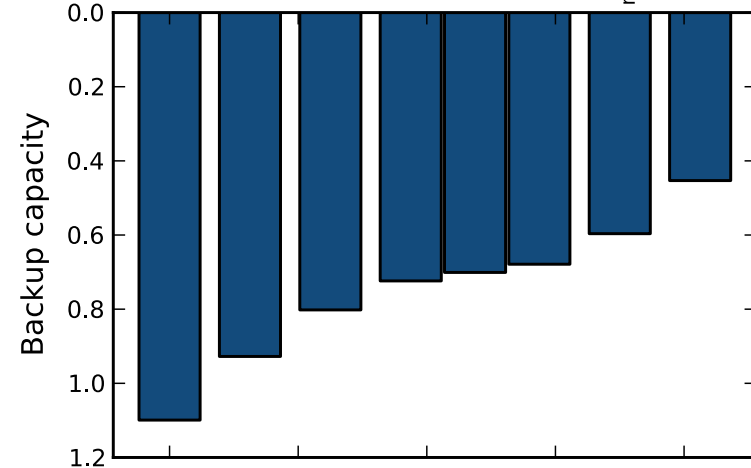
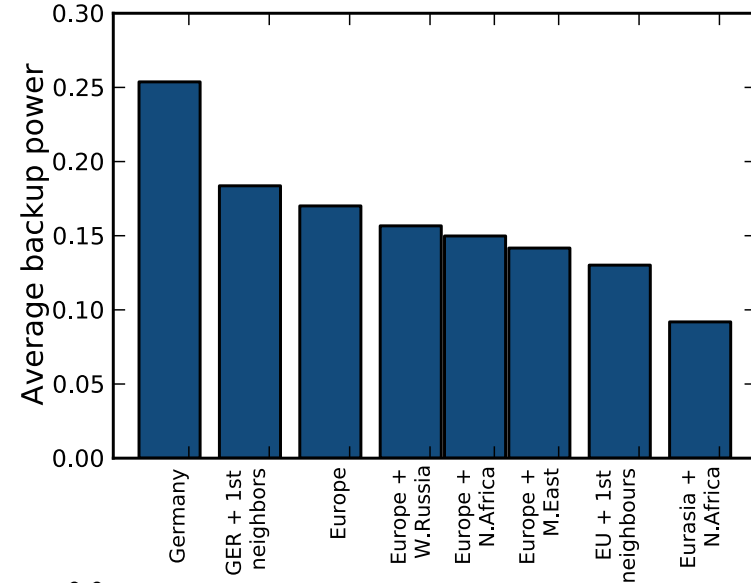
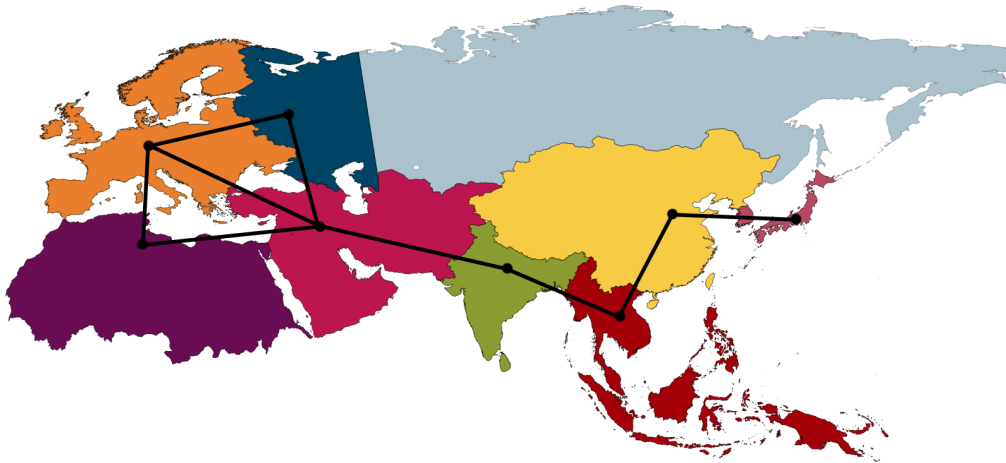


$$\sum_l \frac{\langle e_{nl} \rangle + \langle i_{ln} \rangle}{2 \langle |f_l| \rangle} T_l^{2050}$$

$$\left(\sum_l T_l^{2050} \right) \frac{\langle L_n \rangle}{\sum_m \langle L_m \rangle}$$

