



# The Future of Measuring Environmental Risk and Opportunity in Investment Portfolios

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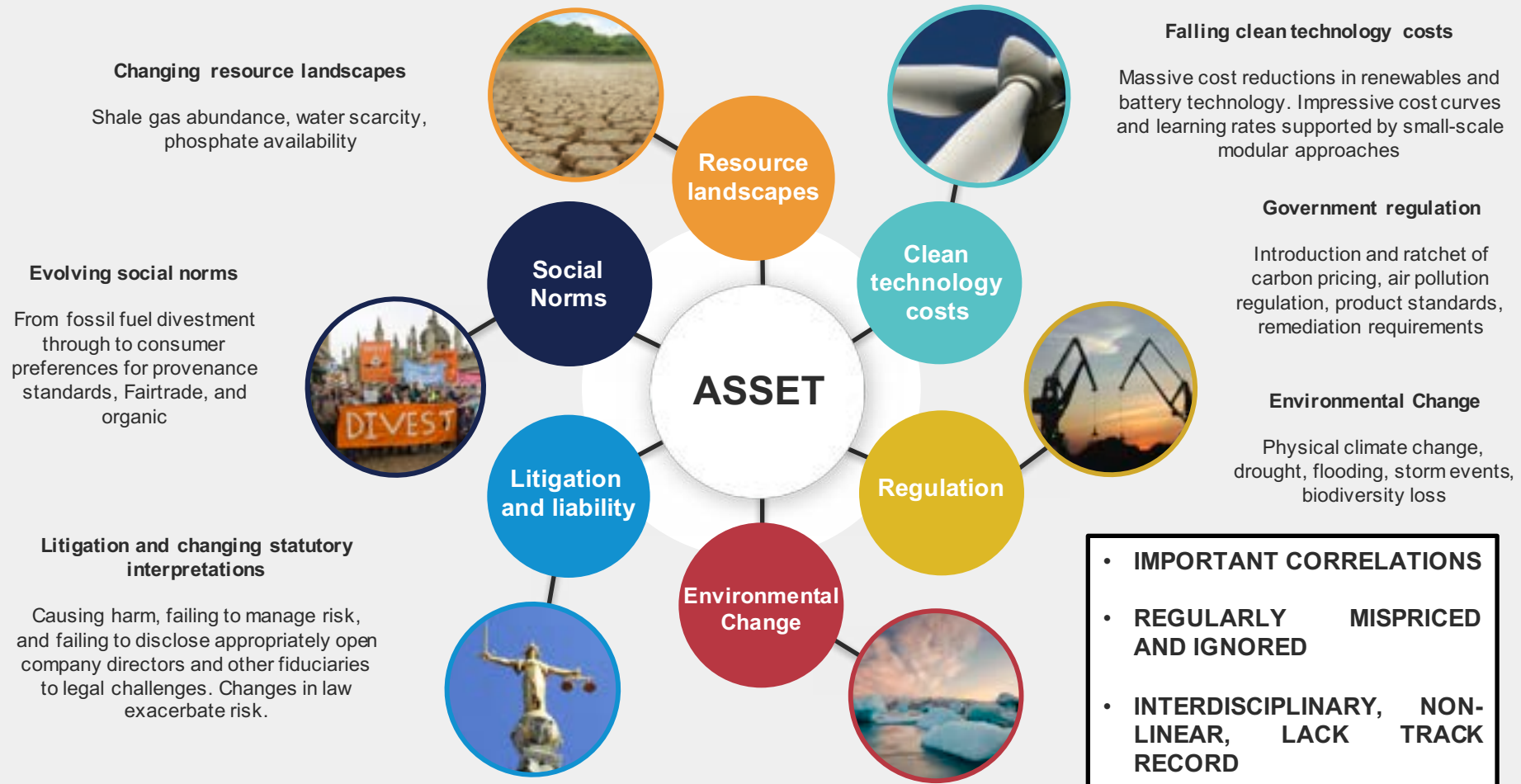
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# ENVIRONMENT-RELATED RISK AND OPPORTUNITY

How do environmental factors affect asset values?





# EXPOSURE AND WHY IT MATTERS

How is environmental risk and opportunity embedded throughout the investment chain and what are the data requirements of different stakeholders?