$$\sum_{l(n)} \frac{T_l^{today}}{2}$$

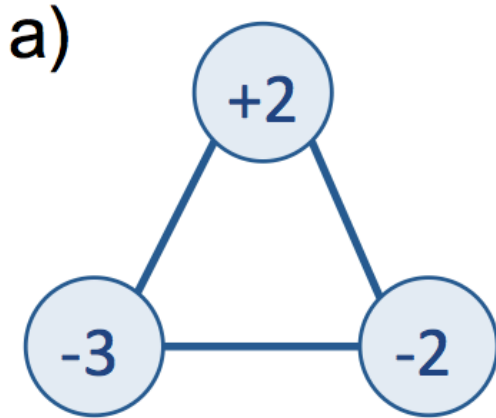
Transmission beyond EU



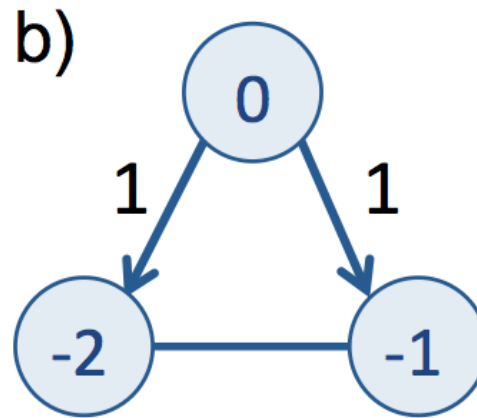
Levelized Cost of SYSTEM Energy

Coupling schemes between transmission and backup

$$\Delta_n(t) = G_n^{RES}(t) - L_n(t) - T_n(t)$$

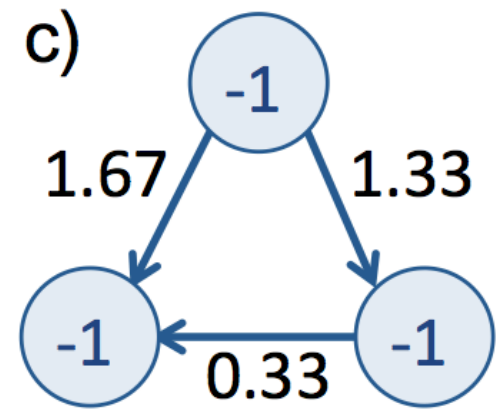


$$T_n(t) = 0$$



$$\min\left(\sum_n B_n(t)\right)$$

$$\min\left(\sum_l F_l^2(t)\right)$$



$$\Delta_n(t) = \beta(t) \langle L_n \rangle$$

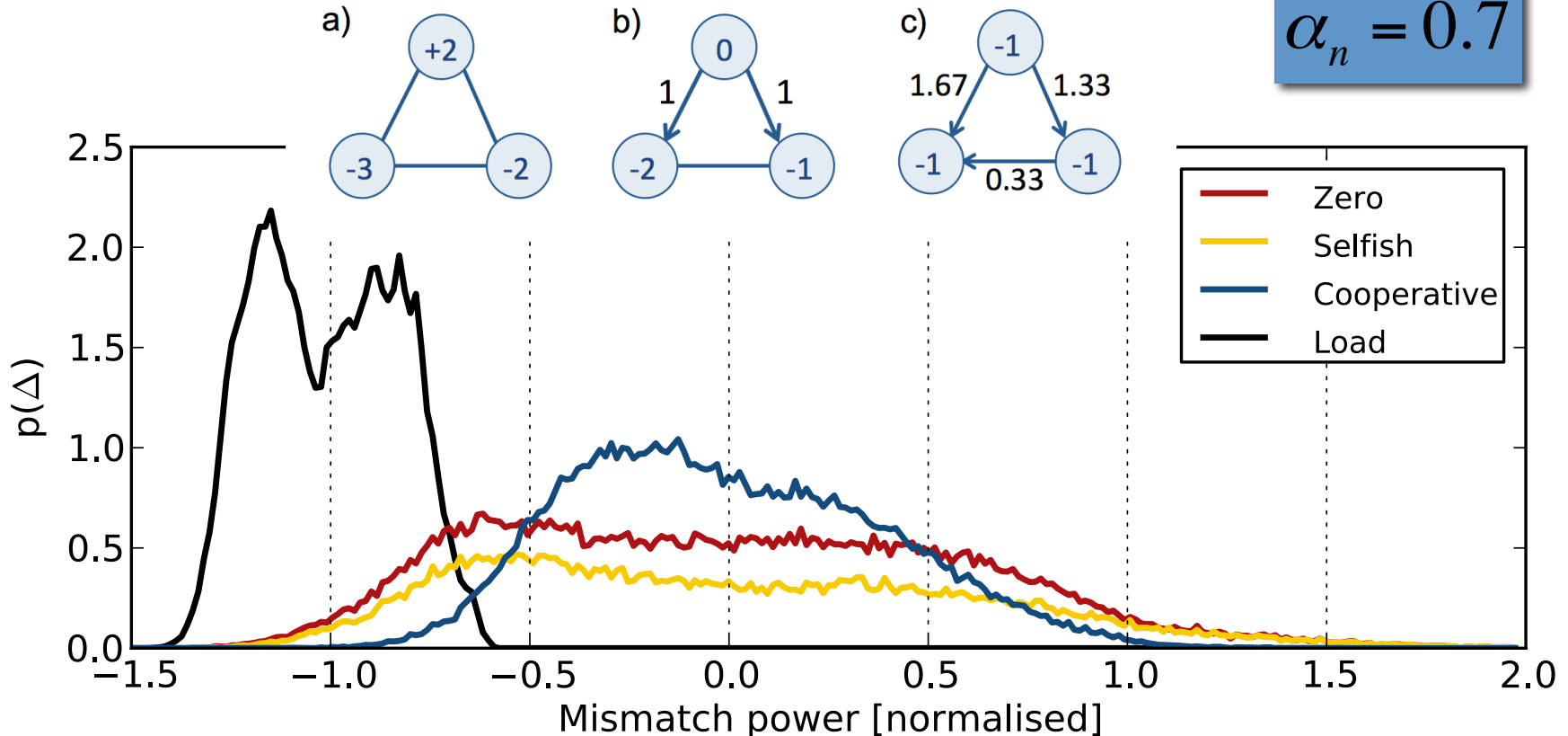
$$\beta(t) = \frac{\sum_n \Delta_n(t)}{\sum_n \langle L_n \rangle}$$