## ASSETS



**EXPOSED TO  
DIFFERENT  
ENVIRONMENTAL  
RISKS AND  
OPPORTUNITIES**

## COMPANIES



**OWN  
EXPOSED  
ASSETS**

## ASSET MANAGERS



**OWN  
COMPANY  
DEBT AND  
EQUITY**

## ASSET OWNERS



**ALLOCATE  
CAPITAL TO  
ASSET  
MANAGERS  
OR ACT AS  
ASSET  
MANAGERS  
THEMSELVES**

## POLICYMAKERS AND REGULATORS



**MANAGE  
MICROPRUDENTIAL  
RISK, SYSTEMIC  
RISK, ECONOMIC  
GROWTH, AND  
WANT TO  
IMPLEMENT NDCs  
SUCCESSFULLY**

# CURRENT EFFORTS TO MEASURE EXPOSURE ARE DEEPLY FLAWED

Carbon foot printing is not a solution, but current efforts focus on incremental improvements to a questionable approach

PHYSICAL CLIMATE CHANGE  
IMPACTS

INCREASING STRINGENCY OF  
ENVIRONMENTAL REGULATION

COMPETITION FROM CLEAN TECH

INCREASED REPUTATIONAL RISK



CARBON  
INTENSITY DATA  
USED AS A 'TOP  
DOWN' PROXY

UNREPORTED  
DATA  
CALCULATED BY  
THIRD PARTIES  
USING NON-  
TRANSPARENT  
BLACK BOXES

FAILS TO  
CONVINCE  
MAINSTREAM

# HYPOTHESES NEED TO BE DEFINED AND THEN MEASURED 'BOTTOM UP'

How should exposure to environmental risk and opportunity be measured?

PHYSICAL CLIMATE CHANGE  
IMPACTS

INCREASING STRINGENCY OF  
ENVIRONMENTAL REGULATION

COMPETITION FROM CLEAN TECH

INCREASED REPUTATIONAL RISK



HEAT STRESS PROJECTIONS

FLOODING PROJECTIONS

PRECIPITATION PROJECTIONS

ASSETS PARTICULARLY EXPOSED

PRICING OF EXTERNALITIES

ASSETS IN JURISDICTIONS  
PARTICULARLY AT RISK

PACE OF DEPLOYMENT IN KEY  
MARKETS

UTILISATION RATES

POLICY SUPPORT

ASSETS IN PROXIMITY TO NATIONAL  
PARKS

SALIENCE OF AREAS AFFECTED

SOCIAL MEDIA



# EXAMPLE PROJECT: THERMAL COAL VALUE CHAIN FOR NORGES BANK INVESTMENT MANAGEMENT

## Top 100 Coal-Fired Power Utilities

- By coal-fired power generation in GWh
- 42% of all world coal-fired power stations
- 73% of all coal-fired generating capacity

	Coal-Fired Power Utilities	[GWh]
1	CHINA HUANENG GROUP CORP	471,139
2	CHINA GUODIAN CORP	455,038
3	CHINA DATANG CORP	415,118
4	CHINA HUADIAN GROUP CORP	369,511
5	CHINA POWER INVESTMENT CORP	293,658
6	SHENHUA GROUP CORP LTD	292,107
7	ESKOM HOLDINGS SOC LTD	214,924
8	NTPC LTD	208,588
9	CHINA RESOURCES POWER HOLDINGS	171,178
10	KOREA ELECTRIC POWER CORP	128,189

## Top 20 Thermal Coal Miners

- By 2014 thermal coal revenue
- Revenue  $\geq 30\%$  from thermal coal
- 70% of world thermal coal revenue

	Thermal Coal Miners	[US\$m]
1	CHINA SHENHUA ENERGY CO	14,006
2	SASOL	11,050
3	COAL INDIA LTD	10,251
4	CHINA COAL ENERGY COMPANY	5,966
5	ADANI ENTERPRISES LTD	5,068
6	PEABODY ENERGY CORPORATION	4,890
7	INNER MONGOLIA YITAI COAL CO., LTD	3,397
8	YANZHOU COAL MINING COMPANY LTD	3,045
9	PT ADARO ENERGY TBK	2,909
10	ALPHA NATURAL RESOURCES	2,837