Mismatch distribution (Germany)

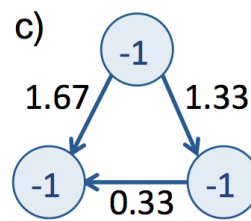
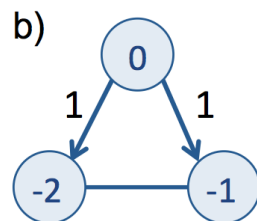
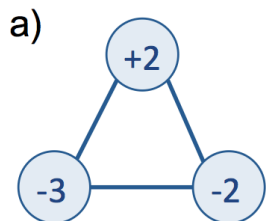
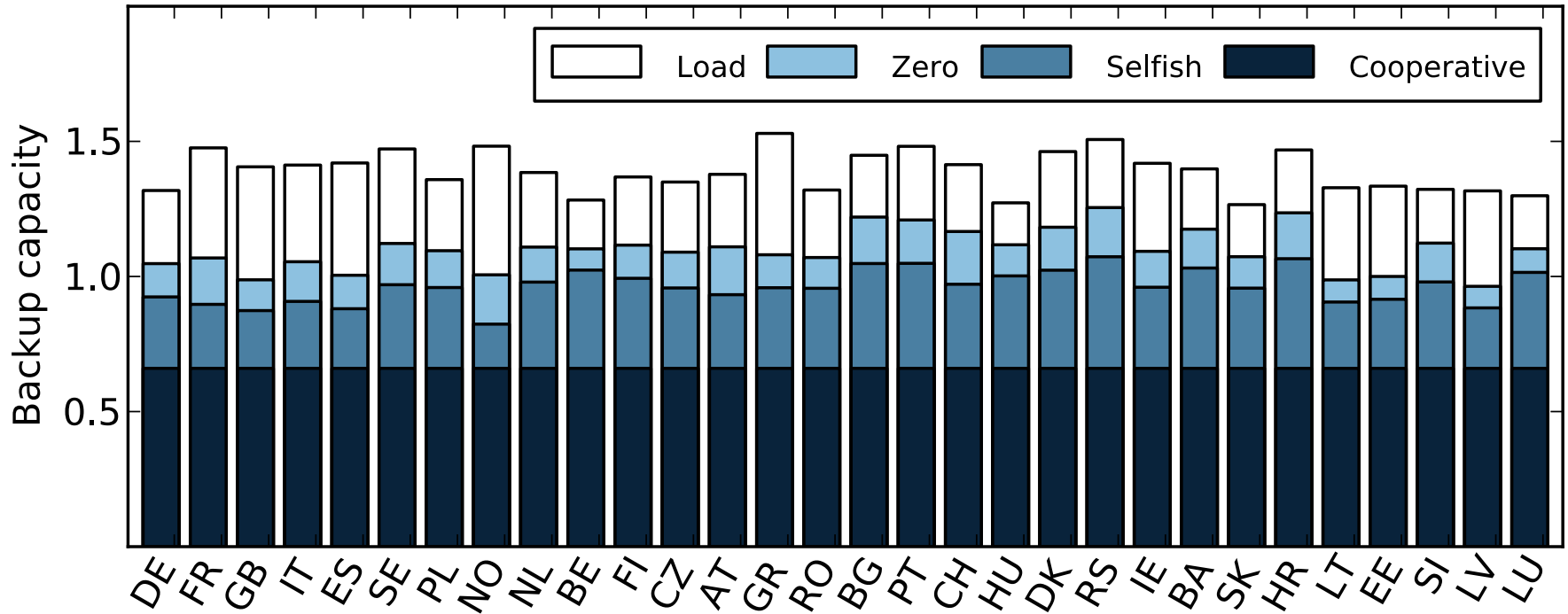
$$\Delta_n(t) = G_n^{RES}(t) - L_n(t) - T_n(t)$$

$$\langle G_n^{RES} \rangle = \langle L_n \rangle$$

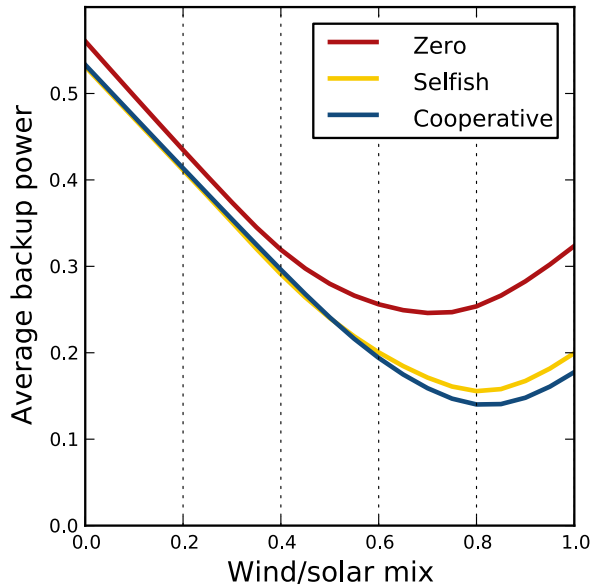
$$\alpha_n = 0.7$$



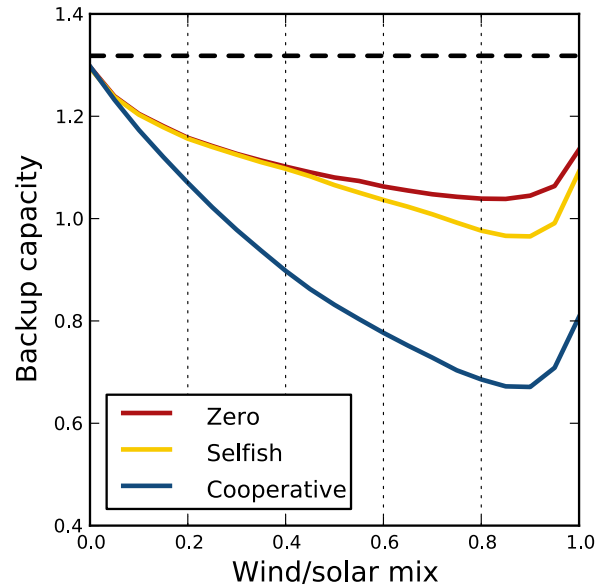
Who pays for the backup capacity?



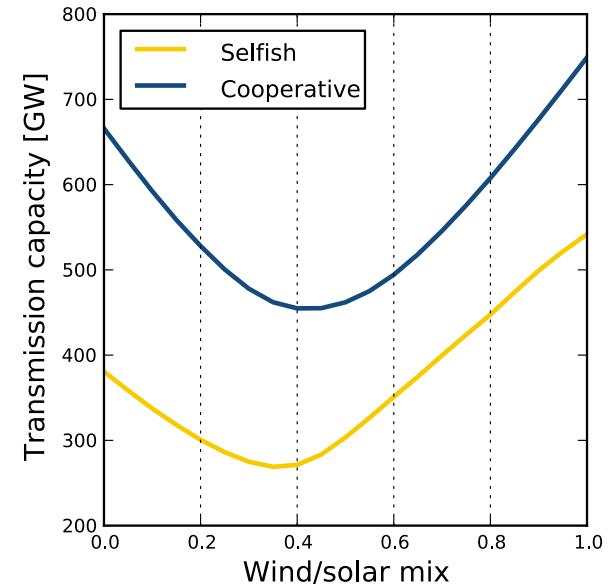
backup energy



backup capacity

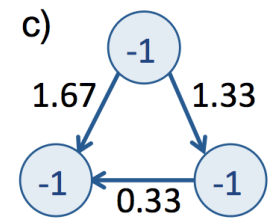
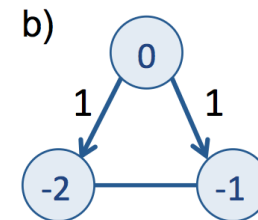
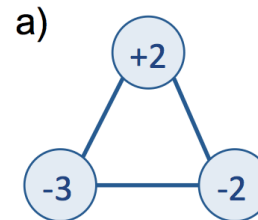