## Top 30 Coal-Processing Technology Companies

- By normalised syngas production per day in Nm<sup>3</sup>/d
- 34% of all world CPT plants
- 63% of all world CPT products

	Coal-Processing Technology Companies	[kNm <sup>3</sup> /d]
1	SASOL	90,260
2	DATANG	48,550
3	SHENHUA GROUP	43,360
4	YITAI COAL OIL MANUFACTURING CO (INNER MONGOLIA YITAI GROUP)	33,700
5	SINOPEC	29,481
6	CHINACOAL GROUP	24,100
7	DAKOTA GASIFICATION CO	13,900
8	QINGHUA GROUP	13,860
9	YANKUANG GROUP	13,415
10	GUANGHUI ENERGY CO	12,600

# ASSET-LEVEL DATABASES

Data sources and completeness

Data	Data Source (in order of seniority)	Completion (%)	Notes
<b>Number of Coal-Fired Generating Assets (N = 1,445 coal-fired power stations)</b>			
	CoalSwarm's Global Coal Plant Tracker (CoalSwarm, Q4 2015)		
Location	Enipedia Carbon Monitoring for Action Database (CARMA, v3.0 released Jul 2012) Platts' World Electric Power Plant Database (WEPP, Q4 2015)	100%	
Capacity [MW]	CoalSwarm, WEPP, Enipedia, CARMA	100%	
Generation [MWh]	Enipedia, CARMA, Oxford Smith School	100%	26% estimated by regression
Plant Age	CoalSwarm, WEPP, Enipedia, CARMA, Oxford Smith School	100%	31% estimated by regression
CO <sub>2</sub> Intensity	CoalSwarm, WEPP, CARMA, Oxford Smith School	100%	22% estimated by regression
Cooling Technologies	WEPP, Oxford Smith School	71%	12pp added from GoogleEarth searching
Pollution Abatement Technologies	WEPP	73%	
Coal Type	CoalSwarm, WEPP, Oxford Smith School	71%	29pp estimated based on proximity to reserves
<b>Number of Thermal Coal Mining Assets (N = 274 thermal coal mines)</b>			
'Top 30' coal mining companies	MSCI	-	
% Rev by Activity	MSCI, Trucost	97%	Data unavailable
Mine Production	Oxford Smith School	69%	Data unavailable
Location	Oxford Smith School	100%	
<b>Number of Coal Processing Technology Assets (N = 63 coal processing technology plants)</b>			
Location	World Gasification Database (Nov 2015)	100%	
Capacity [Nm <sup>3</sup> /day]	World Gasification Database, Oxford Smith School	100%	14% estimated from product energy content
Plant Age	World Gasification Database	100%	

# RISK HYPOTHESES (LOCAL AND NATIONAL)

#	NAME	SOURCE
<b>Coal-Fired Power Utilities</b>		
LRH-U1	Carbon Intensity	CARMA/CoalSwarm/WEPP/Oxford Smith School
LRH-U2	Plant Age	CARMA/CoalSwarm/WEPP
LRH-U3	Local Air Pollution	Boys et al. (2015)/NASA's SEDAC
LRH-U4	Water Stress	WRI's Aqueduct
LRH-U5	Quality of Coal	CoalSwarm/WEPP
LRH-U6	CCS Retrofitability	CARMA/CoalSwarm/WEPP/Geogreen
LRH-U7	Future Heat Stress	IPCC AR5
NRH-U1	Electricity Demand Outlook	IEA
NRH-U2	'Utility Death Spiral'	Oxford Smith School
NRH-U3	Renewables Resource	Lu et al. (2009)/ McKinsey & Co/ SolarGIS
NRH-U4	Renewables Policy Support	EY's Renewables Attractiveness Index
NRH-U5	Renewables Generation Outlook	BP/REN21
NRH-U6	Gas Resource	BP/IEA
NRH-U7	Gas Generation Outlook	IEA
NRH-U8	Falling Utilisation Rates	Oxford Smith School
NRH-U9	Regulatory Water Stress	WRI's Aqueduct
NRH-U10	CCS Legal Environment	Global CCS Institute