transmission capacity

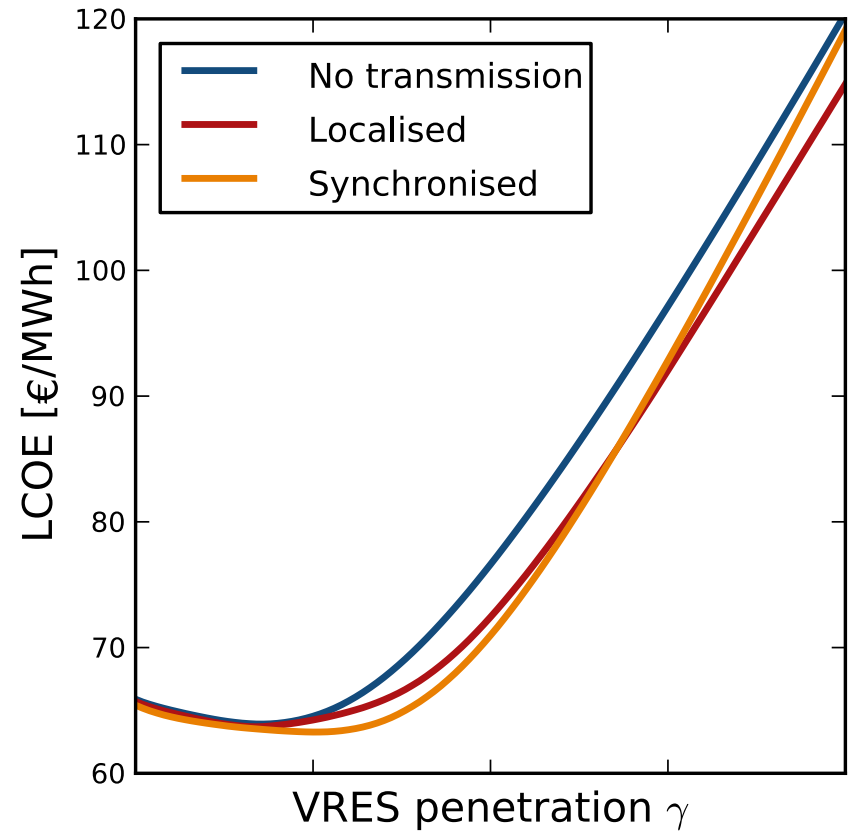
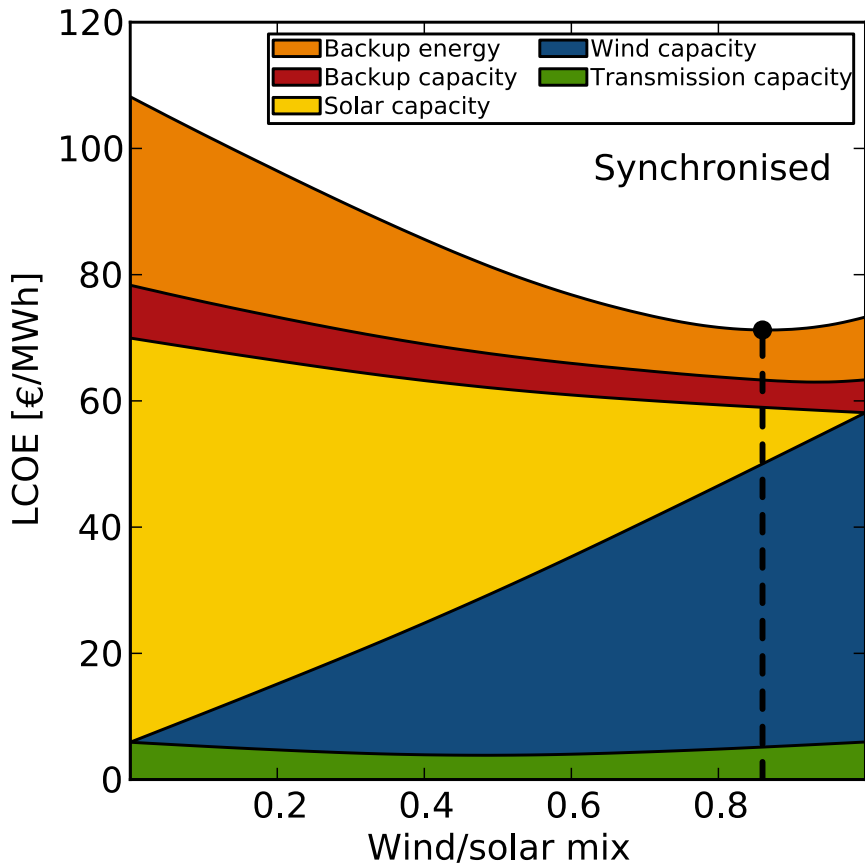


$$\alpha_n = \frac{\langle G_n^W \rangle}{\langle G_n^{RES} \rangle}$$

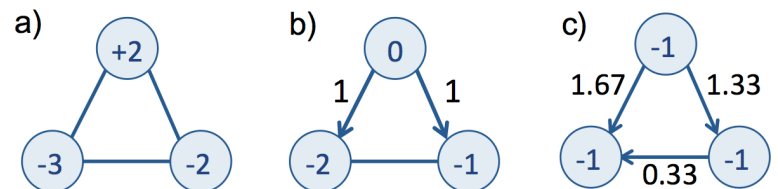
$$\langle G_n^{RES} \rangle = \langle L_n \rangle$$



Levelized Cost of SYSTEM Energy



$$\langle G_n^{RES} \rangle = \langle L_n \rangle$$

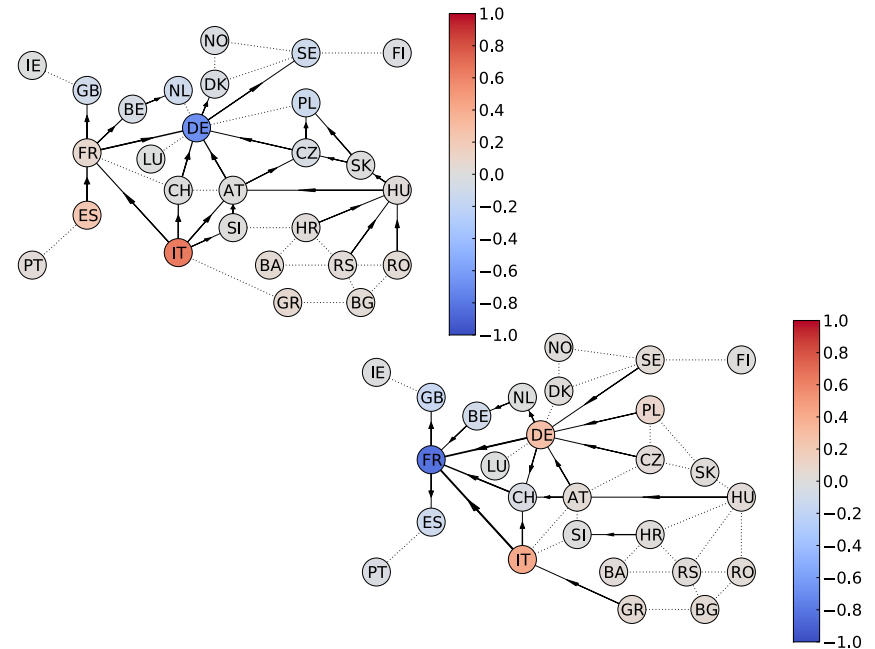
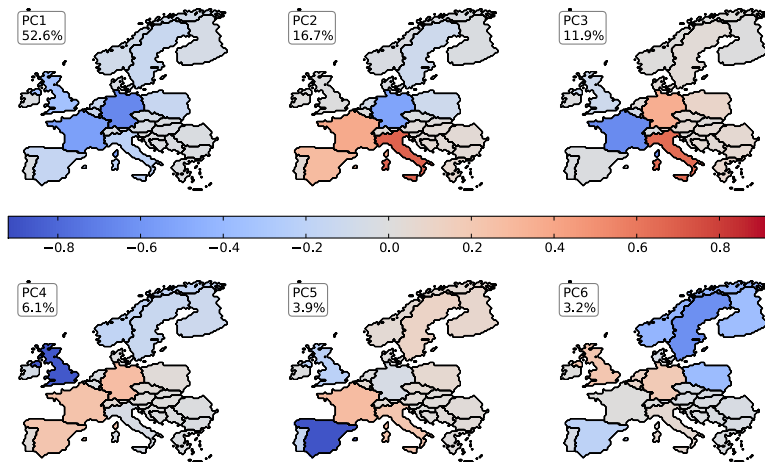
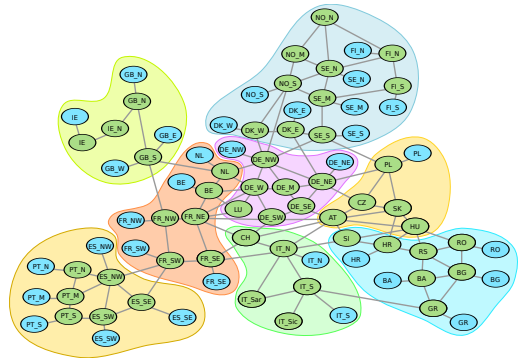


OUTLOOK

Fundamental Research on Renewable Energy Systems at the interface between engineering + mathematics + physics