#	NAME	SOURCE
<b>Thermal Coal Mining Companies</b>		
LRH-M1	Proximity to Populations and Protected Areas	NASA's SEDAC/UNEP-WCMC
LRH-M2	Water Stress	WRI's Aqueduct
NRH-M1	Remediation Liability Exposure	Oxford Smith School
NRH-M2	Environmental Regulation	Oxford Smith School
NRH-M3	New Mineral Taxes or Tariffs	Oxford Smith School
NRH-M4	Type of Coal Produced	IEA
NRH-M5	Domestic Demand Outlook	IEA
NRH-M6	Export Sensitivity	IEA
NRH-M7	Protests and Activism	CoalSwarm
NRH-M8	Water Regulatory Stress	WRI's Aqueduct
<b>Coal Processing Technology Companies</b>		
LRH-P1	Plant Age	World Gasification Database
LRH-P2	Water Stress	WRI's Aqueduct
LRH-P3	CCS Retrofitability	World Gasification Database/GeoGreen
NRH-P1	CPT Policy Support	Oxford Smith School
NRH-P2	Oil and Gas Demand Outlook	IEA
NRH-P3	Oil and Gas Indigenous Resources	BP
NRH-P4	Other Local Environmental	Oxford Smith School
NRH-P5	Regulatory Water Stress	WRI's Aqueduct
NRH-P6	CCS Policy Outlook	Global CCS Institute



# FINDINGS: UTILITIES

LRH-U1: 'Carbon Intensity'	
1	EUROSIBENERGO
2	GAZPROM
3	ELEKTROPRIVREDA SRBIJE (EPS)
4	CEZ AS
5	OOO SIBERIAN GENERATING CO
6	CHINA PETRO & CHEM (SINOPEC)
7	AGL ENERGY LTD
8	SHENZHEN ENERGY GROUP CO LTD
9	HARYANA POWER GEN CO (HPGC)
10	PUBLIC POWER CORP (DEI)

LRH-U2: 'Plant Age'	
1	ELEKTROPRIVREDA SRBIJE (EPS)
2	SCOTTISH AND SOUTHERN ENERGY
3	DTE ENERGY CO
4	AMEREN CORP
5	DYNEGY HOLDINGS INC
6	DOMINION
7	SALT RIVER PROJECT (AZ)
8	NRG ENERGY INC
9	TENNESSEE VALLEY AUTHORITY
10	ECU - ENERGY CO OF UKRAINE

LRH-U3: 'Local Air Pollution'	
1	WEST BENGAL POWER DEV CORP
1	SHENZHEN ENERGY GROUP CO LTD
1	MP POWER GENERATING CO LTD
1	SHENERGY COMPANY LTD
1	TAMIL NADU GEN & DIST CORP LTD
1	UTTAR PRADESH RAJYA VIDYUT
1	MAHARASHTRA STATE POWER GEN CO
1	TATA GROUP
1	MINISTRY OF ECONOMIC AFFAIRS
Top 9 Companies Tied	

LRH-U6: 'CCS Retrofitability'	
Top 65 Companies Tied	

LRH-U4: 'Water Stress'	
1	ELEKTROPRIVREDA SRBIJE (EPS)
2	SCOTTISH AND SOUTHERN ENERGY
3	DTE ENERGY CO
4	AMEREN CORP
5	DYNEGY HOLDINGS INC
6	DOMINION
7	SALT RIVER PROJECT (AZ)
8	NRG ENERGY INC
9	TENNESSEE VALLEY AUTHORITY
10	ECU - ENERGY CO OF UKRAINE

LRH-U5: 'Quality of Coal'	
1	ELEKTROPRIVREDA SRBIJE (EPS)
2	PUBLIC POWER CORP (DEI)
3	ENERGY FUTURE HOLDINGS CORP
4	NEYVELI LIGNITE CORP LTD
5	RWE AG
6	CEZ AS
7	PGE POLSKA GRUPA ENERGETYCZNA
8	GAZPROM
9	VATTENFALL GROUP
10	INTER RAO UES

LRH-U7: 'Future Heat Stress'	
1	GAZPROM
1	BASIN ELECTRIC POWER COOP
1	ECU - ENERGY CO OF UKRAINE
1	DATONG COAL MINE GROUP CO LTD
1	BERKSHIRE HATHAWAY ENERGY COMPANY
1	DTE ENERGY CO
1	AMEREN CORP
1	GREAT PLAINS ENERGY INC
1	ALLIANT ENERGY CORP
1	ENERGY CORP
Top 10 Companies Tied	

# FINDINGS: MINERS

## LRH-M1: 'Proximity to Protected Areas and Populations'

1	THE TATA POWER COMPANY
2	COAL INDIA LTD
3	SHANXI LU'AN ENVIRONMENTAL ENERGY DEVELOPMENT
4	INDO TAMBANGRAYA MEGAH TBK PT
5	YANG QUAN COAL INDUSTRY (GROUP) CO., LTD.
6	CHINA COAL ENERGY COMPANY
7	BANPU PUBLIC COMPANY LIMITED
8	YANZHOU COAL MINING COMPANY LIMITED
9	CHINA SHENHUA ENERGY CO
10	INNER MONGOLIA YITAI COAL CO., LTD.

## LRH-M2: 'Water Stress'

1	SHANXI LU'AN ENVIRONMENTAL ENERGY DEVELOPMENT
1	YANG QUAN COAL INDUSTRY (GROUP) CO., LTD.
1	CHINA COAL ENERGY COMPANY
1	DATONG COAL INDUSTRY
5	INNER MONGOLIA YITAI COAL CO., LTD.
6	CHINA SHENHUA ENERGY CO
7	YANZHOU COAL MINING COMPANY LIMITED
8	ARCH COAL
9	ALPHA NATURAL RESOURCES
10	BANPU PUBLIC COMPANY LIMITED

Top 4 Companies Tied

# FINDINGS: COAL-PROCESSING TECHNOLOGY COMPANIES

LRH-P1: 'Plant Age'	
1	SASOL
2	DAKOTA GASIFICATION CO
3	HARBIN YILAN COAL GASIFICATION
4	YANKUANG GROUP
5	TIANJIN BOHAI CHEMICAL GROUP
6	SANWEI RESOURCE GROUP
7	JIEHUA CHEMICAL
8	HUALU HENGSHENG CHEMICALS
9	SINOPEC
10	DATANG

LRH-P2: 'Water Stress'	
1	KOREA SOUTH EAST POWER CO (KOSEP)
2	YANTAI WANHUA
3	XINJIANG XINLIANXIN FERTILIZER CO. LTD.
4	TIANJIN BOHAI CHEMICAL GROUP
5	QINGHUA GROUP
6	HUALU HENGSHENG CHEMICALS
7	GUANGHUI ENERGY CO
8	SHENHUA GROUP
9	SANWEI RESOURCE GROUP
10	YITAI COAL OIL MANUFACTURING CO (INNER MONGOLIA YITAI GROUP)

LRH-P3: 'CCS Retrofitability'	
Top 16 Companies Tied	



# WHAT VOLUNTARY DISCLOSURE CAN AND CAN'T DO

We need to recognise voluntary disclosure's theory of change, its strengths, and its weaknesses

## CAN

### CHANGE BEHAVIOUR OVER TIME

- Companies that disclose may do more to manage their environmental performance
- Voluntary disclosure frameworks take companies on this 'journey'
- Strategy entails asking more and more questions as part of each reporting cycle

### PROVIDE SOME USEFUL INFORMATION

- Information useful in providing insight into quality of reporting and therefore how seriously a company takes an issue
- Provides insight into how these issues might fit into corporate strategy
- Provides a way to hold companies to account if they mislead or misrepresent on a disclosure

## CAN'T

### PROVIDE VERY MUCH IN THE WAY OF DATA FOR FUNDAMENTAL INVESTMENT ANALYSIS

- Far from universal coverage
- Cumbersome annually reporting cycles
- Data already of out of date
- Asks questions disconnected from fundamentals
- Data quality is poor and significant investments attempt to assure it
- Slow moving
- Becomes a smoke screen for companies not doing very much at all

# NEW LIFE AND PURPOSE FOR VOLUNTARY DISCLOSURE

## Towards a Principle of Asset-level Disclosure

### ASK FOR ASSET-LEVEL DATA

- Disclosure frameworks can ask for data that is actually useful!
- Asset-level data useful to all groups: a) asset managers evaluating the environmental performance of companies; b) asset owners evaluating the environmental performance of funds run by asset managers; c) regulators monitoring the stability of the financial system and build up of systemic risk; and d) policymakers concerned with ensuring that capital is flowing at sufficient scale and pace to deliver the transition to a more sustainable global economy.
- Better data on specific assets within company portfolios would allow for researchers and analysts to undertake their own research on the risks and opportunities facing company portfolios.