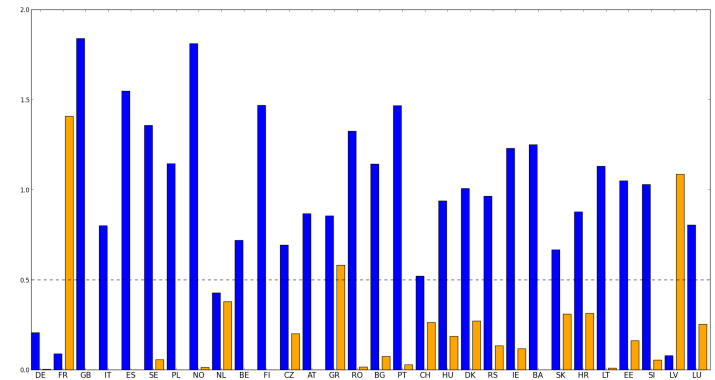
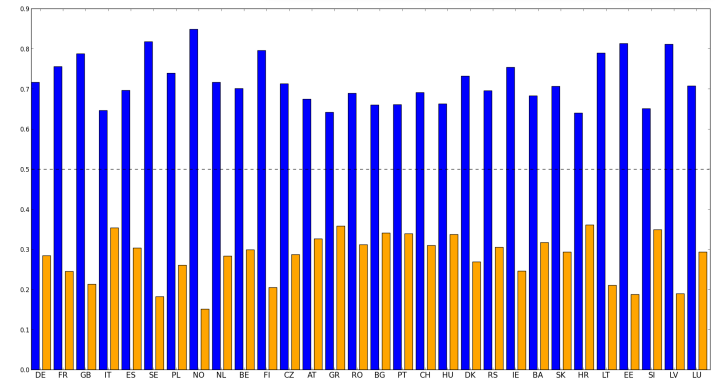
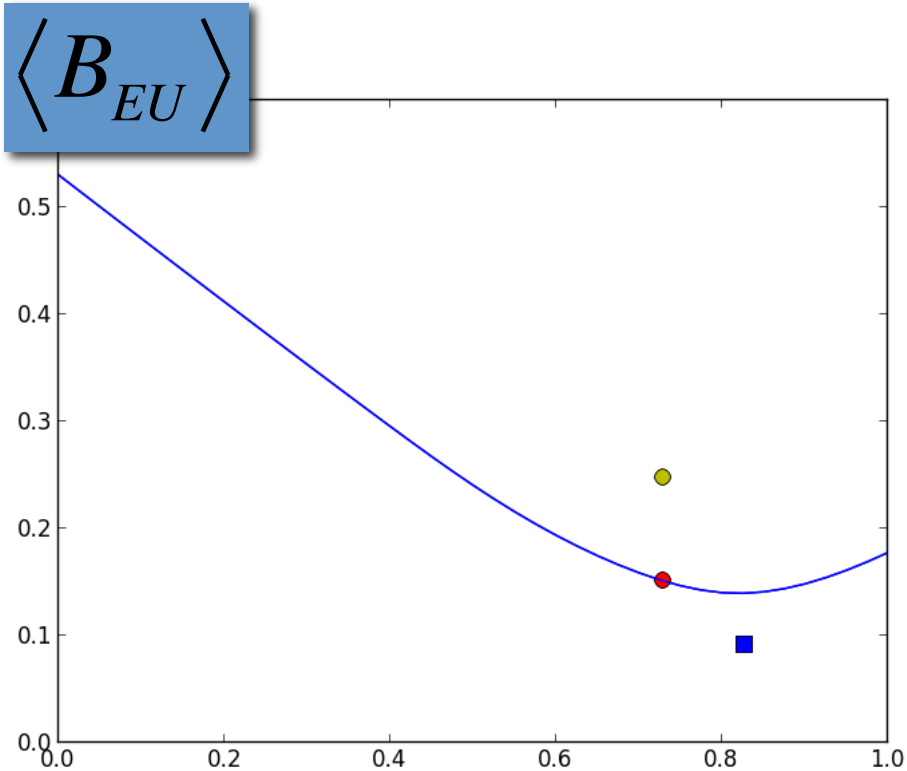
SOME FUNDAMENTAL CHALLENGES:

storage phase transition,
renormalisation scaling of power flows,
spatio-temporal flow pattern analysis,
self-organizing power flows,
emergence of socio-economic cooperation



Optimal Portfolio Theory + Genetic Optimization

$$\langle G_n^{RES} \rangle = \langle L_n \rangle$$

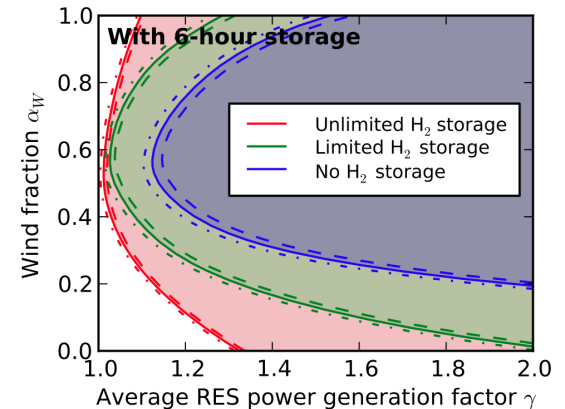


PRELIMINARY

$$\sum_n \langle G_n^{RES} \rangle = \sum_n \langle L_n \rangle$$

CONSENSYS

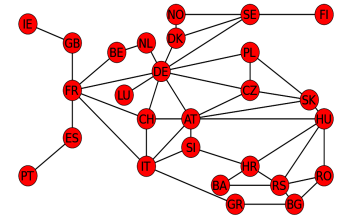
100% = 100+X%



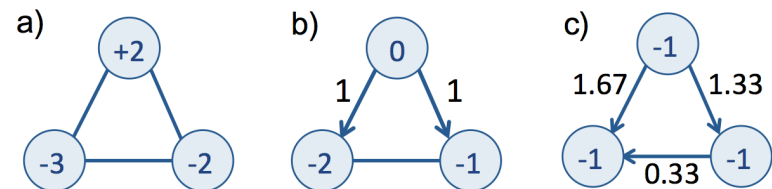
BIG DESIGN:

COMPLEX NETWORKS OF SMART ENERGY SYSTEMS

all renewables + balancing +
+ transmission + storage,
electricity + heating + transportation



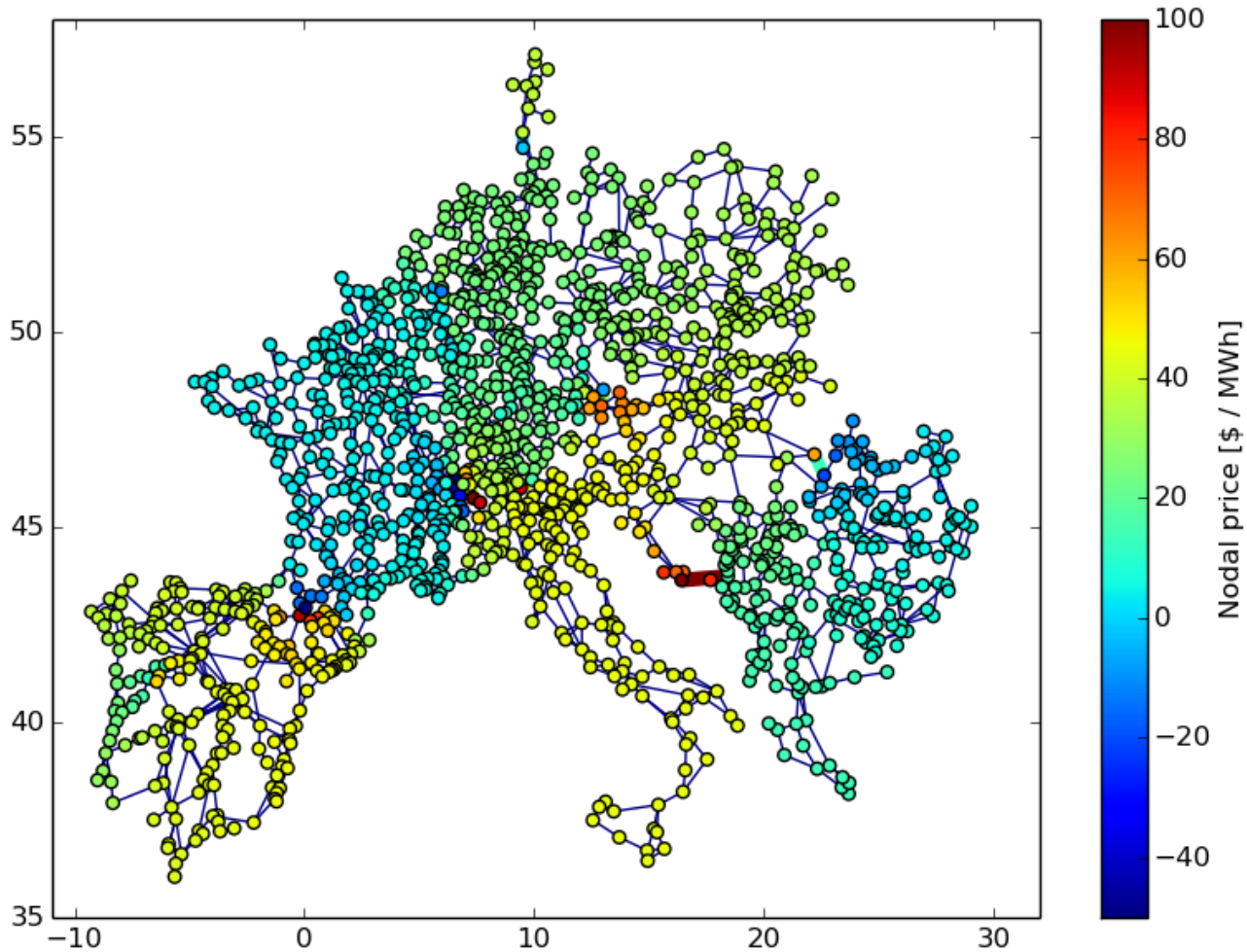
DESIGN OF FUTURE ENERGY MARKETS



OPTIMAL TRANSITION 2050 → 2015



Nodal vs. zonal pricing



Open access data set

„Think beyond Wind Energy!“ „Think beyond Denmark!“ „Complex Networks of Smart Energy Systems!“

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