### WHAT ARE THE KEY ASSET-LEVEL DATA POINTS IN DIFFERENT SECTORS?

- The data points disclosed would depend on the sector in question and would need to take account of commercial confidentiality.
- Data fields would be decided sector by sector in consultation with companies. Should include:
  - Locational data to enable spatial analysis
  - Clarifying ownership
  - Technology employed
  - Production data
- Does not need to include breakeven points or equivalent
- Introducing a new 'Principle of Asset-level Disclosure' into reporting frameworks would give new life and purpose to existing disclosure frameworks

# WE LIVE IN A WORLD THAT WILL NEVER HAVE PERFECT DISCLOSURE

‘Company Data Intelligence Service’ (CDIS) needed to bring together asset-specific information so advanced analysis can be undertaken

## USE EXISTING ASSET-LEVEL DATA

- Existing datasets have much of the information required, but held in disparate locations
  - local or national registries and public records
  - existing proprietary and non-proprietary databases
  - company reporting to financial markets and to regulators
  - buried in universities and other research institutes
- Challenge is finding this data and then integrating it, matching, and assuring it
- Can get much more out of existing data
  - apply new analytical methods including machine learning and AI
  - quantitative analysis of qualitative reporting
- Massive benefits of having this basic asset-level data provided in consistent formats by trusted public goods initiative
- Costs of this much smaller than current voluntary disclosure frameworks

## AUGMENT WITH NEW DATA

- Remote sensing - satellites, drones, other sensors
- Big data and other novel data sets
- Where estimation needs to happen, should happen using transparent and robust methodologies
- ‘Stick’ to disclosure’s ‘carrot’ – forcing companies to correct and disclose additional information
- Significant benefits of having one global initiative for coordinating the aggregation of basic asset-level data across sectors
- Enables consultants, data companies, and others to concentrate on more advanced analysis – not an arms race over the basics
- Prevents multiple proprietary datasets competing in different sectors slowing uptake
- Benefits of competition can be captured by public goods initiative





## CONCLUSION

- **THERE ARE MULTIPLE ENVIRONMENTAL RISKS AND OPPORTUNITIES TRANSFORMING SECTORS AND INDUSTRIES GLOBALLY**
- **THESE CAN BE IDENTIFIED AND ASSETS MEASURED FOR EXPOSURE MUCH MORE EFFECTIVELY THAN EVER BEFORE. KEY FOR CAPITAL TO FLOW AWAY FROM 'BROWN' AND TOWARDS 'GREEN'**
- **WE NEED BASIC AND CONSISTENT ASSET-LEVEL INFORMATION ACROSS SECTORS TO DO THIS**
- **WE ALSO NEED TO DEVELOP ROBUST, FORWARD LOOKING MEASURES OF ENVIRONMENTAL RISK AND OPPORTUNITY**
- **VOLUNTARY DISCLOSURE HAS A ROLE, BUT WE MUST ACKNOWLEDGE ITS STRENGTHS AND WEAKNESSES**
- **WE LIVE IN A WORLD THAT WILL NEVER HAVE PERFECT DISCLOSURE**
- **THEREFORE TO GET ALL THE DATA WE NEED WILL REQUIRE US TO TRANSCEND REPORTING. TIME IS SHORT**
- **THE 'COMPANY DATA INTELLIGENCE SERVICE', RUN AS AN INTERNATIONAL COLLABORATION, COULD ACT AS THE FOCAL POINT OF THIS EFFORT AND BE GOVERNED AS A PUBLIC GOODS INITIATIVE**
- **THE UNIVERSITY OF OXFORD WANTS TO COLLABORATE WITH ORGANISATIONS TO MAKE THIS HAPPEN**